ISSN 1831-9424



TECHNICAL REPORT

# Artificial intelligence for healthcare and well-being during exceptional times

A recent landscape from a European perspective

Gómez-González, E. Gómez, E.

2023



This publication is a Technical report by the Joint Research Centre (JRC), the European Commission's science and knowledge service. It aims to provide evidence-based scientific support to the European policymaking process. The contents of this publication do not necessarily reflect the position or opinion of the European Commission. Neither the European Commission nor any person acting on behalf of the Commission is responsible for the use that might be made of this publication. For information on the methodology and quality underlying the data used in this publication for which the source is neither Eurostat nor other Commission services, users should contact the referenced source. The designations employed and the presentation of material on the maps do not imply the expression of any opinion whatsoever on the part of the European Union concerning the legal status of any country, territory, city or area or of its authorities, or concerning the delimitation of its frontiers or boundaries.

#### **Contact information**

Name: Emilia Gómez Email: <u>emilia.gomez-gutierrez@ec.europa.eu</u>

EU Science Hub

https://joint-research-centre.ec.europa.eu

JRC134715

EUR 31669 EN

PDF ISBN 978-92-68-07764-1 ISSN 1831-9424 doi: 10.2760/404140

KJ-NA-31-669-EN-N

Luxembourg: Publications Office of the European Union, 2023

© European Union, 2023



The reuse policy of the European Commission documents is implemented by the Commission Decision 2011/833/EU of 12 December 2011 on the reuse of Commission documents (OJ L 330, 14.12.2011, p. 39). Unless otherwise noted, the reuse of this document is authorised under the Creative Commons Attribution 4.0 International (CC BY 4.0) licence (<u>https://creativecommons.org/licenses/by/4.0/</u>). This means that reuse is allowed provided appropriate credit is given and any changes are indicated.

For any use or reproduction of photos or other material that is not owned by the European Union, permission must be sought directly from the copyright holders. The European Union does not own the copyright in relation to the following elements: - Figure, 2 source: Wikipedia Commons

How to cite this report: Gómez-González, E. and Gómez, E. Artificial intelligence for healthcare and well-being during exceptional times: a recent landscape from a European perspective, Publications Office of the European Union, Luxembourg, 2023, doi: <u>10.2760/404140</u>, JRC134715.

# Contents

Ab	strac	:t		1
Ac	know	/ledgen	nents	2
1	Introduction			
	1.1	Motiv	ation and goals	3
	1.2	Limita	ations and disclaimer	3
	1.3	Histor	ical circumstances and significant events	4
	1.4	Policy	context	4
2	Sele	ected ap	pproach	5
	2.1	Metho	odology	5
	2.2	Socia	assessment	5
		2.2.1	Maturity (Technology Readiness Level, TRL)	5
		2.2.2	Availability (Technology Availability Level, TAL)	6
		2.2.3	Controversy (Technology Controversy Level, TCL)	6
		2.2.4	Sustainability (Technology Sustainability Level, TSL)	9
		2.2.5	Extent of adoption (Technology Extent Level, TEL)	9
		2.2.6	Integrated assessment	
	2.3	Ethica	ll considerations	
3	AI la	andscap	)e	
	3.1	Releva	ant topics	
	3.2	Techn	ological and ethical considerations	
	3.3	Lesso	ns of the COVID-19 pandemic	
	3.4	Early	lessons from the war in Ukraine	20
	3.5	Other	areas of development	21
	3.6	Signif	icant institutional apprises	
4	Soc	ially-re	evant Use-Cases	24
	4.1	Al too	ls for mental health	24
	4.2	Al-me	diated gene editing	
	4.3	Al too	ls for epidemiology and health data monitoring	
	4.4	Al-me	diated neuro-technologies (for cognitive signals)	
	4.5	Al-me	diated inclusion of neurodiversity	
5	Con	clusion	5	
	5.1	Discu	ssion	
	5.2	Sumn	nary of contributions	
Re	ferer	1ces		
Lis	t of	acronyr	ns and abbreviations	62
Lis	t of	definiti	ons	64
Lis	t of	figures		69
Lis	t of	tables		

Annexes	71
Annex 1. The Big Data of the Human Body and Life	71

# Abstract

This report provides a detailed state of the art of the current and near-future applications of Artificial Intelligence (AI) in medicine, healthcare and wellbeing, particularly focused on their impact on people's physical and mental health, and in societal and environmental welfare, including future generations. It builds on previous analyses, is framed in recent historical circumstances of the COVID-19 pandemic and the war in Ukraine, and accounts for recent strategic policy priorities in related areas.

Aimed for a science for policy audience, and adopting a European perspective, the described outcomes are of interest for researchers studying the ethical and social impact of AI in medicine, healthcare, and wellbeing, for scientific and technological stakeholders, and for the general public.

The present analysis of the state of the art includes software, personal monitoring devices, genetic tests and editing tools, personalized digital models, online platforms, augmented reality devices, and surgical and companion robotics. It identifies the particularities of AI systems and applications, the opportunities and risks associated to them, as well as their availability level. This study proposes a methodology for the assessment of the social impact of these technologies, considering their maturity, availability, controversy, and sustainability, together with an integrated overview.

From this review, the report identifies 100 relevant topics in the field, supported with references, and analyses lessons learnt in the area from the mentioned historical circumstances and significant institutional appraisals. In addition, the present study recognizes five key expanding areas with particular significance in terms of social impact: AI tools for mental health, AI-mediated gene edition, AI tools for epidemiology and health data monitoring, AI-mediated neuro-technologies and AI-mediated inclusion of neurodiversity, and describes them in detail considering the proposed social assessment scales. This report also identifies novel AI-mediated challenges and risks related to the protection against biological threats, and links them to the concept of One Health (human, animal and environmental) and to the updated policy initiatives by the European Union, the United Nations, and the World Health Organization. Finally, the report outlines a series of controversial issues, namely gene edition for human augmentation and neuro-technologies for decoding of and interacting with cognitive signals.

From our analysis, we provide some science for policy challenges, aimed to translate the scientific and technical narrative into practical approaches for the benefit of the persons and society and towards an effective European-centric perspective in the field.

## Acknowledgements

The authors express their gratitude to Dr. Javier Márquez-Rivas from University Hospital 'Virgen del Rocío' (Seville, Spain), Dr. Alejandro Barriga-Rivera from Department of Applied Physics III of the ETSI Engineering School of the University of Seville, BE. Isabel Fernandez-Lizaranzu from the Institute of Biomedicine of Seville, Spain, Dr. Carmen Gómez from UHVR, Dr. María Isabel Relimpio-López from University Hospital 'Virgen Macarena' (Seville, Spain) and RETICS Oftared Instituto de Salud Carlos III (Madrid, Spain) for insightful discussions and support.

The authors are also grateful to colleagues from the Joint Research Centre and anonymous reviewers for their useful comments and suggestions.

This report is

## Authors

Gómez-González, Emilio

Gómez, Emilia

# 1 Introduction

# **1.1** Motivation and goals

Artificial Intelligence (AI) has become a major driving force in science and technology, with a profound overall impact in all aspects of society, and it has become an area of strategic importance and a key driver of economic development in the European Union (EU).

This reports is framed in the context of the HUMAINT (Human Behaviour and Machine Intelligence) project at the European Commission's Joint Research Centre. HUMAINT researchers on the societal impact of AI technologies (opportunities and risks) and develops methodologies for Trustworthy AI. The project also provides technical and scientific support to EU AI policies, mainly the AI Act and the Digital Services Act.

This report focuses on the impact of AI on the area of medicine and healthcare, building upon previous studies published in [5] [6] [7] [8] [9] This report presents the following contents:

- i) An overview and classification of the current and near-future applications of AI in Medicine, Healthcare and Wellbeing according to their ethical and societal impact and the availability level of the various technological implementations. This analysis builds upon [5] and includes 480 new references -structured in 100 topics- mostly dated in 2021 and 2022.
- Based on the previous overview, we select a small set of use cases which are relevant in terms of societal opportunities vs risks. They belong to the domains of "Neuro-technologies" and "Epidemiology" (in a broad sense, also including Gene Editing), and they are identified as four usecases, corresponding to main fields (key expanding areas):
  - AI tools for mental health,
  - AI-mediated gene editing,
  - AI tools for epidemiology and health data monitoring,
  - AI-mediated neurotechnologies (for cognitive signals), and
  - AI-mediated inclusion of neurodiversity.

Additional fields of technical advances with significant social impact comprise AI-mediated drug discovery and personalized medicine. These use cases are analyzed from the perspectives of their features and impact on physical and mental health and wellbeing of persons, society, and the environment, including future generations.

iii) A set of insights in terms of conclusions, challenges and recommendations to be addressed in the next future.

It is important to note that this report covers a period (from June 2020 to September 2022) with two unexpected historical circumstances, the COVID-19 pandemic and the war in Ukraine. In addition, the first case of an autonomous machine killing humans was documented in 2021, and news on the creation of the first 'living machine' or 'xenobot' were published in 2020. Notably, in 2022 the European Union and the United Nations have updated their strategic priorities in several related areas, particularly related to health. All these events have had a significant impact on the topics of this report. They have been thoroughly addressed accordingly and have contributed to the selection of the relevant use cases in terms of societal impact.

# **1.2** Limitations and disclaimer

This report covers the period from June 2020 to September 2022. It is based on a careful research and analysis of references available from public sources, following the common practice and standards of scientific methodology as detailed in Section 2.1. However, the expressions and views contained in this document –particularly its conclusions– are those of the authors and do not necessarily represent those of his institutions of affiliation. The examples and references to real systems and commercial devices and programs, online platforms and other available products have been selected because of their interest or relevance in relationship to the corresponding topic under analysis. Their selection in this report does not reflect any endorsement or evaluation (positive or negative) on their commercial interest.

# **1.3** Historical circumstances and significant events

In the period covered by the current report, June 2020 to September 2022, two extraordinary, historical circumstances are developing with significant impact in all aspects of life and society, in the EU and worldwide. This report analyses how AI technologies have been exploited in these two very different historical scenarios.

On the one hand, the peak and decay of the COVID-19 pandemic since its spread from China at the beginning of 2020. In Europe, by middle July 2022 [17], there had been over 207.6 million cases and over 2.3 million deaths.

On the other hand, the Russian invasion of Ukraine, began in February of 2022 and still under development. This is the largest war in European territory since the Second World War. By the finalisation of this research, it is in a volatile and unpredictable status, causing severe destruction in the country, numerous deaths of civilians and strong migrations and displacements of population. By September 2022, there were over 7 million refugees in EU countries, and over 7 million persons who fled their homes inside Ukraine [18].

In addition, the European Union and the United Nations have updated their strategic priorities in different areas related to the subject topics of this research. Other relevant events include:

- Possible first documented case of autonomous weapon killing humans (2021) In 2021, a report by the United Nations [19] about the Libyan civil war reported what it may be the first documented use of autonomous weapons to kill humans. Several nations are investing heavily in such weapons [20], and this issue was already described in [5].
- First publication on 'living machines' (2020) The first case of 'xenobots' built using frog stem cells was published in 2020 [21], also described in [5]. Further research in 'self-reconfigurable' (potential) 'life-forms' is advancing [22] [23] [24].
- Medical errors. An obvious filed of interest of AI systems refers to helping humans in performing complex tasks in demanding environments, particularly as related to reducing medical errors. Data from the USA /updated to 2016) indicate that about 251.000 deaths/year results from medical errors, being the third leading cause of death [25]. By comparison, in that country there were about 39.000 deaths/year due to car accidents (in 2020) [26].

# 1.4 Policy context

This report has been developed in the context of a series of EU and international strategic policy priorities related to the protection of persons and of the societies under recent geopolitical challenges. These priorities have been highlighted in the following three declarations of the maximum authorities of the European Union and of the United Nations. We mention here the main aspects related to the present report.

- The declarations (September 8, 2021) of the President and Vice-President of the European Commission about the future of the EU's Open Strategic Autonomy with regards to the presentation of the second annual Strategic Foresight Report by JRC. They both reflected on current challenges on climate change and digital transformation, potential impact on European values, and the need for an early, comprehensive understanding of emerging trends for tackling such important issues.
- 2) The declaration (October 10, 2021) of the President of the European Commission, at the World Health Summit [27], which mentions potential risks such as Bioterrorism or the unintentional release of pathogens and the need for preparedness. In this speech, President Von der Leyen announced the creation of a new Health Emergency preparedness and Response Authority (HERA) [28], and outlined several relevant aspects related to its tasks ad challenges, such as the preparation for health emergencies and their promptly detection and collective response, the assessment of health threads including with innovative methods, the sharing of data, or the assessment of new and emerging biological threats. The speech also mentioned the need to join forces with international counterparts to setup a global standard for health preparedness.
- 3) Finally, we identify as relevant to this report the declaration (August 5, 2021) of the Secretary General of the United Nations at his Report on the General Agenda [29]. This declaration mentioned the COVID-19 pandemic, and long-term challenges related to managing new technologies such as AI and gene editing (point 41) and artificial intelligence regulation (point 93).

# 2 Selected approach

# 2.1 Methodology

This reports build upon the methodology proposed in [5]. We build the landscape of applications of AI in medicine and healthcare, with a focus on its ethical and social impact, through systematic searches in standard scientific, academic, institutional, medical, corporate, and technical online platforms. In addition, our review incorporates examples (of social impact and growing concerns and debates) published in general press, social media, and other web-based sources. The majority of references are dated from the publication of a previous report [5] (June of 2020) to September 2022, in order to represent recent developments. Some other works considered of relevance are also included. Scientific references have been compiled using Mendeley Reference Manager® and Vancouver Citation Style Language (CSL). Press references mainly come from media included in the Top European Newspapers in English – TheBigProject [16]. Full (standard) citations correspond to the numbers in square brackets.

Once identified, references are first grouped by the two authors into topics, as presented in Section 3.1. The different topics are then assessed in terms of technological and ethical considerations with respect to those identified in previous report and summarized in Section 2.3, outlining most significant events and recent development in Sections 3.2 to 3.6. It is worthy to note that given the timeline of this report (June 2020 to September 2020) with respect to the two historical circumstances mainly considered (COVID-19 pandemic beginning of 2020 and Ukrainian war February 202), our analysis provides a more developed analysis on the link between AI and the first circumstance than on the second one.

From the identified topics and outlined recent developments, the authors then select five use cases which are described following a set of social assessment scales grounded in previous studies and presented in Section 2.2. The identification of topics, use cases and qualitative analysis is finally reviewed by a group of give experts including medical doctors and engineering researchers, listed in the acknowledgement section of the present report.

# 2.2 Social assessment

With the goal of assisting the development of quantitative and qualitative indicators for the social assessment of AI technologies, we propose a set of scales to provide, on the one hand, independent descriptive measures of the maturity, availability, controversy, sustainability and the extent of adoption of the technology under analysis, and, on the other hand, an integrated evaluation with a pictorial overview. Some of these metrics, such as concepts of 'controversy' and the 'overall social impact', are difficult to 'standardize' and 'categorize' -and may be subject to further updates-, as they relate to both the social, personal, and ethical realms.

## 2.2.1 Maturity (Technology Readiness Level, TRL)

The maturity of a technology can be evaluated using the 'Technology Readiness Level' (TRL) scale, originally defined by the NASA [30] and adopted in the European R&D&I environment [31]. It provides a qualitative description in a numerical scale in 9 steps (levels), which range from 1 (basic principles observed) to 9 (actual system proven in operational environment).

The values defined for the TRL scale are the following:

- TRL 1 Basic principles observed.
- TRL 2 Technology concept formulated.
- TRL 3 Experimental proof of concept.
- TRL 4 Technology validated in lab.
- TRL 5 Technology validated in relevant environment (industrially relevant environment in the case of key enabling technologies).
- TRL 6 Technology demonstrated in relevant environment (industrially relevant environment in the case of key enabling technologies).
- TRL 7 System prototype demonstration in operational environment.

- TRL 8 System complete and qualified.
- TRL 9 Actual system proven in operational environment (competitive manufacturing in the case of key enabling technologies; or in space).

## 2.2.2 Availability (Technology Availability Level, TAL)

The availability of a technology can be evaluated using the 'Technology Availability Level' (TAL) scale which provides a qualitative description of the degree of availability of a technology in a numerical scale in 10 steps (levels), which range from 0 (unknown status, not considered feasible) to 9 (available for the general public).

The values defined for the TAL scale are the following:

- TAL 0. Unknown status. Not considered feasible according to references.
- TAL 1. Unknown status. Considered feasible according to related, indirect references.
- TAL 2. General/basic idea publicly proposed.
- TAL 3. Calls for public funding of research and development (R&D) open.
- TAL 4. Results of academic/partial projects disclosed.
- TAL 5. Early design of product disclosed.
- TAL 6. Operational prototype/'first case' disclosed.
- TAL 7. Products disclosed but not available.
- TAL 8. Available products for restricted (e.g. professional) users.
- TAL 9. Available for the public.

## 2.2.3 Controversy (Technology Controversy Level, TCL)

In order to analyze the different AI applications and their current status, in this Report it is proposed a novel scale named 'Technology Controversy Level' (TCL) to give a qualitative description of its 'degree of controversy'. It is recognized that this concept is very difficult to 'standardize', as it relates to societal and personal ethical thresholds, beliefs, and constructs, and that this scale may be subject to further updates.

As a reference benchmark, the proposed TCL scale is referred to the Human Rights as declared by the United Nations in 1948 [32]. The technology under analysis is therefore classified as 'controversial' if it contributes 'against' to (at least one of) the fundamental Human Rights (HR), and 'non-controversial' if it aims 'for the benefit of groups of vulnerable persons' or 'of mankind'. This qualitative and quantitative comparison is inspired on the Human Rights Indicators defined by the United Nations in 2012 [33], and the concept of 'vulnerable groups' is based on the definition by the same organization [34].

The corresponding value (level of controversy) of a given technology is defined in a numerical scale in 9 steps, with four 'positive' (i.e., controversial) and four 'negative' (i.e., non-controversial) levels from a 'zero value' or neutral reference (corresponding to 'not applicable'). They are also mapped to qualitative descriptions and to a color map following the visible spectrum, from dark blue ('definitely not controversial') to dark red ('highly controversial'). Color shades and their corresponding numerical coding in the common red-green-blue (RGB) system are detailed in Table 1. Note that a technology with a high positive TCL value (e.g., a system used for terrorism, with TCL = +4) is then considered a 'highly controversial' and 'negative technology'.

The values defined for the TCL scale and their corresponding qualitative and color levels are defined in the following Table.

**Table 1**. Definition, steps, numerical values, and description of the proposed Technology Controversy Level (TCL) scale. Color shades may be modified (within their overall tone) according to printing or visualization devices to assure correct identification. RGB color codes are given in 8-bit description (from 0 to 255).

TCL		Qualitative description		Color	
Value	Definition (The technology is)	Level of Controversy	Value	Level of Controversy	RGB coding
-4	Definitely, for the benefit of mankind	Absolutely not controversial	'Highly positive'	Dark blue	[0, 32, 96]
-3	Beneficial for extended vulnerable groups	Strongly not controversial	'Very positive'	Blue	[0, 112, 192]
-2	Clearly beneficial for some vulnerable groups	Clearly not controversial	'Positive'	Light blue	[0, 176, 240]
-1	Possibly beneficial for one or more vulnerable groups	Plausibly not controversial	'Likely positive'	Green	[0, 176, 80]
0	Not affecting/related to Human Rights	Not applicable	Neutral	Yellow	[255, 255, 0]
+1	Possibly, against one or more Human Rights	Conceivably controversial	'Likely negative'	Amber	[255, 192, 0]
+2	Likely, against one or more Human Rights	Clearly controversial	'Negative'	Scarlet	[255, 51, 0]
+3	Very likely, against one or more Human Rights	Strongly controversial	'Very negative'	Red	[255, 0, 0]
+4	Clearly, against one or more Human Rights	Absolutely controversial	'Highly negative'	Dark red	[192, 0, 0]

Source: Own elaboration.

**Figure 1**. Classification of AI and AI-mediated technologies in Medicine and Healthcare according to their ethical and social impact. SW: software, AR: augmented reality, VR: virtual reality, IoT: internet of things. TAL: Technology Availability Level.

SW for decision support in (most) clinical areas.		Impact
	8, 9	Positiv
SW for improved workflow, efficiency.	8, 9	
Tools for information visualization and navigation.	6, 7, 9	
Image-guided surgery. Teleoperation.	4, 6, 9	
SW for automated, extensive analysis.	4-9	
Tailored treatments. Prediction of response.	4-9	
'In-silico' modeling and testing. The 'digital twin'.	4-8	
Drug design.	4, 8	
The 'digital doctor' (assistance for professionals and for patients).	8, 9	
For hospitalized persons, children & the elderly.	4-9	
Epidemiology, prevention and monitoring of disease outbreaks.	2-9	
Fraud detection. Quality control, monitoring of physicians and treatments.	4-9	
Automated clinical/health surveillance in any environment/institution.	7, 8	
Monitoring, automated drug delivery.	7-9	
Disease treatment, prevention.	7, 8	
Prevention of episodes with clinical relevance (e.g. suicide attempts).	6, 8 <b>C</b> C	ontro <mark>vers</mark> i
Tailored marketing (e.g. related to female cycles).	6, 8	
Treatment of diseases. Restoring damaged functions.	3-8	
Brain-machine inferfaces.	5-8	
Control of prostheses, exoskeletons. 'Cyborgs'.	2-7	
Neurostimulation. Neuromodulation.	4-8	
Neuroprostheses (for the central nervous system).	2-5	
	1-3	
Disease tests. Direct-to-consumer tests.	4-9	
Individual profiling. Personalized molecules (for treatment) at 'impossible' prices.	3-8	
'Engineered' humans.	2, 6	
Gene-enhanced 'superhumans'.	2	
Self-experimentation medicine. Biohacking.	2,6	
The 'digital doctor'.	2-5	
'Robotic surgeon'.	2,4	
Organs for transplants.	2.4.5	
	1010002000	
	02070,2003	
	1, 2	Negative
	Image-guided surgery. Teleoperation. SW for automated, extensive analysis. Tailored treatments. Prediction of response. 'In-silico' modeling and testing. The 'digital twin'. Drug design. The 'digital doctor' (assistance for professionals and for patients). For hospitalized persons, children & the elderly. Epidemiology, prevention and monitoring of disease outbreaks. Fraud detection. Quality control, monitoring of physicians and treatments. Automated clinical/health surveillance in any environment/institution. Monitoring, automated drug delivery. Disease treatment, prevention. Prevention of episodes with clinical relevance (e.g. suicide attempts). Tailored marketing (e.g. related to female cycles). Treatment of diseases. Restoring damaged functions. Brain-machine inferfaces. Control of prostheses, exoskeletons. 'Cyborgs'. Neurostimulation. Neuromodulation. Neuroprostheses (for the central nervous system). Mind 'reading' and 'manipulation'. Disease tests. Direct-to-consumer tests. Individual profiling. Personalized molecules (for treatment) at 'impossible' prices. 'Engineered' humans. Gene-enhanced 'superhumans'. Self-experimentation medicine. Biohacking. The 'digital doctor'.	Image-guided surgery. Teleoperation.4, 6, 9SW for automated, extensive analysis.4-9Tailored treatments. Prediction of response.4-9'In-silico' modeling and testing. The 'digital twin'.4-8Drug design.4, 8The 'digital doctor' (assistance for professionals and for patients).8, 9For hospitalized persons, children & the elderly.4-9Epidemiology, prevention and monitoring of disease outbreaks.2-9Fraud detection. Quality control, monitoring of physicians and treatments.4-9Automated clinical/health surveillance in any environment/institution.7, 8Monitoring, automated drug delivery.7-9Disease treatment, prevention.7, 8Prevention of episodes with clinical relevance (e.g. suicide attempts).6, 8Tailored marketing (e.g. related to female cycles).6, 8Treatment of diseases. Restoring damaged functions.3-8Brain-machine inferfaces.5-8Control of prostheses, exoskeletons. 'Cyborgs'.2-7Neuroprostheses (for the central nervous system).2-5Mind 'reading' and 'manipulation'.1-3Disease tests. Direct-to-consume tests.3-8'fengineered' humans.2, 6Gene-enhanced 'superhumans'.2, 6Gene-enhanced 'superhumans'.2, 4'fobotic surgeon'.2, 4Whole-brain emulation /'transplant'.1, 2'fuving machines' ('biological robots', 'biobots')4, 6Whole-brain emulation /'transplant'.2, 3'fuving machines' ('biologic

Source: reproduced from [5].

## 2.2.4 Sustainability (Technology Sustainability Level, TSL)

In order to analyze the different AI applications and their current status, in this Report a novel scale is proposed named 'Technology Sustainability Level' (TSL) to give a qualitative description its 'degree of controversy'.

As a reference benchmark, the proposed TSL scale is referred to the 17 Sustainable Development Goals (SDGs) adopted by the United Nations in 2015 [35] "as a universal call to action to end poverty, protect the planet, and ensure that by 2030 all people enjoy peace and prosperity".

The SDGs are the following:

- GOAL 1: No Poverty
- GOAL 2: Zero Hunger
- GOAL 3: Good Health and Well-being
- GOAL 4: Quality Education
- GOAL 5: Gender Equality
- GOAL 6: Clean Water and Sanitation
- GOAL 7: Affordable and Clean Energy
- GOAL 8: Decent Work and Economic Growth
- GOAL 9: Industry, Innovation and Infrastructure
- GOAL 10: Reduced Inequality
- GOAL 11: Sustainable Cities and Communities
- GOAL 12: Responsible Consumption and Production
- GOAL 13: Climate Action
- GOAL 14: Life Below Water
- GOAL 15: Life on Land
- GOAL 16: Peace and Justice Strong Institutions
- GOAL 17: Partnerships to achieve the Goal

We define the overall TSL value of a given technology as follows:

- For each one of the SGDs, a value (Goal Level, GL) is defined in a numerical scale in 3 steps:
- 'positive' (GL = + 1), i.e., the technology 'favors' that Goal,
- 'negative' (GL = 1), i.e., the technology 'is against' that Goal,
- -- 'zero value' reference (GL = -0), corresponding to 'not applicable'.
- The absolute TSL value is constructed as the sum of the 17 GL values corresponding to each one of the 17 SDGs.
- The total TSL value is obtained by normalizing the absolute TSL value. It therefore ranges from TSL = -1 (minimum) to TSL = +1 (maximum).

Each Goal can also be used to score any given technology in that field. For example, AI technologies in this Report are evaluated according to their prospective contribution to the 'GOAL 3: Good Health and Well-being'.

## 2.2.5 Extent of adoption (Technology Extent Level, TEL)

In order to evaluate the extent of adoption of a technology, in this Report it is proposed a novel scale<sup>3</sup> named 'Technology Extent Level' (TEL) to give a qualitative description its 'degree of adoption'. This is a qualitative metric of the 'market penetration' deemed necessary for a complete assessment of the social impact.

The corresponding value (level of adoption) is defined in a numerical scale in 10 steps (levels), which range from 0 (no users) to 9 (massive adoption).

The values defined for the TEL scale are the following:

- TEL 9 Massive adoption
- TEL 8 Common use (no publicity required)
- TEL 7 Customers/users through word-of-mouth
- TEL 6 Customers/users through general publicity, marketing
- TEL 5 Customers/users though targeted advertising
- TEL 4 Customers/users with explicit, definite support (e.g funding, discounts)
- TEL 3 Early adopters (innovators)
- TEL 2 Beta testers
- TEL 1 In-house use (inventors)
- TEL 0 No users

## 2.2.6 Integrated assessment

The social impact of a technology could be assessed by considering the four aspects described in the previous sections, namely its maturity, availability, controversy, sustainability and extent of adoption, and the corresponding scales, summarized in the following Table. Some graphical schemes as presented in Figure 2 can be developed by combining several of those metrics to generate a 'pictorial overview' to facilitate an overall evaluation.

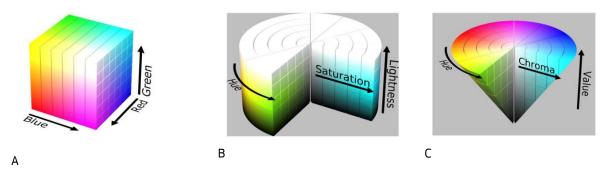
<b>Table 2</b> . Summary of features for the proposed evaluation of the social impact of a technology. SDG = Sustainable
Development Goal (of the UN).

Feature	Scale				
	Name	Type/Steps	Min/Max		
Maturity	Technology Readiness Level (TRL)	Discrete / 10	0/9		
Availability	Technology Availability Level (TAL)	Discrete / 10	0/9		
Controversy	Technology Controversy Level (TCL)	Discrete / 9	-4/+4		
Sustainability	Technology Sustainability Level (TSL) for SDG 3	Discrete / 3	1		
	Technology Sustainability Level (TSL) for all SDGs	Discrete / 3	0.18		
	Technology Sustainability Level (TSL) for the technology	Continuous	-1/+1		
Extent of Adoption	Technology Extent Level (TEL)	10	0/9		

#### Source: Own elaboration.

Nevertheless, as indicated, the concepts of 'social impact' and of 'controversy' are difficult to 'standardize' and 'categorize' these analyses may be subject to further updates. The four defined scales may be combined into 3D visualization schemes with different color-coding maps to provide an easy-to-interpret pictorial overview. These figures may be developed from existing colormaps employed in optics, as shown in Figure 2.

Figure 2. 3D color-coding maps suitable for representation of technology evaluation scales. A shows the common RGB color space in cube geometry. B depicts the hue-saturation-lightness (HIS) color space in cylindrical symmetry. C shows the hue-chroma-value (HCV) color space in conical geometry.



Source: Wikipedia Commons.

# 2.3 Ethical considerations

The ethical aspects to be considered for the analysis of AI and AI-mediated applications in Medicine, Healthcare and Wellbeing are fully described in [5], and summarized here. Ethical aspects to consider can be grouped in three partially overlapping sets.

The First Group (G1) includes topics currently under analysis, as raised by other areas of prior development of AI applications (e.g., social networks, online commerce, automation in factories, autonomous vehicles), such as:

- Data privacy, integrity and anonymity, legal responsibility and accountability, and other general aspects
  of the relationship of humans with (at least partially autonomous) machines [see also Second Group G2].
- The effects on medical professionals and on their relationships to both patients and employers, quality control and monitoring of workers. These effects include the need for professional updates, training and qualification, and on employment (lost and new jobs, deep changes in some specialties, the risk that some of them may even disappear).
- Security and reliability [see also Second Group G2].
- Metrics of performance, improved health outcomes and clinical pathways, reduction of medical errors, personalized medicine, and psychosocial outcomes. It is important to note that current AI systems may be good –even outperforming humans– at 'narrow', specific tasks while (still) failing in global, overview analysis.
- The existence of a 'human-in-the-loop' with or without the ability to override the system, and the questions that arise if there is no time/possibility for human intervention in a critical –even life or death-situation.

The Second Group (G2) includes topics –some of which may also be under analysis in other areas– of particular relevance for Medicine and Healthcare, such as:

- Explainability and interpretability of the systems. These concepts refer to being able to explain the 'reasoning process' of AI systems to a human operator. Although it may be required, the evolution of AI technology leads to systems too complex to be understood by a human. Since they may also provide support to humans (at least, in certain tasks), there is a need to consider if we could accept the results given by AI systems without being able to understand how they ('the machines') came to them.
- Trust and reliability. We need to evaluate when 'a machine' performs better than a human, what to do when they give conflicting opinions.
- Data quality. The generation of suitable databases and repositories of medical data and information for learning and development of AI systems is a major consideration in this area, which should be considered inline with privacy concerns.

- Data security. The social impact of malicious data alterations can be particularly severe since certain health issues (e.g. toxic consumption history, genetic disposition to diseases) may be manipulated to blackmail or discredit individuals and groups, for instance in processes related to employment and profiling.
- Additionally, increased security risks appear when 'physical devices' are involved, such as companion robots assisting persons with disabilities or the elderly, or surgical robots.
- Bias and fairness: in the medical field, it is important to ensure the lack of biases for different (e.g. ethnic, gender, age) groups in diagnosis, prognosis and treatments, the use of proper, representative data for training and the analysis of validity for different populations not involved in the training.
- The social impact of 'erroneous data for learning' can be very high in this context. System may not give any warning, but processing results may be incorrect.
- Empathy, including shared decisions and ('the machines') helping humans to make difficult decisions.
- Citizen (taxpayer) opinion and involvement in a 'patient-centric' model. Questions include the commongood in public-funded research, informed consent, citizen science, the 'reduced asymmetry' in information between the patient and the doctor, and citizen-generated (genetic, ...) tests without a doctor prescribing them and analyzing their results.
- Test, benchmarking. There is a clear need for updated testing and evaluation procedures in this field, as key issue in which relevant changes are required in a given AI system.
- Regulation, and the legal aspects related to liability and malfunction. Regulatory frameworks are still developed incorporating liability aspects, to ensure accountability.
- Affordability and socio-economic impact. Global figures and market of AI in Medicine and Healthcare forecast very relevant, positive impact for the coming years. However, the economic analysis must include the social points related to health systems, the industries and the patients, as such technologies also risk evolving into a significant factor of inequality.
- Information for the public and professionals about the real efficacy of AI-mediated treatments and clinical tools, especially against severe diseases of deep social interest such as cancer– as compared to the many 'announcements' of 'spectacular (initial) results' which, are not later proven to be particularly useful in routine clinical use.
- The availability of trustworthy, open-access information -warranted by public services- is essential to reduce the risks of 'fake-based' medicine and to protect citizens from 'digital health scammers',
- The question of whether (or not) harnessing AI systems under human control on life and death decisions.
   Should we allow 'a machine' to take such decisions (on us, on a relative)?

The Third Group (G3) includes certain aspects barely -or not included at all- in many studies on AI applications in Medicine and Healthcare, such as:

- Humanization of care, allowing for more time with the patient that improves clinical outcomes and relieves high stress levels (burnout, suicide rates) of physicians. However, AI systems still lack the (much needed) ability of a physical (contact) examination.
- Social engineering, profiling based on merged medical, health and social data. This issue questions the use of such merged information for the preventive detection of events of clinical significance (e.g. suicide) and for commercial uses (e.g. tailored marketing, insurance, health care coverage or employment). A significant topic is the potential genetic screening of (the whole, groups of) population (detailed below).
- The availability of (unsupervised, unreliable) multiple data, genetic tests for anyone, with the risk of 'patient-generated' medicine.
- Limits to data use, and post-mortem data inheritance. A key question is related to the limit of use of very personal information (from Extended Personalized Medicine such as genetic, medical, biological data) when a person dies, e.g. if this personal data remains available for use by AI systems, if there is a post-mortem limit, if this data can be inherited, by a relative or a public institution, if what would be the purpose of additional processing, e.g. commercial use, scientific use (e.g. belonging to a person with a rare disease) or direct use to treat a disease.

- The expanding availability of crowd-sourcing of algorithms and processing power. The free sharing of
  expertise, know-how, and experience define a debate of 'solidarity' vs risks of malicious use.
- Reading and decoding brain signals. The hope for the severely impaired may be turned into 'mind reading' technologies challenging privacy at its basics.
- Interactions with neural processes, which can be applied to help in neurological, mental diseases and, potentially, to interfere with free will.
- Gene editing as an enabler for self-experimentation in humans, with the risk of unexpected results and the potential for change of the genetic heritage.
- Gene editing 'to design' humans and human-animal embryos. With the (already documented) risk of unexpected results in newborns and the unknowns derived from the creation of new types of humananimal beings ('chimera').
- The two sides of technology. With the (relatively) easy weaponization of many of the AI-mediated technologies and the corresponding high risk of bioterrorism.
- Whole-brain computerized emulation and 'head transplant', challenging the quest for immortality and the very definition of life.
- The search for artificial life forms (explicitly declared for military purposes), questioning the definitions of life (natural, artificial) and death.
- The balance of benefits versus risks and pitfalls and the very fundamental question of whether there should be (or not) limits to research and development?

**Figure 3.** Ethical and social aspects of AI and AI-mediated technologies in Medicine, Healthcare and Wellbeing sorted in three groups (G1, G2, and G3). Some key relevant issues, controversies, significant, and conflicting issues are outlined for each aspect.

Aspects.		Analyzed in relation to.			
A CONTRACTOR OF A CONTRACTOR O		ip. Authorization for data collection, sharing, mining, exchange.			
Anonymity. Surveillan		nce anxiety.			
Responsibility. Accountabi	lity. Who is re	sponsible in case of malfunction?			
Effects on professionals an	2203 STATE	w jobs. Deep changes in some medical specialties (some may even	disappear).		
employment.		professional updating. Quality control, monitoring.			
Security. Reliability.	( A MARKARON AND	lities. Data theft. Manipulation of the data used to train the systems.			
Performance.	'Persona	d health outcomes and clinical pathways. Reduction of medical error lized Medicine'. Psycho-social outcomes.	115		
Human-in-the-loop?	100 TO	human operator override AI systems? Even if human is more 'error- opens if there is no time to act?	prone r		
Aspects.		Controversies.			
Explainability.	2.5 2.5 2.5 2.5 2.5	red by legislation. Some systems are (will be) too complex to be a human. But they may give better results than a human.			
Trust.		ine' perform better than a human doctor? What to do if they (AI doctor) give conflicting opinions? 'Digital health scammers'.	(G2) Of particula		
Data quality. Bias/	Do Al systems h	ave biases/are fair with different (e.g. ethnic, gender, age) groups?	relevanc		
fairness.		proper, balanced data for training? Are results valid?	for AI		
Empathy.		is? Help (the human) take difficult decisions?	in Medicin and Health		
Citizen (taxpayer) opinion and involvement.		in public-funded research, informed consent, citizen science. netry' doctor-patient. 'Patient-centric' model.			
Test, benchmarking.	How to evaluate	to evaluate results? Existing procedures for average groups are valid for vidualized treatments? Comparison of AI systems 'against humans or			
Regulation.	30 30 30 82 8	behind technology. No international consensus.			
Affordability. Economic impact.		ents at 'impossible' prices? A factor of inequality? New models for e and coverage?			
Information for the public and professionals.		ew products. Real advances vs hypes and non-confirmed stories of is of great interest (e.g. cancer cures). Risk of 'fake-based' medicine.			
Life and death decisions.	Should we allow	e allow 'a machine' to take them (on us, on a relative)? The debate about onomous weapon systems.			
Aspects.		Significant/conflicting issues.	-		
lumanization of care.		Professionals with AI: More time with the patient, stress relief. AI systems: Currently, lack of physical exam/contact with patient.			
Social engineering, profiling b medical, health, social data.	based on merged	Preventive detection of events (e.g. suicide) vs tailored marketing, insurance, health care, employment. Genetic screening of the population.			
Availability of (unsupervised, multiple data, genetic tests fo		Risk of 'patient-generated' medicine.	(G3)		
imits to data use? Post-mort	em, inheritance.	Post-mortem use of individual (e.g. genetic) information?	Barely/no included i		
Crowd-sourcing of algorithm: power.	5, processing	Free sharing of expertise, know-how, experience. Solidarity vs risks of malicious use.	analysis of applicatio		
Reading, decoding brain sign	als.	Hope for severely impaired vs privacy at its basics.	in Medicir		
nteraction with neural proce	sses.	Help for neurological, mental diseases vs free will.	and Heat Care.		
Gene editing as self-experime	entation.	Risk of unexpected results. Change of genetic heritage.			
Gene editing of (human, hum embryos.	ian-animal)	Risk of unexpected results in newborns. Creation of new beings ('chimera').			
he two sides of technology.		'Easy' weaponization. High risk for bioterrorism.			
Whole-brain emulation / 'tran	nsplanť.	The quest for immortality. Definition of life.			
Living machines' ('biological The search for artificial life fo		Definitions of life (natural, artificial) and death.			
me search for artificial file fo	11112				

Source: reproduced from [5].

# 3 AI landscape

# 3.1 Relevant topics

Table 3 presents 100 identified relevant topics which represent the literature update on AI systems in medicine, healthcare and wellbeing and their ethical and societal impact. Topics are sorted by alphabetic order and each topic is supported by a references dealing with it. We refer to page. 64 for a list of definitions related to the concept list.

**Table 3**. Literature update on AI systems in medicine, healthcare and wellbeing and their ethical and societal impact by alphabetic order of topics.

Торіс	Name	References
1	Algorithmic impact assessment	[36]
2	Accountability	[37]
3	Autonomous weapons	[38] [39] [40] [41] [42] [43]
4	Big Data of the human body	[44] [45] [46]
5	Bioeconomy, geostrategy	[47] [48] [49] [50] [51] [52] [53]
6	Biometric databases after the Afghanistan war	[54] [55] [56] [57] [58] [59] [60]
7	Biometrics for (self and remote) monitoring	See 'Wearables'
8	Bioterrorism. Post-COVID-19 institutional awareness.	[61] [62] [63] [64] [65] [66] [67] [68] [69] [70]
9	Bioterrorism. Dual use of drug discovery to develop bioweapons, non-conventional threats.	[71] [72] [73] [74] [75] [76] [77] [78] [79] [80] [81]
10	Brain implants	See 'Neurotechnology for human cognitive, physical augmentation'
11	Brain learning, simulation	[82] [83]
12	Brain preservation and the quest for 'immortality'	[84] [85] [86] [87]
13	Cancer	[88] [89] [90] [91] [92]
14	Cardiac health	[93] [94] [95]
15	Clinical examples (others)	[96]
16	Challenges (overview)	[5] [6] [7] [8] [97] [99] [100] [101] [102] [103] [104] [105]
17	Citizen participation	[106]
18	Cloning pets and parasites.	[107]
19	COVID-19 detection, diagnosis	[108] [109] [110] [111] [112] [113] [114] [115] [116] [117] [118] [119] [120] [121]
20	COVID-19 epidemiology, tracking	[122][123]
21	Cognitive augmentation	See 'Neurotechnology for human cognitive, physical augmentation'
22	Cosmetics and self-perception	[124][125][126]
23	Data Access. Open Access	[127]
24	Data quality	[128][129][130]
25	Digital twin	[131][132]
26	Drug design, drug discovery	[133][134][73][135][136][137][138][139][140][141][142]
27	Education	[143][144]
28	Equity, fairness	[131][145] [146]
29	Ethics, ethical risks, concerns	[147][148][149][150][151][152][153][154][155][156]
30	Explainability	[157][158]
31	Evaluation of human performance	[159]
32	Face recognition	[160][161] [162][163] [164]
33	Female, reproductive data monitoring	[165][166] [167][168] [169][170] [171][172] [173]
34	Gene decoding	[174][175][176]
35	Gene editing in humans	[177][178][179] [180][181] [182][183] [184][185] [186][187][188] [189][190] [191][192] [193][194] [195][196] [197] [198][199]

		[200][201] [202][203] [204][205] [206][207] [208] [209]
36	Gene editing for human augmentation	See 'Gene editing in humans'
37	Gene editing. Risks of unknown effects	[210][211]
38	Genetic data collection and gene editing for potentially malicious use and agroterrorism	[212][213]
39	Genetic data collection and gene editing for potentially malicious use and bioterrorism	[214][215] [216][217]
40	Health coaching	See 'Training', 'Wearables', 'Home, ambient intelligence'
41	Health in the metaverse	[218]
42	Health monitoring at borders	[219][220][221] [222]
43	Health monitoring	[223] See also 'Wearables', 'Home, ambient intelligence'
44	Home, ambient intelligence	[224] See also 'Wearables'
45	Human augmentation	[225][226] [227][22
46	Information, disinformation, misinformation	[229]
47	Interaction with humans	[230]
48	Institutional perspective - academia	[231][232][233]
49	Institutional perspective - politics	See 'Institutional perspective – law-enforcement, defense'
50	Institutional perspective – health	[234][235] [236]
51	Institutional perspective – law-enforcement, defense	[237][238][239][240][241][242] [243][244][245] [246][247][248] [249][250][251] [252]
52	Lack of tests	[253][254] [255]
53	Learning	See 'Training'
54	Lethal autonomous weapons systems	[256]
55	Living machines	[21][22] [23] See also 'xenobots'
56	Massive data collection for social manipulation	[257]
57	Massive data collection for social surveillance, scoring of citizens, COVID-19	[258][259] [260][261] [262][263] [264][265] [266][267] [268]
58	Massive data collection for law enforcement	[269][270][271] [272][273][274]
59	Mental health	[275][276][277] [278][279][280] [281][282][283] [284]
60	Mental health in the COVID-19 pandemic	[285][286]
61	Mental health. Self-perception, society, gender	[287][288][289] [290][291][292] [293]
62	Neurodiversity	[294][295][296] [297][298][299] [300][301][302] [303][304][305]
63	Neuroethics, social impact	[306][307][308] [309][310][311]
64	Neurotechnology, brain implants. Concepts	[312][313][314] [315][316][317] [318][319]
65	Neurotechnology for brain control	[320]
66	Neurotechnology for brain signal reading	[321][322]
67	Neurotechnology for human cognitive, physical augmentation	[323][324][325] [326][327][328] [329]
68	Neurotechnology for control of robots	[330][331]
69	Neurotechnology for control of weapons, military applications	[332][333][334]
70	Neurotechnology for control of prostheses	[335]
71	Neurotechnology for edition of brain content	[336][337]
72	Neurotechnology for treatment of mental, psychological disorders	[338][339][340]
73	New life forms	[341][342][343] [344]
74	Oncology	See 'Cancer'
75	Organ growing	See 'xenobots'
76	Pathology	[345][346]
77	Perception (of systems)	[347][348][349] [350][351]
78	Personalized Medicine / tailored treatments	[352][353]
79	Psychological health. Religion an cults	[354]

80	Radiology, radiomics, medical image analysis	[355][95][356] [357][358][359] [360][361][362] [363][364][365] [366][367]
81	Robotics	[368]
82	Robotic assistants	[369][370][371]
83	Robotic surgery, treatments	[372][373][374] [375]
84	Robotic 'health professionals'	[376][377][378] [379][380]
85	Robotic 'sex partners'	[381]
86	Robots and human cruelty	[382]
87	'Sentient' systems?	[383][384]
88	Surgery assistance	[385]
89	Synthetic biology	[386] [80]
90	Training	[329]. See also 'Neurotechnology for human cognitive, physical augmentation'.
91	Transparency	[387]
92	Trust and over-reliance	[388][389][390] [391][392][393] [394][395][396]
93	Ukraine war. Face recognition and body identification	[398][399]
94	Ukraine war. Electronic warfare. Weapons lab	[400][401]
95	Ukraine war. Control and manipulation of information	[402][403] [404][405]
96	Wearables - glasses	[406][407][408] [409]
97	Wearables - vision	[410]
98	Wearables – other sensors	[411]
99	Well-being, wellness	[412][413][414] [415][416]
100	Xenobots	See 'Living machines'.

## Source: Own elaboration.

We observe that the list of selected topics can be grouped in different clusters or themes. These include: use of AI in areas of medicine such as cancer, cardiology, mental health, pathology, surgery or radiology; general ethical considerations of AI such as algorithmic impact assessment, accountability, equity, fairness, or explainability; areas with high social impact such as autonomous weapons, bioterrorism, or human gene editing; topics relating AI to related technological development such as the metaverse, neurotechnology or robotics; geo-political aspects such as geostrategy, institutional perspectives; and topics linked to our two target historical events, COVID-19 pandemics and Ukraine war. We present in the following sections the main conclusions driven from the table of topics and related references.

# 3.2 Technological and ethical considerations

As predicted in [5] [6] [7] [8] and [9], AI systems and tools continue to expand into virtually all areas of medicine, healthcare, and wellbeing, with an expanding impact of the 'bioeconomy' related to health data and their analyses. However, since the COVID-19 pandemic outbreak, most scientific and clinical efforts by the international community have been concentrated -particularly in 2020 and 2021- to address its devasting health, societal, economic, and political consequences. Therefore, research, development, innovation, and technology deployment of AI-mediated tools in the topics of this analysis are predominantly centered in COVID-19-related areas. In addition, since the war in Ukraine began in February 2022, certain new applications have emerged.

From a conceptual perspective, there also remains a set of unsolved challenges about the social perception of AI technologies related to medicine, healthcare, and wellbeing. They were already highlighted in [5] and mention in Section 3.3:

- Trust and over-reliance on technology, including the willingness to accept, the betrayal aversion, and the question of whether there should always be a human-in-the-loop,
- Bias and unfairness: the need of unbiased balanced data for training algorithms, and the lack of metrics for the evaluation of performance

- Explicability, transparency, and responsibility. What happens when algorithms work precisely (i.e., they provide accurate results) but cannot be explained to (or understood by) a human being?
- Data safety, privacy, ownership, inheritance, and related issues.

## 3.3 Lessons of the COVID-19 pandemic

Early lessons of the COVID-19 pandemic in AI in medicine, healthcare and wellbeing were initially pointed out in the 2020 JRC Report [5] and later expanded in a specific analysis on the topic [6]. Some studies have been recently published on the overall analysis of AI systems in the COVID-19 pandemic by leading institutions [417] [418] [419], including the Council of Europe [420]. From the updated state-of-the-art in this document, main lessons on these topics can be outlined as follows:

#### **TELEMEDICINE HAS SETTLED**

This point was clearly established shortly after the pandemic began. In the 2020 JRC Report accounting of early effects of the COVID-19 pandemic, it was headlined as "The boost of telemedicine" [6]. This initial trend has effectively settled as determined by the evolution of the disease [421] [422], with forced confinement of the population and strongly limited in-person access to healthcare resources and professionals, particularly, for non-COVID-19 related issues. As in other aspects of human social interactions during the pandemic, the extensive acceptance and availability of advanced communication tools (e.g., video call platforms and applications) -even in resource constrained settings- have fostered adoption of telemedicine at all societal levels [423], including population groups which may have been considered initially reluctant. However, after the COVID-19 experience, challenges remain [424] [425].

#### **ONLINE PLATFORMS FOR PSYCHOLOGICAL SUPPORT ARRIVED TO STAY**

This issue was pointed out in the 2020 JRC Report [5] on the early assessment of consequences of the COVID-19 pandemic, as initial references pointed to the increasing use of AI-based tools for emotional support in the context of the severe social isolation measures being implemented. Chatbots [426] have played a significant role, being even credited with contributing to save lives in some studies. In a 2021 JRC Report [7] , the risk of malicious misuse leading to 'psychological hacking' was identified, particularly linked to people with psychological vulnerabilities and mental health issues. Currently, the adoption of online platforms for mental health support is gradually growing, although many challenges and unknown questions remain. A detailed use case on this topic is provided in Section 4.

#### **ASSISTANT ROBOTS, FROM RETICENCE TO ADOPTION**

This point was also established in 2020 as "Robotics: from fear to new roles and acceptance" [6]. They have proven successful as 'operational support' for human (e.g., for disinfection and work in contaminated areas), and for 'companion and social assistance' (for isolated persons and certain home tasks). New uses even point to robotic 'sex partners'.

#### THE SUCCESS OF AI-MEDIATED DRUG DISCOVERY AND GENETIC DATA ANALYSIS

The surprisingly rapid development of COVID-19 vaccines has highlighted the power of AI tools for the modeling, design, and simulation of the complex interactions of drugs with the human organisms, ultimately leading to the successful development of the much-needed vaccines [427]. In certain types of data analyses, AI tools have allowed for time reduction rates from a month to less than a day [428]. As a direct consequence, barely six months after the outbreak of the (completely unknown) virus (SARS-CoV-2), early prototypes of 'candidate vaccines' were being tested. In addition, AI tools have also provided an invaluable help in speeding up diagnostic processes through genetic analysis, mostly by supporting polymerase chain reaction (PCR) and other molecular tests [420]. However, recent publications show how algorithms devised to look for innovative drug molecules using gene editing can be easily turned to design biological weapons. A detailed use case on this topic is provided in section 4. Drug development and data analysis define two areas of AI application of particularly significant consequences, emphasize the importance of the novel concepts of 'bioeconomy' and 'health geostrategies' and reflect their increasing role in the world economy and politics.

## AI-MEDIATED DATA ANALYSIS SUPPORTS EPIDEMIOLOGY BUT BRINGS SOCIAL RISKS

This point was pointed out in the 2020 JRC Report [6] as "A difficult balance: individual rights vs public health". Notably, it also relates to an early lesson of the current war in Ukraine (section 3.4) and it is further analyzed in section 4 and highlighted in [420]. Unfortunately, the concerns about the potential misuse of the health data -and related information -e.g., contact tracing'- go beyond from the much-required public health

management to 'social scoring' and surveillance of citizens, and they have become a worrying reality in some countries. As mass data collection (e.g., for molecular tests of COVID-19) is conducted, there may not be a clear oversight and control of the final destination of the information, including genetic sequences of individuals- which may be compiled for developing AI platforms (as mentioned in [429] for China). Potential malicious misuse may even lead to the design of feature-specific, targeted pathogens and biological weapons (see section 4), with added fears of being tailored against certain population (e.g., ethnical) groups. This latter, strongly alarming possibility was also anticipated in the aforementioned 2020 JRC Report [5] and mentioned at the House Intelligence Committee of the USA [217]. The debate about privacy and the 'common good' has not reached a consensus answer, and these subjects remain as 'hot topics' of social concern and contest.

#### THE BOOST OF AI-MEDIATED PERSONAL DEVICES FOR HEALTH MONITORING

This point is partially related to -and evolves from- the previously discussed adoption of telemedicine. In the pandemic, under confinement, with strict restrictions for inter-personal interaction -significantly limiting the access to non-COVID-19 related healthcare, many people realized that personalized, automated monitoring systems could help them to keep trace of their own health, even reducing the 'difficult' -and, in many cases, costly- issue of visiting the doctor's office. The main difference from telemedicine adoption lays in the availability of AI-mediated systems which analyze biological parameters and generate 'recommendations' about how actual measurements refer to average bands of values, even triggering medical alarms. In addition, personal monitoring devices have rapidly advanced reducing invasiveness and increasing comfort for the user from fitness-related gadgets to stick-on and wearable sensors, and in the type and sensitivity of measurements, routinely including metabolic and cardiac parameters. An important aspect for device manufacturers is the regulatory change entailed in the evolution from the measurement of parameters to monitor sports performance to the purpose of medical diagnosis. Challenges remain about the training cases for algorithms and on the evaluation of their performance in different social (e.g., ethnic, age, gender) groups of population.

#### THE FAILURE OF DIAGNOSTIC AI-MEDIATED TOOLS

This is phrased as a striking conclusion, as it refers to the 'core' of medicine, i.e., the diagnosis of disease, and the harsh summary is that those tools developed 'to help fight the COVID-19' were not fit for -the much needed- clinical use. A 2021 meta-analysis review [419], headlined that "Hundreds of AI tools have been built to catch COVID-19. None of them helped", with a further worrying statement: "Many hundreds of predictive [AI] tools were developed. None of them made a real difference, and some were potentially harmful". The causes of these negative results can be linked to the extreme time pressure on scientists to help combat the pandemic, but key reasons for failure had already been pointed out in the previous JRC Reports in 2020 [5] [6] under the headline of "Benefits and risks of data-driven algorithms", in which poor-guality (biased, insufficient, wrongly labeled) datasets for training algorithms, and the lack of standardized procedures for testing performance, were identified as major pending challenges for reliable AI systems in medical applications. Another 2022 review [417] [418] points out that, beyond "some scattered successes ... In general, ... in diagnosing COVID-19, predicting its course through a population, and managing the care of those with symptoms, AI-based decision tools failed to deliver". In addition to previously mentioned questions, human failures -in the selection of applications and in the interpretation of their results-, and a complex global context -on data sharing and governance- add to the faulty results. And those major challenges still remain

#### SOCIETY DEMANDS TRUSTWORTHY INFORMATION

This point was pointed out in 2021 [6] as "Psychographics and the control of information", and it is further analyzed in section 4. In the context of the COVID-19 pandemic, two simultaneous -yet opposite- applications of AI tools for 'information flows' can be identified: on one side, the 'positive use' of such tools for 'knowledge sharing', as reported by the Council of Europe [420]. These systems allowed for fast, in-deep screening of thousands of research paper and communications on the effects, treatments, dynamics, and many other aspects of the pandemic, effectively enhancing efforts to fight the disease by the scientific community. But, on the other side, the 'negative use' of AI-mediated tools for the spread of 'excessive, false, and misleading information' about the disease, vaccines, and treatments. The malicious use of information in the COVID-19 pandemic has been so relevant that a specific term has been coined to designate the 'information epidemic' as 'infodemic'. Its impact relates directly to the degree of connectivity and on the availability of data sharing in a given environment, and, in the European region, this has been an area of interest. As documented, the COVID-19 infodemic has effectively damaged the health of citizens by inciting to breach the recommendations from authorities, and, particularly, to refuse vaccination and public health measures, with

even deadly effects. It is also linked to negative emotional well-being and to the generation of social unrest and disturbances.

#### SOME ASPECTS COMMON TO OTHER AREAS

There are additional fields in which the evolution of AI-mediated technologies in medicine and healthcare in the context of the COVID-19 pandemics has evolved similarly as in in other domains of science and industry. They comprise the enhanced adoption for logistics and operation, particularly useful for health-related facilities under the very difficult circumstances of resource shortages, disruptions in supply chains and the pressure to operate at an overcharged rate with reduced personnel -e.g., who become sick or cannot travel to work).

## 3.4 Early lessons from the war in Ukraine

In February 2022, Russian troops invaded Ukraine, effectively beginning the current 'war in Ukraine'. As detailed in section 1.3, this is the largest armed conflict in European territory since the Second World War, and by the time of carrying out this analysis, it still presents an uncertain evolution. The nefarious consequences of war obviously impact the core topics of this report, i.e., the Health and Wellbeing of the population and the practice of Medicine. In addition, new challenges arise related to AI-mediated technologies in this conflict, mainly related to 'Digital Health' and 'eHealth<sup>1</sup>. From the current state-of-the-art and 'state-of-the-conflict' certain early lessons may be extracted for the future:

#### THE POTENTIAL OF EHEALTH FOR HELP

Medical and health services in conflict areas are severely stressed [430] and, in many cases, destroyed, with the additional burden of increasing shortages of gualified personnel, and the consequential damage to the civil population. Fostered by advances in communications technology -which allows for internet access in war zones [431] - eHealth services offer a potential for relatively easy deployment providing help in many clinical areas [432], but there remain "questions on safety and quality, data privacy and clinical efficacy" and "there is a need for further clarification of global norms relating to practice in this context" [433]. Some areas of particular interest related to AI-mediated resources include mentoring and training services for low-skilled personnel at improvised facilities, remote (e.g., image based) tools for diagnosis, triage and surgical guidance, logistics support, and online platforms for mental health care. The latter is a newly defined area in a war context, as psychological and psychiatric effects are not usually attended in conflict zones since priorities refer to emergency relief with very limited resources. However, NGO teams on the ground alert on the muchneeded help on these aspects, particularly for the civil population [434]. As detailed in section 4, AI-mediated tools could provide at least part of the required assistance. Advances in natural language processing can help overcome language barriers, and online platforms may be continuously available through remote access to the internet. Another area of active development refers to robotized medical equipment and, particularly, 'robotic surgeons'. Combined with augmented reality tools, they may contribute to providing high-level medical attention in field hospitals and zones with very limited availability of highly skilled personnel [435].

## THE ENHANCED NEED TO SAFEGUARD HEALTH DATA

The advent of digital resources has promoted a clear shift to 'all digital' medicine and healthcare, and as pointed out in a previous JRC report [5], the domain of medical information (i.e., clinical records, analytics, and diagnostic images) has expanded to include genetic data. Notably, in 2020 (before the war began) Ukraine was recognized in the EU environment as an example of a definite transition to 'zero paper' and electronic health records started in 2018 [436].

Recently, in the framework of the fight against the COVID-19 pandemic, molecular testing of the population has standardized, and many new data bases -both in public and in private facilities- have been generated. They contain increasingly detailed records of individuals, including full genome sequences, and the social implications of 'non-strictly medical' use to these types of data constitute a lesson from the COVID-19 pandemic (section 3.3).

<sup>1</sup> AI-mediated weapons and drones are out of the scope of this report.

Beyond the requisites of privacy and security of medical data imposed by the current European and international regulations, new issues arise about AI-mediated uses of health data in the context of an armed conflict.

#### PREPARE FOR A 'REBUILD FROM NOTHING' SCENARIO.

When the war in Ukraine began, the Government announced an operation to backup institutional data for a hypothetical 'rebuild from nothing' scenario [437]. The information published specifies that the process has been developed "... to secure vital data so the Ukrainian government, education, and banking institutions can continue ..." and, from a technical perspective, it is being implemented through massive migrations to web clouds and other resources. Although there no explicit references to health data or medical records, they are likely included.

For populations displaced and for those living in damaged environments, the availability of identity, education and health data will clearly be extremely helpful in the difficult road to restoring or adapting their lives. However, this type of 'massive copy' of very sensitive information may require -as in the case of Ukrainelegislative updates, for example to allow such data storage in another country.

#### SECURE ACCESS TO HEALTH-RELATED DATA IN A WAR SCENARIO.

There are two categories of data which require special protection under a war scenario:

- Identification and biometric data of the population and, particularly, of healthcare workers, as they can be employed to specifically target those individuals. Despite being violations of the international humanitarian laws for war, these attacks on healthcare professionals continue in war zones [438], deeply increasing the damage to and the suffering of the civilian population.
- Genetic data (sequences) of individuals. As indicated, this risk and its potential misuses is described in the context of the COVID-19 pandemic (section 3.3).

A recent example of the consequences of an uncontrolled access to (at least) the former category of databases has taken place in the aftermath of the abrupt departure of the USA and other coalition allies from Afghanistan, in August 2021. According to [55], in the confusion of the withdrawal, they left behind equipment employed for biometric identification (including iris scans) of local workers supporting the regime which are now under the control of the new Taliban Government. These devices comprised mobile scanning units connected to (or with built-in) databases with detailed personal, demographic and even social information, with the obvious risks of being used to track and target certain individuals, e.g., supposed opponents [439].

#### NEW USES OF FACIAL RECOGNITION IN CONFLICT ZONES

The war in Ukraine has also demonstrated a new field of application of these powerful, AI-mediated tools: the identification of dead persons, even when faces are damaged.

This technique is documented to be used by the Ukraine Government [440] with a twofold purpose, i.e., to document civilian casualties in their own population for future prosecution of authors -under the suspicion of war crimes- and to identify enemy soldiers and directly transmit that information (e.g., through social networks) to their relatives [441]. The latter use presents a (questionable) 'new approach' to psychological and information warfare, as data about loss in the battlefields may not being disclosed, even to the families of the deceased.

## 3.5 Other areas of development

#### PERSONALIZED MEDICINE

This topic was thoroughly studied in the 2020 JRC Report [5], and, beyond some technical advances, that analysis remains valid. Pending questions refer to conceptual difficulties in the change from population-level to patient-level models, the enhanced understanding of genomics, metabolomics, proteomics, epigenomics, microbiomics and other (data-driven) -omics, the need of standardized datasets for validation of models, and the potential sources of significant societal inequalities due to the cost barriers to access treatments.

#### **TRUST, EXPLAINABILITY**

This topic was also thoroughly discussed in the 2020 JRC Report [5], and the challenges identified still persist. In addition, most relevant issues refer to:

- Open access, fair, balanced, standardized datasets for training and test. Data from one institution (i.e., linked to equipment, population, gender, geographic, demographic features) needs to be assess in terms of potential suitability for use elsewhere.
- Integration of many types of multimodal data (health records, imaging, signals from wearables and ambient sensor, genomics). Structured information gathering should be promoted with clear, effective tools for debugging and updating, aligned with the European Data Infrastructure.
- Reliable ground truth data sets. Problems arise related to the definition and labeling of 'gold-standards' by human or AI systems. Synthetic data helps but it is not a 'sustainable' solution. This is related to the additional lack of reproducible analytics and test tools.
- The need to define workflow protocol and clinical test scenarios.
- Patient privacy and data ownership concerns about data use agreements, de-identification, inheritance, and the conflict between individual rights and the common good.
- Integration of data sets and AI tools towards the One Health, considering aspects related to human, animal and environmental aspects and impact of technologies.

## 3.6 Significant institutional apprises

#### WHO GUIDANCE ON AI FOR HEALTH (JUNE 2021)

In June 2021, the World Health Organization (WHO) announced the publication of a Guidance specifically devoted to the ethical (and, indirectly), social aspects of AI technologies related to health [99]. As stated in its presentation, it is the result of almost two years of work by a specialized team, with 336 references, and it is obviously related to the contents of this report. In their overview, it is written that "*The report identifies the ethical challenges and risks with the use of artificial intelligence of health, six consensus principles to ensure AI works to the public benefit of all countries. It also contains a set of recommendations that can ensure the governance of artificial intelligence for health maximizes the promise of the technology and holds all stakeholders – in the public and private sector – accountable and responsive to the healthcare workers who will rely on these technologies and the communities and individuals whose health will be affected by its use".* 

The document, of 186 pages, is structured in the following main 9 chapters: 1. Introduction. 2. Artificial Intelligence. 3. Applications of Artificial Intelligence for Health. 4. Laws, policies and principles that apply to use of artificial intelligence for health. 5. Key ethical principles for use of artificial intelligence for health. 6. Ethical challenges to use of artificial intelligence for health care. 7. Building an ethical approach to use of artificial intelligence for health. 8. Liability regimes for artificial intelligence for health. 9. Elements of a framework for governance of artificial intelligence for health.

#### COUNCIL OF EUROPE ON NEUROTECHNOLOGIES AND HUMAN RIGHTS (JUNE 2022)

The Council of Europe has carried out detailed analyses and discussions about neuro-technologies and their potential impact on human rights [442] : 'Technological innovation often creates its own dynamic. Major technological breakthroughs in fields such as artificial intelligence, genome editing, and neuro-technology have the potential to advance biomedicine and healthcare. However, uncertainty exists about the impact and direction of these developments.'

With the objective of 'embedding human rights in the development of technologies which have an application in the field of biomedicine', this institutions has proposed an Strategic Action Plan on Human Rights and Technologies in Biomedicine (2020-2025) [443]

#### EUROPEAN PARLIAMENT ON GENOME EDITING ON HUMANS (JUNE 2022)

In June 2022, the European Parliament launched a detailed study including 'a survey of law, regulation and governance principles') on 'gene editing on humans' [444].

#### WHO POLICY BRIEF ON DIGITAL SOLUTIONS TO HEALTH RISKS RAISED BY THE COVID-19 (JUNE 2022)

In June 2022, the World Health Organization (WHO) announced the publication of a Policy Brief specifically devoted to the health risks raised by the spread of 'excessive, false and misleading information' (i.e., by the so-termed 'information epidemic', or 'infodemic') about the COVID-19, centered in the European region [445]. As stated in its presentation, the European Regional WHO Office "highlights the six policy considerations described here below: 1. Reinforcing multi-stakeholder networks for infodemic management. 2. Strengthening overall risk communication and community engagement. 3. Implementing continuous monitoring of online

harmful and false content. 4. Improving digital literacy approaches and organizing infodemic management trainings. 5. Advocating for infodemic management through communication campaigns. 6. Ensuring safe online platforms, which protect people from harmful content. ... with a shared objective of improving the Region's public health response to the COVID-19 infodemic and enhancing preparedness for future health emergencies".

This document indicates that "The exposure to false information – both online and offline – has been linked to increased health risks, having harmful or even deadly effects. Examples of negative behaviours include use of wrong or harmful treatments, lower uptake of protective measures including vaccinations, impaired mental health and emotional well-being, and lower trust in health-care providers".

In addition, it also identifies a set of "digital interventions designed to tackle infodemics: • "implementing factchecking and false information reporting mechanisms • adopting social listening tools augmented by artificial intelligence, which can help analyse the large-scale fast-flowing data, assess risks and identify infodemic signals • creating monitoring programs, multi-stakeholders' coordination initiatives and national regulatory frameworks which respect the principles of freedom of expression • promoting digital health literacy and inoculation interventions that improve people's ability to spot misinformation".

#### CREATION OF THE NEW EUROPEAN HEALTH EMERGENCY RESPONSE AUTHORITY (HERA, JULY 2022)

As announced in 2021 (see section 1). Notably, the United States announced as well the creation of a new agency (Advanced Research Projects Agency for Health, ARPA-H) with a similar orientation in some aspects [446].

#### **R**ELATIONSHIP TO **JRC** RESEARCH ON THESE TOPICS.

The previous documents by the World Health Organization, the Council of Europe, and the European Parliament present -as expected- some elements that are common to those included in the five previous documents published by the JRC as Science for Policy Reports and Science for Policy Brief [5] [6] [7] [8] [9]. In addition contents of the 2020 JRC Report [5] have been recently cited in discussions in the European Parliament [447] and, notably, this work is considered as a key reference in the sector by leading entities [448].

# 4 Socially-relevant Use-Cases

AI technologies and AI-mediated tools present an extraordinary -and rapidly expanding- potential of impact in all areas of Medicine, Healthcare and Wellbeing. However, their features can be oriented, on one ('good') side, towards the benefit of persons, their physical and mental health and societal wellbeing, or, on another ('bad') side, towards malicious purposes, with the aim of damaging persons and society, also including future generations.

As highlighted in section 1, this report covers a period which includes two historical circumstances with significant impact in all aspects of life and society, i.e., the COVID-19 pandemic and the war in Ukraine. These two events, still under development, have a clear influence in the subjects of this analyses and have determined the identification of five core Use-Cases that we consider relevant from a societal perspective.

They are identified as the following five main fields (key expanding areas):

- 1. AI tools for mental health,
- 2. AI-mediated gene editing,
- 3. AI tools for epidemiology and health data monitoring,
- 4. AI-mediated neuro-technologies, and
- 5. AI-mediated inclusion of neurodiversity.

Other areas of significant technical advances comprise AI-mediated drug discovery and personalized medicine. In this section, we further develop these use cases using the methodology, social assessment scales and ethical considerations describes in section 2.

## 4.1 AI tools for mental health

The technology to be explored in this Use-Case refers to **AI-based online platforms for mental health** care.

## SOCIAL IMPACT. CHALLENGES AND BENEFITS

Mental health identifies a subject of very serious concern -but relatively reduced public awareness- for the European society and worldwide. As discussed in the context of the consequences of the COVID-19 (section 3.3), the pandemic has fostered the adoption of AI-mediated tools. With clearly positive and negative aspects and a strong potential for help in the fight against a major health and social problem, this use of AI technology calls for further analysis.

Statistical data show the dramatic toll of mental health in Europe:

- According to [449], before the pandemic and the war in Ukraine, "3.7% of all deaths resulted from mental and behavioral disorders ... and about 13.5% of all hospital beds were psychiatric care beds".
- Approximately 120.000 persons take their own lives per year, corresponding to 12.8 deaths per 100000 population, i.e., 1.3% of all deaths [450] (with some higher values, e.g., in 2016 there were over 165.000 suicides in the EU-27 [451]).
- After the pandemic, a 2021 flagship report by UNICEF about mental health in children [452] -not including the effects of the war in Ukraine- states that:

"As the coronavirus pandemic descended ... powerful emotions enveloped the lives of many millions of children, young people and families ... it will be years before we can really assess the impact of COVID-19 on our mental health ... Indeed, the risk is that the aftershocks of this pandemic ... will pose a risk to the foundations of mental health. Mental health is also a reflection of the ways their lives are influenced by the poverty, conflict, disease, and access to opportunities that exist in their worlds".

That 2021 UNICEF report reveals that in Europe: 9 million adolescents aged 10–19 live with a mental disorder; suicide is the second most common cause of death among adolescents aged 15–19; and almost

1,200 children and adolescents aged 10–19 end their own lives every year (i.e., an estimated three lives per day lost to suicide).

While the effects of the COVID-19 pandemic on mental health are still under active research -and those derived from the war in Ukraine have not been considered at all- data from the USA indicate that about 40% of all adults have struggled with mental health and substance abuse [453] in the 2020-2021 period, and that one third of high-school students have experienced mental health issues, with one fifth having seriously considered suicide [454] It is expected that certain effects of the pandemic (including suicide rate trends) may increase in the long term when the contribution of emergency support and resources ends [455] and when the consequences of the war in Ukraine are considered.

As already indicated in previous JRC Reports [5] [6] - one of the main social effects of the disease was the enhanced adoption of online chatbots [426] and robotic platforms as conversational and social tools to overcome the difficulties of loneliness and isolation due to the 'new circumstances' (i.e., population confinement, quarantine, restricted interactions among people).

Rapidly, the number and features of such technologies has expanded. Commercially available options now range from online 'telemedicine' and 'telehealth' resources for access to and interaction with 'human professionals' [456] [457] to increasingly automated conversational chatbots to systems offering 'professional mental health support' and 'mental self-care' over the internet.

A clearly positive aspect of AI-mediated tools for telemedicine is the increased facility of contact between patients and professionals, particularly under restrictive circumstances that prevent direct, in-person interaction. In addition, as shown by early lessons from the war in Ukraine (section 3.4) AI-mediated tools have a clear potential to help persons in conflict zones. However, other challenging aspects remain, as the loss of empathy in the relation patient-professional, and the difficulties for access for non-technological savvy people, particularly in the elderly population [458]. This is obviously not a problem for children and adolescents in Europe, 'digital natives' for which the interaction with AI-mediated devices is fully integrated in virtually all aspects of daily life.

Nevertheless, a key difference arises when it refers to AI-mediated 'diagnosis', 'therapy', 'follow up' or 'support' -in the mental health realm with respect to other areas of medicine and healthcare- as AI systems interact directly with the person (patient), very possibly without any human monitoring or overview (i.e., openly substituting the interaction with the professional).

As an artificial platform 'talks' with the user, a variety of simultaneous processes may take place: an automated assessment of the status of the person could be performed -yet combined with other sources of digital information (e.g., from social networks)- to detect behavioral features and identify risks such as suicidal or violent ideations and trigger alarms -even to first responders-. But emotional links have also been recently described to arise and new risks of malicious activities happen, from 'digital health scammers' to the intended transmission of directions -even 'orders'- to persons, as identified in previous JRC Reports [5] [6] [7] , in which the term 'psychological hacking' ('psycho-hacking') was coined to designate the latter.

## **TECHNOLOGY ASSESSMENT**

The application of AI-mediated technology defined as Use-Case 1: AI-based online platforms for mental health care can be evaluated as detailed in **Table 4.** Technology assessment of 'Use-Case 1: AI tools for mental health'. Values in arbitrary units..

From a social and ethical perspective, the assessment is twofold: on one side, it can be considered as clearly positive, as it allows for new, powerful tools for diagnostic and therapy, easing access to 'care' and even 'companion' platforms. On the other side, it can also be considered as clearly negative, since it opens new, uncontrolled risks for vulnerable groups of population.

In summary, it is considered an example of a Use Case to be carefully assessed to protect persons and enhance health while promoting social wellbeing.

Feature	Scale	Value
Maturity	Technology Readiness Level (TRL)	8
Availability	Technology Availability Level (TAL)	9
Controversy	Technology Controversy Level (TCL)	+1

Table 4. Technology assessment of 'Use-Case 1: AI tools for mental health'. Values in arbitrary units.

Sustainability	Technology Sustainability Level (TSL) for SDG 3	1
	Technology Sustainability Level (TSL) for all SDGs	0.29
Extent of Adoption	Technology Extent Level (TEL)	6

# 4.2 Al-mediated gene editing

The technology to be explored in this Use-Case refers to AI-mediated tools for gene (or genome) editing. This is a rapidly evolving field with strong, unsolved ethical questions. Two major expanding -and challenging- sub-areas are identified in which the role of AI technologies make substantial contributions: *human augmentation*, and the development of *novel biological threats*.

Let us briefly recall that human cells can be classified in two groups: somatic cells (constituents of the body) and germ cells (or sex cells, that give raise to eggs and sperm). Changes in a gene of a somatic cell stay in the cells and its descendants, but are not transmitted to other cells, and die with the person. Changes in a germ cell are passed to all cells of a new person (baby), and if s/he reproduces, to future generations.

A major challenge in genetics refers to the exploration of the human genome and the identification of all constituent genes, their roles and the effects of mutations and alterations. The extraordinary difficulty of exploring the data corresponding to the human genome and the urgent need for artificial intelligence tools to help in the task can be seen in the vast volume of information to investigate, as detailed in Annex 1.

Al-mediated tools are commonly used to explore genetic information, even to design synthetic 'life forms' (e.g., viruses) for medical and biological applications. Computational tools can also be integrated with gene manipulation technologies -such as CRISPR- to effectively 'modify' existing organisms (e.g., to produce genetically modified crops) but also for building new types of (living) organisms. Advances in technology make some parts of this research possible with relatively common laboratory equipment and low computational power.

## GENOMICS AND NOVEL BIOLOGICAL THREATS. ONE HEALTH, ANIMAL AGROCRIME AND AGROTERRORISM

Engineered pathogens (e.g., viruses) are used in different areas of medicine and biology, with legitimate and beneficial purposes (e.g., as vectors to deliver drugs to cells in certain types of therapies) taking advantage of the capability to select and exploit specific features of infectious agents (e.g., their ability to propagate and target specific gene features).

However, synthetic pathogens may also be tailored for malicious purposes, such as selectively damaging or destroying living beings (humans, animals, plants). This type of malicious applications have evolved from early concepts of state-developed, military biological weapons [459] [460] [461] [462] to the general realm of non-conventional threats (NCTs), under the title of 'biological threats' (biothreats) with an extraordinary potential for bioterrorism.

As highlighted in a 2020 JRC Report [5], for the surprise -and shock- of the scientific and law-enforcement communities, in 2018 it was openly published (later banned from access) how to 'fabricate' a functional strain of horsepox, a pathogen very close to the eradicated human smallpox, using only a university-type of laboratory valued in about \$100.000.

Recently, in 2022, it has been exposed how the same AI tools employed for drug discovery in the race for vaccines and treatments for COVID-19 could be oriented to design pathogens simply by switching the 'direction' of certain algorithms to maximize (instead of minimizing) lethality and other factors. The alarming possibilities which derive from the science and technology underlying these results comprise a wide variety of biological threats, from unintended cross-contamination and health risks related to borders [463] to agents for bioterrorism to bioweapons.

A serious issue of concern refers to potential attacks to genetically modified organisms (GMOs), such as certain types of plants. GMOs are characterized by very specific alterations (i.e., editing) of particular genes, which could, in turn, be targeted by pathogens precisely engineered to destroy those types of crops, with the corresponding damages in in food production chains and economical and societal consequences for the affected zones. These areas constitute the newly identified sectors of animal agrocrime and agroterrorism [464] [465], with the worrying possibility of using animals (e.g., insects) to spread agents [466]. Another scenario derives from the potential targeting of specific human (e.g., ethnic) groups. Such application would lead to particularly harmful scenarios and societal damage. Obviously, these 'ideas' represent the opposite

view from the intended goal of One Health [467] based on the interaction of human, animal and environmental care.

As discussed in the context of the consequences of uncontrolled access to health-related data in a war zone (section 3.4) this possibility has been recently pointed out in the House Intelligence Committee of the USA.

In addition, the commercial availability of 'genetic manipulation kits', for education, R&D and even for do-ityourself approaches presents the risk of accidental leaks (of pathogens) by 'garage scientists' performing 'risky' tasks without the supervision and the security measures proper of professional use.

The COVID-19 pandemic has shown the devastating effect of the spread of a new, unknown virus. Notably, even during major peaks of the pandemic, European and international police, law-enforcement –EUROPOL [66], INTERPOL [65], UNICRI [67], CTPN [68]– and military institutions –NATO [61] – have published reports and organized specific conferences and research initiatives to alert on the enhanced risk of biological threats related to the (accidental or deliberate) spread of (natural or engineered) pathogens. This challenge also relates to population displacements (e.g., caused by wars and by climate change), and to the need of enhanced health monitoring in borders.

On an opposite approach, AI-mediated tools also present a strong potential for combination with many physical, optical, chemical, and biological technologies for the detection of biological threats [468], even for at-a-distance exploration of human and animal bodies to develop effective procedures for screening [469]. As detailed in section 3.6, the European Union and the United Nations have strongly alerted against these novel threats, and the EU has recently launched a new Health Emergency Response Authority (HERA) to lead this field.

#### **IMPROVE HEALTH SCREENING AT BORDERS.**

The uncontrolled spread of the COVID-19 pandemic has clearly shown the need to enhance health screening at borders for the protection of society. This challenge may be substantially aggravated when migrations involve millions of people under very limited health and sanitary conditions, possibly exacerbated by severe weather and the climate change. As indicated in section 3.6, this unmet challenge belongs to the recently updated priorities of the EU and international institutions.

#### HUMAN AUGMENTATION

Human gene editing is a subject of increasing social and ethical debate, particularly as referred to germline editing [470], and about whether it should be allowed, funded, and researched. These issues are strongly linked to the development of AI tools as they constitute key enabling factors -particularly, as combined with the CRISPR technology- for efficient and precise gene editing and, therefore, for the progress in the field. Major, unsolved questions [5], include difficult scientific matters:

- Which are the genes and the alterations in DNA sequences required to achieve
  - resistance to diseases
  - physical traits (e.g., hair or skin color)
  - enhanced (physical, mental) abilities
- Which are the risks for individuals undergoing edition? And for the (e.g., biological) environment? and
- Should 'self-experimentation medicine' be allowed?
- If edition is performed on germline cells, which are the effects on and the risks for future generations?
- Should research be allowed on 'non-viable embryos<sup>2</sup>' (e.g., those leftover from in-vitro fertilization treatments, or other created for research).

and deep ethical concerns linked to individual beliefs and social features [5]:

— Should gene editing be allowed only for adults, in somatic cells (i.e., without potential transmission to future generations?

<sup>2</sup> Those who would not result in a live birth.

- What about the (supposedly) on-going research to obtain 'super-soldiers'?
- Should germline edition be researched to eliminate genetic disorders, particularly those that do not have any treatment option? This is the view of some groups of patients suffering from such conditions -and their families and advocates-, to prevent others from experiencing the disease, but there is no agreement as other people question that eliminating genetic disorders -some not considered as a disability- will improve life [471].
- Should germline editing be allowed to obtain children with 'desired features'?
- Can gene editing constitute another factor substantial factor of inequity? Would it be available only for the wealthiest groups?
- If gene editing for human enhancement becomes extended, would it generate 'predominant' groups of 'enhanced humans' versus 'non-enhanced people'?

Until recently, these questions were part of science fiction plots. However, they are now coming closer to reality, thanks to advances in the required technologies and to the increasing role of artificial intelligence tools. Many countries -including European nations- have discouraged or banned germline editing [470].

#### **TECHNOLOGY ASSESSMENT**

According to the topic content in references, this Use-Case (AI-mediated gene editing) can be evaluated as detailed in **Table 5**.

From a social and ethical perspective, the assessment is twofold: on one side, it can be considered as potentially positive, as it may allow for 'beneficial' human augmentation or the prevention of the inheritance of diseases. On the other side, it can also be considered as clearly negative, since it may open the door to strong social 'divides' (e.g., 'enhanced' vs 'non-enhanced' persons), and unexpected biological threats, even affecting future generations.

Overall, it is considered an example of a topic with risks to be urgently assessed to protect persons and social wellbeing.

Feature	Scale	Value
Maturity	Technology Readiness Level (TRL)	5
Availability	Technology Availability Level (TAL)	6
Controversy	Technology Controversy Level (TCL)	2
Sustainability	Technology Sustainability Level (TSL) for SDG 3	1
	Technology Sustainability Level (TSL) for all SDGs	0.18
Extent of Adoption	Technology Extent Level (TEL)	4

Table 5. Technology assessment of 'Use-Case 2: AI-mediated gene editing'. Values in arbitrary units.

## 4.3 AI tools for epidemiology and health data monitoring

The technology to be explored in this Use-Case refers to *AI-based mass gathering of data of the population under a pandemic*, and their analytics and use.

## SOCIAL IMPACT. CHALLENGES AND BENEFITS.

These issues are discussed as one of the lessons of the COVID-19 pandemic (section 3.3), also linked to an early lesson from the war in Ukraine (section 3.4).

#### **TECHNOLOGY ASSESSMENT**

According to the topic content in references, Use-Case 3 (AI tools for epidemiology and health data monitoring) can be evaluated as detailed in **Table 6**.

From a social and ethical perspective, the assessment is twofold: on one side, it can be considered as potentially positive, as it allows for enhanced public health management, particularly under such circumstances as pandemics or infectious disease outbreaks.

On the other side, it can also be considered as clearly negative, since it may open the door to population 'scoring' and 'classification', potentially leading to surveillance and damage to civil and individual rights and liberty.

Overall, it is considered an example of a topic with risks to be urgently assessed to protect persons and social wellbeing.

**Table 6.** Technology assessment of 'Use-Case AI-mediated epidemiological monitoring of the population. Values in arbitrary units.

Feature	Scale	Value
Maturity	Technology Readiness Level (TRL)	1
Availability	Technology Availability Level (TAL)	2
Controversy	Technology Controversy Level (TCL)	3
Sustainability	Technology Sustainability Level (TSL) for SDG 3	1
	Technology Sustainability Level (TSL) for all SDGs	0.17
Extent of Adoption	Technology Extent Level (TEL)	2

## 4.4 AI-mediated neuro-technologies (for cognitive signals)

The technology to be explored in this Use-Case refers to *AI*-based mediated reading, decoding, and manipulation of cognitive signals of the human brain.

#### SOCIAL IMPACT. CHALLENGES AND BENEFITS.

The social and ethical perspective of this area of technology is clearly twofold: on one side, it can be considered as potentially positive, as it may allow for improved control of prosthesis and brain-computer and -machine (BCI, BMI) interfaces (e.g., for the severely disabled). On the other side, it can also be considered as clearly negative, as it may open the door for non-invasive intrusion in persons' minds (e.g., monitoring attention, cognitive surveillance) with unknown effects and applications. There is a strong debate in European and international institutions and stakeholders about the need and the limits of 'Neuroethics' guidelines and 'Neurorights'.

#### **TECHNOLOGY ASSESSMENT**

According to the topic content in references, this Use-Case 4 (AI-mediated neurotechnologies (for cognitive brain signals)) can be evaluated as detailed in **Table 7**.

Overall, it is considered an example of a topic with social risks to be urgently assessed to protect persons and social wellbeing.

Feature	Scale	Value
Maturity	Technology Readiness Level (TRL)	3
Availability	Technology Availability Level (TAL)	4
Controversy	Technology Controversy Level (TCL)	1
Sustainability	Technology Sustainability Level (TSL) for SDG 3	1
	Technology Sustainability Level (TSL) for all SDGs	0.24
Extent of Adoption	Technology Extent Level (TEL)	1

**Table 7.** Technology assessment of 'Use-Case AI-mediated neurotechnologies (for cognitive brain signals)'. Values in arbitrary units.

## 4.5 Al-mediated inclusion of neurodiversity

SOCIAL IMPACT. CHALLENGES AND BENEFITS.

AI-mediated inclusion of neurodiversity is a 'novel' topic of interest identified within the broad area of neurotechnologies. It refers to the use of AI-based technologies to allow for the inclusion of persons with neurodiversity in the job market, particularly in the sector of information and communication technologies.

This normalization also shifts their social perception and roles, from underestimation and miscommunication to valuing competitive advantages and business opportunities. This topic is different from the research and development of technology-mediated approaches for treatment of psychiatric and developmental disorders (e.g., using neurostimulation techniques).

An early analysis is presented for autism spectrum disorders (ASDs), as there has been a specific 3-year program [472] funded by the European Parliament, entitled 'Autism Spectrum Disorders' in Europe (ASDEU), devoted to "to research autism prevalence, costs, diagnosis, and interventions throughout Europe. Its overall aim was to find ways to improve care and support for people with the condition and their families". Their goals included "Review autism policies in all European countries and come up with recommendations for an EU public health plan to support member states to respond to the needs of autistic people and their families".

#### AUTISM SPECTRUM DISORDERS

People with ASDs usually present difficulties to interpersonal communication using 'common channels and codes' (speech, non-verbal language, social skills), -in varying degrees, together with significant, mostly unexplored, features for diverse thinking, such as being detail-oriented and pattern-thinkers.

Their many challenges for communication and 'cultural-fit' -currently even considered as 'incapacitants' by some social sectors- can be overcome with the help of available AI-mediated systems, from 'keyboard-type' to VR environments -and, perhaps, with other types of brain-computer interfaces-. AI-based tools can help uncover the potential of persons with ASDs for a variety of much-needed (and valued) tasks (e.g., software design, cybersecurity).

Results of the ASDEU research showed that "overall ASD prevalence estimates varied among European countries, from 4.4 - 19.7 per 1,000 aged 7-9 years", with an average of 12.2 per 1,000 (one in 89) children aged 7-9 years. In comparison, the incidence of autism in the United States is 1 in 34 among boys and 1 in 144 among girls [294], with an average of 1 in 54 children aged 8 years.

The ASDEU study also showed a large health and economic burden, and included the following recommendations for policymakers:

- Encourage member states to adopt cross-sectoral national strategies or action plans to respond to the needs of autistic people, in line with the United Nations Convention on the Rights of Persons with Disabilities and international recommendations.
- Promote coordination between member states of all policies related to autism.
- Produce guidelines to harmonize practices and promote quality of support and care across Europe.
- Adopt principles of best practice and foster exchange between member states.
- Promote training of professionals across sectors.
- Support research, networks of experts and partnering for progress.

Notably, the executive summary of this project does not include any mention to the possibilities for inclusion provided by AI-mediated tools identified in this report. This can be explained as those possibilities have started to be explored very recently (after the end of the ADEUS program), as linked to the latest advances in neurotechnology.

AI-mediated technologies for persons with ASD is a novel concept and a clear example of multidisciplinary overlapping of AI, medicine, engineering, and social development, with definite ethical dimensions and very positive consequences.

The proposed approach of AI-mediated inclusion also presents a clear interest (not studied) for including persons with other types of cognitive or psychological disorders, and even mental health issues. The on-going development of new types of brain-computer interfaces would provide increasingly better technological tools to improve and expand the described inclusion.

#### TECHNOLOGY ASSESSMENT

According to the topic content in references, the Use-Case 5 (AI-mediated inclusion of neurodiversity) can be evaluated as detailed in **Table 8**.

Table 8. Technology assessment of 'Use-Case 5: AI-mediated inclusion of neurodiversity'. Values in arbitrary units.

Feature	Scale	Value
Maturity	Technology Readiness Level (TRL)	1
Availability	Technology Availability Level (TAL)	2
Controversy	Technology Controversy Level (TCL)	-3
Sustainability	Technology Sustainability Level (TSL) for SDG 3	1
	Technology Sustainability Level (TSL) for all SDGs	0.3
Extent of Adoption	Technology Extent Level (TEL)	0

Overall, from a social and ethical perspective, the assessment of this Use-Case 5 is clearly positive, and an example of a topic to be fostered and supported for the benefit of persons and social wellbeing, including future generations.

# 5 Conclusions

# 5.1 Discussion

Artificial Intelligence, scientific medical research, human rights and policy are closely interrelated, particularly in the realms of Medicine, Healthcare and Wellbeing. In the rapidly evolving world of today, under the recent historical circumstances, there is a need for an effective approach in the EU and worldwide to new challenges, leading the advancement of science and technology while protecting society and democracy, and paving the way for sustainable progress for the future generations.

We discuss here some challenges aiming to highlight the key expanding areas related to the analyzed topics and translate their scientific and technical narrative into practical approaches for the benefit of the persons. As indicated, this reports expands on previous work. Although there has been significant progress in the challenges proposed in that document, they remain valid as well, and are hereby also referred to for consultation.

Promote One Health and prevent AI-mediated biological threats to society

Biological threats define a major source of concern for European and international institutions. The COVID-19 pandemic has shown the devastating consequences for health, society, and economy of the uncontrolled propagation of an unknown virus (the SARS-CoV-2), for which there was no vaccine or treatment. As demonstrated by its rapid worldwide spread, pathogens may easily propagate among humans across geographical regions, as there are no effective detection procedures suitable for non-invasive, traveler-respectful implementation of health screening of persons at border controls. Population migrations and settings under limited health and sanitary conditions, exacerbated by extreme weather phenomena and climate change, present additional risks for the emergence of human and zoonotic viruses, bacteria, and other infectious organisms. In striking contrast, in the EU and in most other countries, there are remarkably effective procedures and regulations to protect flora and fauna from possible infectious agents entering through borders and prevent the spread of diseases in animals and plants.

In addition, it has been recently shown how certain AI tools can be (relatively) easily combined with gene editing technologies to generate new pathogens, even tailored to specific features or organisms (e.g., genetically modified crops and, potentially, of human groups), with a strong prospective for weaponization and use for bioterrorism.

A different -yet clearly related- area of concern refers to the applications of gene editing for human augmentation. There even exist certain groups who advocate for 'self-experimentation medicine' and 'do-it-yourself' gene 'therapies', purposedly aimed to enhance human performance. This 'science fiction' idea was demonstrated as real by the 'successful' -yet extremely questionable- experiment which led to the birth -in China, 2018- of the first two humans with engineered germline modifications (edited genes) which may be transmitted to future generations, with unknown effects.

The protection of society -including future generations- against existing and new, natural or engineered, accidentally leaked or deliberately delivered, biological threats is a definite institutional priority. Notably, the EU launched the Health Emergency Response Authority in 2022. AI tools present a clearly dual perspective in this field: on one side, technologies for strongly controversial applications (e.g., human augmentation, germline editing) or for directly malicious use (i.e., development of potential agents for bioterrorism) could be restricted from generalized availability and subjected to controls for access and use similar to those implemented for radioactive materials, with a clearly defined precautionary approach. On the other side, those AI tools useful to detect and fight risks, undertaking existing challenges in epidemiology, health monitoring and border control could be institutionally fostered to take advantage of their potential.

*Leverage the potential of AI to help in mental health care* 

Mental health issues constitute a dramatic health and social problem in Europe, particularly important in children and adolescents, as a major cause of death and long-term suffering for people and families. These negative effects will be very likely boosted by the consequences of the COVID-19 pandemic and the war in Ukraine. In the wake of the COVID-19, AI-mediated tools have rapidly expanded from conversational chatbots and 'emotional support' (e.g., reducing the psychological impact of isolation) to supposedly 'diagnostic' and 'therapy' online platforms. Their easy access and availability offer potential advantages for many users, including those in resource-limited settings or in conflict zones. However, as identified in this report, AI-mediated tools in the context of mental health issues also pose clear challenges about 'the contents' that may be transmitted to users, particularly to most vulnerable groups (e.g., children, sick people, the elderly), digital health scammers and even the risk of 'psychological hacking'. The use of AI tools in mental health care offers a clear opportunity of help, while calling for further analysis of the most questionable issues. A coordinated technical and regulatory approach by public institutions and professional stakeholders could make a successful contribution addressing a dramatic European (and worldwide) health and social problem.

Enhance health data protection for scenarios of conflict

In view of the complex geopolitical situation in different areas of the world, particularly in the western border of the EU, it may be of interest to prepare two common 'emergency preparedness mechanisms', available at the national level, for

- health data backup (even in another country), suitable for a 'rebuild from nothing' scenario, and
- emergency blockage of access to -and remote disabling of- databases with health (biometric, genetic) data of the population and with identification data of healthcare workers, to avoid uncontrolled use of genetic information of individuals, and to protect the identities of the clinical personnel.

These mechanisms would be activated by any EU nation that may suddenly find itself in a scenario of 'extensive damage' or 'total destruction', e.g., due to extreme weather or geological events, or war. This 'emergency preparedness strategy' would take advantage of the inter-related structures and procedures - including regulatory processes- within the EU, and of its geographical extension.

Implement a dynamic assessment of the social impact of technology and its perception

AI-mediated technologies for medicine, healthcare and wellbeing could be subjected to an 'ethical and social assessment' beyond currently required technical requisites (e.g., for CE mark). This additional analysis would be partially inspired by the Ethical Appraisal of European Research Council projects and integrated with existing regulatory processes, including -as described- the evaluation of 'controversy' -and 'potential of harm', including for future generations- and sustainability. This evaluation should particularly try to avoid such unwanted effects as bias (based on demographic, ethnical or clinical, health-related features) and unfairness.

Citizens should be engaged with science and technology to contribute to and take decisions related to their own well-being. There is a need of outreach programs for 'informed debate' to enhance policy and governance to develop a secure, sustainable advancement of AI technology for the benefit of the current European society and of future generations The proposed implementation of the social assessment of technologies should be carried out fostering public-private mutual responsibility and partnership. It is important to highlight that new regulatory updates should not suppose -nor be perceived as- additional, complex, dis-encouraging bureaucracy to difficult the advancement of science and technology, but, on the opposite, a set of reliable and trustful procedures that fosters innovation while protecting citizens from risks - including some unknown but potentially expected- and transmit to society that products and devices that enter the EU market have being responsibly and sustainably developed.

Defining a precautionary approach for R&D in sensitive areas such as the decoding of cognitive brain signals As proposed in the JRC Report published in 2020 [5], a 'precautionary approach' should be employed in those areas of AI and AI-mediated applications with higher risks of unknown, potentially damaging consequences (e.g., modifying germlines or creating new forms of life) or conflict with human rights. Within the latter realm, research and development of neurotechnologies related to reading, decoding and manipulation of cognitive brain signals defines a particularly defying area.

Foster institutional and international collaboration

The availability and dissemination of reliable, trustworthy information constitute essential factors to implement successful policies for the welfare of people and society, in daily life and, particularly, in times of crises and extraordinary circumstances, when citizens turn to their leaders for orientation and guidance.

As highlighted by the COVID-19 pandemic, AI-mediated tools can effectively help in the design, management, and monitoring of public health strategies, and in the dissemination of appropriate recommendations and data. New applications, devices and platforms have opened the way to challenging advances that share concepts from Artificial Intelligence, Medicine, Healthcare and Wellbeing. However, simultaneously, it has also been experienced how those technologies can be employed to promote and disseminate false and misleading information leading to serious health damage -even deaths- and deep social unrest.

Several European and international institutions conduct studies on different -yet definitely complementaryaspects of Artificial Intelligence in Medicine, Healthcare and Wellbeing. While JRC Reports focus on science advances and technological updates with a social perspective, other entities aim at the protection of society, legal issues, and governance, in a rapidly evolving, truly multidisciplinary scenario. New areas arise as those topics relate to -and are modified by- health monitoring at borders, migrations, the effects of climate change and conflicts -as unfortunately shown by the war in Ukraine-, uncontrolled research in neurotechnologies, human gene editing -with unknown potential effects on future generations- and malicious uses of AImediated health technologies for bioterrorism.

The President of the European Commission in (September 8, 2021) declared that "early and better information about trends [in global challenges, ... digital transformations, ..., external and internal interferences] will help us tackle such important issues in time and steer our Union in a positive direction".

Enhanced collaboration among stakeholders would substantially the visibility and impact of their respective contribution, with the common goal of providing policy makers -and society- with most advanced trustworthy information and resources to lead the way and promote and educated citizen debate on the most challenging topics.

Promote trustworthy information and an educated citizen debate

Lessons from the COVID-19 show the importance of trustworthy information about major health issues, and the damaging consequences of the spread of 'excessive, false, and misleading information', i.e., of an associated 'information epidemic' or 'infodemic', particularly in a highly digitally connected society as in Europe.

New challenges for public health may be expected to come in the relatively near future from well-known but 'difficult' areas in term of their social impact (e.g., cancer, mental health) but, particularly, from controversial new fields in which 'flashy' developments may suddenly happen. The latter ones include gene editing for human augmentation -including self-experimentation medicine-, neurotechnologies -with the potential of 'mind reading and manipulation'- and the (accidental or deliberate) propagation of novel (natural or engineered) pathogens.

Al-mediated tools play a significant role both in the spread of infodemics and in the identification and neutralization of malicious content. They should be fostered to promote the protection of society -particularly, most vulnerable groups- against the effects of pernicious information (e.g., to avoid rejecting public health measurements) while allowing for educated citizen debate, i.e., what is to be funded by taxpayers, and how to protect future generations without hindering advances.

Recent documents on the subject by international stakeholders (e.g., WHO Policy Briefs) should be integrated with European studies (e.g., JRC Reports and surveys by the European Parliament and the Council of Europe), for effective implementation in the EU.

Towards the technological sovereignty of the European Union

In the evolving international scenario, it has become clear that 'technological sovereignty' is major goal for the EU, as the energy crisis in the context of the war in Ukraine has shown how the dependence of other actors in strategic sectors may severely limit -even damage- the ability for decisions and the progress of society. Definite actions should be implemented to retain European talent -particularly, young- and to foster the competitiveness of EU institutions and companies, scientists, and other (e.g., regulatory) stakeholders.

## 5.2 Summary of contributions

This reports provides a detailed state of the art of the current and near-future applications of Artificial Intelligence in Medicine, Healthcare and Wellbeing, particularly focused on their impact on people's physical and mental health and in societal and environmental welfare, including future generations. It builds on and updates a previous analysis published in 2020.

Unexpectedly, this study is carried out under the extraordinary, historical circumstances of the COVID-19 pandemic and the war in Ukraine, with their staggering toll of victims, deaths, and migrations in Europe and worldwide, and their subsequent effects in the health and life of persons, and in all areas of society, industry, and economy.

In addition, there have been initial reports of the first documented use of an autonomous system to kill humans, and of the first steps in the creation of hybrid life forms ('xenobots').

From this review, the report identifies four key expanding areas of Artificial Intelligence applications in Medicine, Healthcare and Wellbeing in the near-future with particular significance in terms of their potential benefits and risks, and on how they may change human behavior and affect basic rights, even for future generations. They comprise AI tools for mental health, AI-mediated gene editing, AI tools for epidemiology and health data monitoring, and AI-mediated neurotechnologies.

Other expanding fields refer to the social interests of AI-mediated inclusion of neurodiversity, and to the technological developments in AI-mediated drug discovery and personalized medicine.

The analysis proposes a methodology and metrics for the assessment of the social impact of technologies, considering their maturity, availability, controversy, and sustainability, together with an integrated overview. It identifies novel AI-mediated challenges of very serious concern related to the protection of societies against biological threats –potentially even affecting future generations-, and links them to the recently updated priorities and proposed responses highlighted by the European Union, the United Nations, and the World Health Organization.

From this discussion, it is formulated a set of policy insights in terms of challenges and recommendations towards an effective European leadership and technological sovereignty in this sector.

# References

Examples of references, presented according to the rules of the *Interinstitutional style guide* (<u>http://publications.europa.eu/code/en/en-250904.htm</u>)

- "Artificial intelligence for Europe". European Economic and Social Committee. https://www.eesc.europa.eu/en/our-work/opinions-information-reports/opinions/artificial-intelligenceeurope-communication (accessed Sep. 09, 2022).
- [2] "Coordinated Plan on Artificial Intelligence," JRC Science Hub Communities. https://ec.europa.eu/jrc/communities/en/community/digitranscope/document/coordinated-plan-artificialintelligence-com2018-795-final (accessed Sep. 09, 2022).
- [3] "Ethics guidelines for trustworthy AI: Shaping Europe's digital future." https://digitalstrategy.ec.europa.eu/en/library/ethics-guidelines-trustworthy-ai (accessed Sep. 09, 2022).
- [4] "On Artificial Intelligence-A European approach to excellence and trust White Paper on Artificial Intelligence A European approach to excellence and trust," Eur. Comm., 2022, [Online]. Available: https://ec.europa.eu/commission/sites/beta-political/files/political-guidelines-next-commission\_en.pdf.
- [5] E Gómez-González; E Gómez-Gutiérrez, Artificial Intelligence in Medicine and Healthcare: applications, availability and societal impact. JRC Science for Policy Report (EUR 30197 EN), European Commission, 2020.
- [6] E Gómez-González; E Gómez-Gutierrez, Artificial Intelligence and Digital Transformation : early lessons from the COVID-19 crisis. JRC Science for Policy Report (EUR 30306 EN), European Commission, 2020.
- [7] E Gómez-González; E Gómez-Gutierrez, The Role of Digital Technology in Health and Long-term Care Sectors. In Health and long-term care workforce: demographic challenges and the potential contribution of migration and digital technology. JRC Science for Policy Report (EUR 30197 EN). European Commission 2020.
- [8] E Gómez-González; E Gómez-Gutierrez, AI Watch AI Uptake in Health and Healthcare , 2020. JRC Science Policy Report (EUR 30478 EN), European Commission, 2020.
- [9] D Nepelski (ed.). "How can Europe become a global leader in AI in health?," JRC Sci. Policy Briefs, European Commission, 2021.
- [10] B. Marr, "The Key Definitions Of Artificial Intelligence (AI) That Explain Its Importance," Forbes, 2018. https://www.forbes.com/sites/bernardmarr/2018/02/14/the-key-definitions-of-artificial-intelligence-ai-that-explain-its-importance/?sh=309e849e4f5d (accessed Sep. 29, 2022).
- [11] "Cambridge Dictionary," Cambridge University Press, 2019. https://dictionary.cambridge.org/ (accessed Sep. 29, 2022).
- [12] "Proposed Regulatory Framework for Modifications to Artificial Intelligence/Machine Learning (AI/ML)-Based Software as a Medical Device (SaMD)," FDA, 2019, Accessed: Sep. 29, 2022. [Online]. Available: <u>https://www.fda.gov/downloads/medicaldevices/deviceregulationandguidance/guidancedocuments/ucm51</u> <u>4737.pdf</u>.
- [13] K. Hammond, "What is artificial intelligence?," Computer World, 2015. <u>https://www.computerworld.com/article/2906336/what-is-artificial-intelligence.html</u> (accessed Sep. 29, 2022).
- [14] "Proposed Regulatory Framework for Modifications to Artificial Intelligence/Machine Learning (AI/ML)-Based Software as a Medical Device (SaMD)," FDA, 2019. https://www.fda.gov/medical-devices/softwaremedical-device-samd/artificial-intelligence-and-machine-learning-software-medical-device (accessed Jul. 25, 2019).
- [15] M. C. Anthony, "An introduction to non-traditional security studies : a transnational approach," p. 276.
- [16] "UK Newspapers Online and Worldwide Newspapers in English." https://www.thebigproject.co.uk/news/#.YzRrFXZBwaY (accessed Sep. 29, 2022).
- [17] "Europe: the latest coronavirus counts, charts and maps." https://graphics.reuters.com/worldcoronavirus-tracker-and-maps/regions/europe/ (accessed Sep. 12, 2022).

- [18] "Situation Ukraine Refugee Situation," Operational Data Portal Ukraine Refugee Situation. https://data.unhcr.org/en/situations/ukraine/location?secret=unhcrrestricted (accessed Sep. 12, 2022).
- [19] L Majumdar Roy Choudhury et al. Letter dated 8 March 2021 from the Panel of Experts on Libya established pursuant to resolution 1973 (2011) addressed to the President of the Security Council. United Nations Security Council, 2021. <u>https://documents-ddsny.un.org/doc/UNDOC/GEN/N21/037/72/PDF/N2103772.pdf?OpenElement</u>.
- [20] J. Dawes, "UN fails to agree on 'killer robot' ban as nations pour billions into autonomous weapons research," The Conversation, 2021. https://theconversation.com/un-fails-to-agree-on-killer-robot-ban-as-nations-pour-billions-into-autonomous-weapons-research-173616 (accessed Sep. 29, 2022).
- [21] C. Linder, "Living Robots Built from Frog Cells Stem Cells," Popular Mechanics. https://www.popularmechanics.com/technology/robots/a30514544/xenobot-programmable-organism/ (accessed Jul. 25, 2022).
- [22] S. Kriegman, D. Blackiston, M. Levin, and J. Bongard, "A scalable pipeline for designing reconfigurable organisms," Proc. Natl. Acad. Sci. U. S. A., vol. 117, no. 4, pp. 1853–1859, Jan. 2020, doi: 10.1073/pnas.1910837117.
- [23] W. D. Heaven, "AI is learning how to create itself," MIT Technology Review. https://www.technologyreview.com/2021/05/27/1025453/artificial-intelligence-learning-create-itselfagi/?utm\_source=engagement\_email&utm\_medium=email&utm\_campaign=site\_visitor.unpaid.engageme nt&utm\_term=ai.most.read21&utm\_content=12.15.21.non-subs&mc\_cid=2 (accessed Aug. 03, 2022).
- [24] K. J. Wu, "Scientists Assemble Frog Stem Cells Into First 'Living Machines'", Smithsonian, 2020. https://www.smithsonianmag.com/innovation/scientists-assemble-frog-stem-cells-first-living-machines-180973947/ (accessed Sep. 29, 2022).
- [25] M. A. Makary and M. Daniel, "Medical error—the third leading cause of death in the US," BMJ, vol. 353, May 2016, doi: 10.1136/BMJ.I2139.
- [26] "Fatality facts 2020. State by state," IIHS. https://www.iihs.org/topics/fatality-statistics/detail/stateby-state (accessed Sep. 30, 2022).
- [27] "Speech by President von der Leyen at the World Health Summit", European Commission. https://ec.europa.eu/commission/presscorner/detail/en/speech\_21\_5521 (accessed Aug. 04, 2022).
- [28] "Health Emergency Preparedness and Response Authority", European Commission. https://ec.europa.eu/info/departments/health-emergency-preparedness-and-response-authority\_en (accessed Sep. 08, 2022).
- [29] General Assembly, "Seventy-fifth session Agenda item 128 (a) Strengthening of the United Nations system: strengthening of the United Nations system Our Common Agenda Report of the Secretary-General," 2021.
- [30] I. Tzinis, "Technology Readiness Level," NASA. https://www.nasa.gov/directorates/heo/scan/engineering/technology/technology\_readiness\_level (accessed Sep. 08, 2022).
- [31] "Technology readiness level (TRL)," EURAXESS. https://cdn1.euraxess.org/careerdevelopment/researchers/manual-scientific-entrepreneurship/major-steps/trl (accessed Sep. 08, 2022).
- [32] "Universal Declaration of Human Rights," United Nations. https://www.ohchr.org/en/human-rights/universal-declaration/translations/english (accessed Sep. 08, 2022).
- [33] "Human Rights Indicators: A Guide for Measurement and Implementation," United Nations. https://www.ohchr.org/en/publications/policy-and-methodological-publications/human-rights-indicatorsguide-measurement-and (accessed Sep. 08, 2022).
- [34] "Vulnerable Groups," United Nations. https://www.un.org/en/fight-racism/vulnerable-groups (accessed Sep. 08, 2022).
- [35] "Sustainable Development Goals," United Nations Development Programme. https://www.undp.org/sustainable-development-goals (accessed Sep. 08, 2022).
- [36] "Algorithmic impact assessment: a case study in healthcare," Ada Lovelace Inst., no. September, pp. 169–232, 2022, [Online]. Available: www.impact-test.co.uk.

- [37] R. Binns, "Algorithmic Accountability and Public Reason," Philos. Technol., vol. 31, no. 4, pp. 543–556, 2018, doi: 10.1007/513347-017-0263-5.
- [38] Z Kallenborn. "Giving an AI control of nuclear weapons: What could possibly go wrong?". The Bulletin of Atomic Scientists, 2022.
- [39] K. D. Atherton, "Russia's research with the Marker robot, explained", Popular Science. https://www.popsci.com/technology/russia-completes-research-on-marker-robot/ (accessed Aug. 04, 2022).
- [40] A. Holland Michel, Known Unkowns: Data Issues and Military Autonomous Systems. United Nations Institute For Disarmament Research (UNIDIR), 2021.
- [41] K. D. Atherton, "How do you make AI trustworthy? Here's the Pentagon's plan," Popular Science, 2021. https://www.popsci.com/technology/dod-ai-trust/ (accessed Oct. 26, 2021).
- [42] Michael Moran, "Killer AI drones 'hunted down humans without being told to' warns bombshell UN report," Daily Star, 2021. https://www.dailystar.co.uk/news/world- news/killer-ai-drones-hunted-down-24203431.
- [43] K. D. Atherton, "Autonomous war machines could make costly mistakes on future battlefields," Popular Science, 2021. https://www.popsci.com/technology/autonomous-machines-mistakes-un-institutereport/ (accessed Oct. 26, 2021).
- [44] C. Linder, "Why It's So Hard For the Human Brain to Multitask", Popular Mechanics. https://www.popularmechanics.com/science/a38349973/conscious-brain-multitasking/ (accessed Aug. 03, 2022).
- [45] A. Shapson-Coe et al. A connectomic study of a petascale fragment of human cerebral cortex. bioArxiv, 2021. https://www.biorxiv.org/content/10.1101/2021.05.29.446289v1
- [46] M. Eisenstein, "Closing in on a complete human genome", Nature, vol. 590, no. 7847, pp. 679–681, Feb. 2021, doi: 10.1038/D41586-021-00462-9.
- [47] G. A. Fowler, "You agreed to what? Doctor check-in software harvests your health data", The Washington Post, 2022. <u>https://www.washingtonpost.com/technology/2022/06/13/health-privacy/</u>.
- [48] E. Nakashima, "U.S. officials caution companies about risks of working with Chinese entities in AI and biotech", The Washington Post, 2021. https://www.washingtonpost.com/national-security/us-officials-caution-companies-about-risks-of-working-with-chinese-entities-in-ai-and-biotech/2021/10/21/d8e8e300-32c1-11ec-9241-aad8e48f01ff\_story.html (accessed Oct. 26, 2021).
- [49] "DeepMind faces legal action over NHS data use", BBC, 2021. https://www.bbc.com/news/technology-58761324.
- [50] A. Rana, "U.S., EU advance talks to protect data transfers," Reuters, 2021. https://www.reuters.com/technology/us-eu-advance-talks-protect-data-transfers-wsj-2021-09-10/.
- [51] J. E. Barnes, "U.S. Warns of Efforts by China to Collect Genetic Data", The New York Times, 2021. https://www.nytimes.com/2021/10/22/us/politics/china-genetic-data-collection.html (accessed Oct. 26, 2021).
- [52] Scott Pink, "What China's new data privacy law means for US tech firms", TechCrunch, 2021. https://techcrunch.com/2021/09/09/what-chinas-new-data-privacy-law-means-for-us-tech-firms/ (accessed Oct. 26, 2021).
- [53] "The next biotech superpower", Nat. Biotechnol. 2019 3711, vol. 37, no. 11, pp. 1243–1243, Nov. 2019, doi: 10.1038/s41587-019-0316-7.
- [54] R. Kumar, "Can Afghanistan's underground 'sneakernet' survive the Taliban?," MIT Technology Review. https://www.technologyreview.com/2021/11/26/1040459/afghanistan-sneakernet-content-dealers-karstaliban/?utm\_source=engagement\_email&utm\_medium=email&utm\_campaign=site\_visitor.unpaid.engag ement&utm\_content=01.09.22.non-subs&mc\_cid=2c592ba67f&mc\_eid=77848f (accessed Aug. 05, 2022).
- [55] E. Guo and H. Noori, "This is the real story of the Afghan biometric databases abandoned to the Taliban", MIT Technology Review. https://www.technologyreview.com/2021/08/30/1033941/afghanistan-biometric-databases-us-military-40-data-points/ (accessed Aug. 03, 2022).

- [56] "The Taliban reportedly have control of US biometric devices a lesson in life-and-death consequences of data privacy", The Conversation. https://theconversation.com/the-taliban-reportedlyhave-control-of-us-biometric-devices-a-lesson-in-life-and-death-consequences-of-data-privacy-166465 (accessed Aug. 03, 2022).
- [57] J. Lynch, "From Fingerprints to DNA: Biometric Data Collection in U.S. Immigrant Communities and Beyond", SSRN Electron. J., Aug. 2012, doi: 10.2139/SSRN.2134481.
- [58] M. Hu, "Biometric Cyberintelligence and the Posse Comitatus Act", SSRN Electron. J., Dec. 2016, doi: 10.2139/SSRN.2886575.
- [59] C. Vallance, "Afghanistan: Will fingerprint data point Taliban to targets?", BBC News. https://www.bbc.com/news/technology-58245121 (accessed Aug. 03, 2022).
- [60] I. C. Campbell, "The Taliban may have seized biometric data that can ID US allies in Afghanistan", The Verge. https://www.theverge.com/2021/8/18/22630686/biometric-data-afghanistan-taliban-hiide-civilians (accessed Aug. 03, 2022).
- [61] S. Clement, "Biological threats: technological progress and the spectre of bioterrorism in the postcovid-19 era", NATO Science and Technology Committee, 2021.
- [62] M. Knutzen, "Synthetic Bioweapons Are Coming", U.S. Naval Institute. https://www.usni.org/magazines/proceedings/2021/june/synthetic-bioweapons-are-coming (accessed Aug. 05, 2022).
- [63] "Speech by President von der Leyen at the World Health Summit", https://ec.europa.eu/commission/presscorner/detail/en/speech\_21\_5521 (accessed Aug. 04, 2022).
- [64] United Nations, "Our Common Agenda. Report of the Secretary-General", vol. 10748, no. August, 2021.
- [65] "Bioterrorism", Interpol. https://www.interpol.int/Crimes/Terrorism/Bioterrorism (accessed Sep. 08, 2022).
- [66] Europol, European Union Terrorism Situation and trend report. Luxembourg: Publications Office of the European Union, 2021.
- [67] "COVID-19 and future pandemics: the spectre of bioterrorism", UNICRI, 2020. https://unicri.it/sites/default/files/2020-07/Concept Note\_Webinar\_COVID-19\_and\_future\_pandemics\_the\_spectre\_of\_bioterrorism.pdf (accessed Sep. 08, 2022).
- [68] A. Townsend-Drake, D. Harvin, and C. Sellwood, "Bioterrorism: Applying the Lens of COVID-19-Report 2021", Count. Terror. Prep. Netw., 2021.
- [69] S. Clement, "Biological Threats: Technological progress and the spectre of bioterrorism in the post-COVID-19 era", Sci. Technol. Comm., 2021.
- [70] J.-M. Rickli and M. Ienca, "The Security and Military Implications of Neurotechnology and Artificial Intelligence," pp. 197–214, 2021, doi: 10.1007/978-3-030-64590-8\_15.
- [71] L. Howes, "A toxic twist on AI for drug design", Chemical and Engineering News. https://cen.acs.org/policy/chemical-weapons/toxic-twist-AI-drug-design/100/i17 (accessed Aug. 08, 2022).
- [72] Laura Howes, "Confronting AI's toxic potential", C&EN Glob. Enterp., vol. 100, no. 17, pp. 19–21, May 2022, doi: 10.1021/CEN-10017-FEATURE2.
- [73] F. Urbina, F. Lentzos, C. Invernizzi, and S. Ekins, "Dual use of artificial-intelligence-powered drug discovery", vol. 4, no. 3, pp. 189–191, Mar. 2022, Accessed: Jul. 22, 2022. [Online]. Available: https://www.nature.com/articles/s42256-022-00465-9.
- [74] S. Costanzi, C. K. Slavick, J. M. Abides, G. D. Koblentz, M. Vecellio, and R. T. Cupitt, "Supporting the fight against the proliferation of chemical weapons through cheminformatics", Pure Appl. Chem., 2022, doi: 10.1515/PAC-2021-1107.
- [75] "How to tweak drug-design software to create chemical weapons", The Economist. https://www.economist.com/science-and-technology/how-to-tweak-drug-design-software-to-createchemical-weapons/21808200 (accessed Aug. 08, 2022).

- [76] R. B. Raffa et al., "Commentary: Unexpected Novel Chemical Weapon Agents Designed by Innocuous Drug-Development AI (Artificial Intelligence) Algorithm," Pharmacol. & amp; Pharm., vol. 13, no. 7, pp. 225–229, Jul. 2022, doi: 10.4236/PP.2022.137018.
- [77] "AI Drug Discovery Systems Might Be Repurposed to Make Chemical Weapons, Researchers Warn", https://www.scientificamerican.com/article/ai-drug-discovery-systems-might-be-repurposed-to-makechemical-weapons-researchers-warn/ (accessed Aug. 08, 2022).
- [78] P. Pawlak, "Understanding Hybrid Threats," a glance, no. June, 2015, [Online]. Available: https://www.europarl.europa.eu/RegData/etudes/ATAG/2015/564355/EPRS\_ATA(2015)564355\_EN.pdf
- [79] "What is NATO doing to address hybrid threats?," North Atlantic Treaty Organization, Apr. 21, 2021. https://www.nato.int/cps/en/natohq/news\_183004.htm (accessed Sep. 15, 2022).
- [80] "Mid-Decade Challenges to National Competitiveness", SCSP, 2022.
- [81] A. Miller, "Bioweapons Designed by AI: a 'Very Near-Term Concern,' Schmidt Says", Air & Space Forces Magazine, 2022. https://www.airandspaceforces.com/bioweapons-designed-by-ai-a-very-near-termconcern-schmidt-says/?utm\_source=feedly&utm\_medium=rss&utm\_campaign=bioweapons-designed-byai-a-very-near-term-concern-schmidt-says (accessed Sep. 15, 2022).
- [82] Harikesh, P.C., Yang, CY., Tu, D. et al. Organic electrochemical neurons and synapses with ion mediated spiking. Nat Commun 13, 901 (2022). https://doi.org/10.1038/s41467-022-28483-6
- [83] X. Ji et al., "Mimicking associative learning using an ion-trapping non-volatile synaptic organic electrochemical transistor", Nat. Commun., vol. 12, no. 1, pp. 1–12, 2021, doi: 10.1038/s41467-021-22680-5.
- [84] S. Dimitropoulos, "Dyson Sphere could resurrect humans back from the dead, researches says," Popular Mechanics. https://www.popularmechanics.com/science/a35788050/dyson-sphere-digitalresurrection-immortality/ (accessed Jun. 27, 2022).
- [85] C. Feehly, Can minds persist when they are cut off from the world?, Live Science, 2022. https://www.livescience.com/can-brain-survive-in-vat
- [86] T. Bayne, A. K. Seth, and M. Massimini, "From Complexity to Consciousness", Trends Neurosci., vol. 43, no. 8, pp. 546–547, Aug. 2020, doi: 10.1016/J.TINS.2020.05.008.
- [87] Advancing the Science and Technology of Memory, <u>https://nectome.com</u>.
- [88] S. Zeitchik, "Is artificial intelligence about to transform the mammogram?", The Washington Post. https://www.washingtonpost.com/technology/2021/12/21/mammogram-artificial-intelligence-cancerprediction/ (accessed Jun. 27, 2022).
- [89] A. Yala et al., "Multi-Institutional Validation of a Mammography-Based Breast Cancer Risk Model," J. Clin. Oncol., vol. 40, no. 16, pp. 1732–1740, Jun. 2022, doi: 10.1200/JC0.21.01337.
- [90] Our management of genetic information, your patients' answers. https://healthincode.com/en/.
- [91] P. J. Ballester and J. Carmona, "Artificial intelligence for the next generation of precision oncology", NPJ Precis. Oncol., vol. 5, no. 1, 2021, doi: 10.1038/s41698-021-00216-w.
- [92] K. BH, H. A, and A. HJWL, "Artificial intelligence for clinical oncology", Cancer Cell, vol. 39, no. 7, pp. 916–927, Jul. 2021, doi: 10.1016/J.CCELL.2021.04.002.
- [93] Diaz-Pinto, A., Ravikumar, N., Attar, R. et al. Predicting myocardial infarction through retinal scans and minimal personal information. Nat Mach Intell 4, 55–61 (2022). https://doi.org/10.1038/s42256-021-00427-7.
- [94] A. Diaz-Pinto et al., "Predicting myocardial infarction through retinal scans and minimal personal information", Nat. Mach. Intell., vol. 4, no. 1, pp. 55–61, Jan. 2022, doi: 10.1038/S42256-021-00427-7.
- [95] J. Hall, "AI Assessment of PET/CT May Hold 'Major Promise' for Predicting Heart Attack Risk", Diagnostic Imaging. https://www.diagnosticimaging.com/view/ai-assessment-of-pet-ct-may-hold-majorpromise-for-predicting-heart-attack-risk (accessed Aug. 04, 2022).
- [96] E. Beede et al., "A Human-Centered Evaluation of a Deep Learning System Deployed in Clinics for the Detection of Diabetic Retinopathy", Conf. Hum. Factors Comput. Syst. - Proc., 2020, doi: 10.1145/3313831.3376718.

- [97] C. J. Kelly, A. Karthikesalingam, M. Suleyman, G. Corrado, and D. King, "Key challenges for delivering clinical impact with artificial intelligence", BMC Med., vol. 17, no. 1, Oct. 2019, doi: 10.1186/S12916-019-1426-2.
- [98] K Lekadir et al. Artificial intelligence in healthcare Applications, risks, and ethical and societal impacts. European Parliamentary Research Service, Scientific Foresight Unit (STOA), 2022. https://www.europarl.europa.eu/RegData/etudes/STUD/2022/729512/EPRS\_STU(2022)729512\_EN.pdf
- [99] Towards the Development of guidance on ethics and governance of artificial intelligence for health, no. October. World Health Organization, 2019.
- [100] M. Vestager, "Europe fit for the Digital Age: Commission proposes new rules and actions for excellence and trust in Artificial Intelligence", Eur. Comm., no. April, pp. 1–8, 2021.
- [101] C. Cagnin, S. Muench, F. Scapolo, E. Störmer, and L. Vesnic-Alujevic, Shaping and securing the EU's open strategic autonomy by 2040 and beyond. Luxembourg: Publications Office of the European Union, 2021.
- [102] N. Wallace, "Europe plans to strictly regulate high-risk AI technology", Science, 2020. https://www.science.org/content/article/europe-plans-strictly-regulate-high-risk-ai-technology (accessed Oct. 27, 2021).
- [103] EIT Health and McKinsey & Company, "Transforming healthcare with AI. The impact on the workforce and organizations", 2020.
- [104] P.-H. C. Chen, C. H. Mermel, and Y. Liu, "Evaluation of artificial intelligence on a reference standard based on subjective interpretation", Lancet Digit. Heal., no. C, pp. 693–695, 2021, doi: 10.1016/s2589-7500(21)00216-8.
- [105] S. Lynch, "State of Al in 10 Charts", Stanford University. https://hai.stanford.edu/news/state-ai-10charts (accessed Aug. 05, 2022).
- [106] S. R. Arnstein, "A Ladder of Citizen Participation", J. Am. Plan. Assoc., vol. 85, no. 1, pp. 24–34, 2019, doi: 10.1080/01944363.2018.1559388.
- [107] M. L. Paul, "People are paying thousands to clone their pets with ViaGen Pets", The Washington Post. https://www.washingtonpost.com/nation/2022/04/11/clone-pets-cat-science/ (accessed Aug. 04, 2022).
- [108] M. Gomez Ruiz, "Present and future of robotic surgery", Ann. Mediterr. Surg., vol. 2, no. 1, pp. 1–2, 2019, doi: 10.22307/2603.8706.2019.01.001.
- [109] L. Wynants et al., "Prediction models for diagnosis and prognosis of covid-19: Systematic review and critical appraisal", BMJ, vol. 369, 2020, doi: 10.1136/bmj.m1328.
- [110] W. D. Heaven, "Hundreds of AI tools have been built to catch COVID. None of them helped", MIT Technol. Rev., p. 2021, 2021, [Online]. Available: https://www.technologyreview.com/2021/07/30/1030329/machine-learning-ai-failed-covid-hospitaldiagnosis-pandemic/.
- [111] K. Hao, "Doctors are using AI to triage covid-19 patients. The tools may be here to stay", MIT Technology Review, 2020.
- [112] S. Chen, J. Yang, W. Yang, C. Wang, and T. Bärnighausen, "COVID-19 control in China during mass population movements at New Year", Lancet, vol. 395, no. 10226, pp. 764–766, 2020, doi: 10.1016/S0140-6736(20)30421-9.
- [113] M. Roberts et al., "Common pitfalls and recommendations for using machine learning to detect and prognosticate for COVID-19 using chest radiographs and CT scans", Nat. Mach. Intell., vol. 3, no. 3, pp. 199–217, 2021, doi: 10.1038/s42256-021-00307-0.
- [114] K. Suzuki, "Pixel-based machine learning in medical imaging", Int. J. Biomed. Imaging, vol. 2012, no. May, 2012, doi: 10.1155/2012/792079.
- [115] K. Jaidka, S. Giorgi, H. A. Schwartz, M. L. Kern, L. H. Ungar, and J. C. Eichstaedt, "Estimating geographic subjective well-being from Twitter: A comparison of dictionary and data-driven language methods", Proc. Natl. Acad. Sci., vol. 117, no. 19, pp. 10165–10171, May 2020, doi: 10.1073/pnas.1906364117.

- [116] I. Tuomi, The Impact of Artificial Intelligence on Learning, Teaching, and Education Policies. Luxembourg: Publications Office of the European Union, 2018.
- [117] J. Kahn and J. Hopkins (Eds.), Digital Contact Tracing for Pandemic Response. Johns Hopkins University Press, 2020.
- [118] I. von Borzyskowski, A. Mazumder, B. Mateen, and M. Wooldridge, "Data science and AI in the age of COVID-19", 2021. Available: <u>https://www.gov.uk/government/publications/covid-19-repository-and-publicattitudes-retrospective</u>.
- [119] E. Santus et al., "Artificial Intelligence–Aided Precision Medicine for COVID-19: Strategic Areas of Research and Development," J. Med. Internet Res., vol. 23, no. 3, p. e22453, Mar. 2021, doi: 10.2196/22453.
- [120] M. van der Schaar, "Responding to COVID-19 with AI and machine learning", 2020. https://www.linkedin.com/pulse/responding-covid-19-ai-machine-learning-mihaela-van-der-schaar.
- [121] I. Harrus and J. Wyndham, "Applications and impact assessment", 2021. Available: https://www.aaas.org/sites/default/files/2021-05/AIandCOVID19\_2021\_FINAL.pdf.
- [122] A. Regalado, "Covid variant tracking", MIT Technology Review. https://www.technologyreview.com/2022/02/23/1044975/covid-19-variant-tracking-scientists/ (accessed Aug. 05, 2022).
- [123] S. Ö. Arık, "A prospective evaluation of AI-augmented epidemiology to forecast COVID-19 in the USA and Japan", Nature, 2021, doi: https://doi.org/10.1038/s41746-021-00511-7.
- [124] "Beauty Is Personal: How smart data and AI customized the cosmetics experience", The New York Times. https://www.nytimes.com/paidpost/sas/ulta-beauty/beauty-is-personal.html (accessed Aug. 03, 2022).
- [125] Singh K. Cosmetic Surgery in Teenagers: To Do or Not to Do J Cutan Aesthet Surg. 2015. doi: 10.4103/0974-2077.155091
- [126] E Baker-White. Leaked Audio From 80 Internal TikTok Meetings Shows That US User Data Has Been Repeatedly Accessed From China. Buzzfeednews . https://www.buzzfeednews.com/article/emilybakerwhite/tiktok-tapes-us-user-data-china-bytedanceaccess.
- [127] P. Y. Cheah and J. Piasecki, "Data Access Committees", BMC Med. Ethics, vol. 21, no. 1, Feb. 2020, doi: 10.1186/S12910-020-0453-Z.
- [128] K. L. Boyd, "Datasheets for Datasets help ML Engineers Notice and Understand Ethical Issues in Training Data", Proc. ACM Human-Computer Interact., vol. 5, no. CSCW2, Oct. 2021, doi: 10.1145/3479582.
- [129] W. D. Heaven, "Synthetic data for AI", MIT Technology Review. https://www.technologyreview.com/2022/02/23/1044965/ai-synthetic-data-2/ (accessed Aug. 05, 2022).
- [130] A Martinez-Millana et al. Artificial intelligence and its impact on the domains of universal health coverage, health emergencies and health promotion: An overview of systematic reviews. International Journal of Medical Informatics, 166, 2022. https://doi.org/10.1016/j.ijmedinf.2022.104855.
- [131] Use of artificial intelligence on the rise, but its impact on health still limited, new study finds. World Health Organization, 2022. https://www.who.int/europe/news/item/27-09-2022-use-of-artificialintelligence-on-the-rise--but-its-impact-on-health-still-limited--new-study-finds
- [132] K Palla. The Rise Of Digital Twin Technology. Forbes, 2022. <u>https://www.forbes.com/sites/forbestechcouncil/2022/08/03/the-rise-of-digital-twin-technology/?sh=7e663ba52f97</u>
- [133] "Isomorphic Labs announces first phase of management team", https://www.isomorphiclabs.com/newsroom (accessed Aug. 03, 2022).
- [134] Isomorphic Labs. https://www.isomorphiclabs.com/newsroom.
- [135] E. Callaway, "'The entire protein universe': AI predicts shape of nearly every known protein", Nature, vol. 608, no. 7921, pp. 15–16, Aug. 2022, doi: 10.1038/d41586-022-02083-2.

- [136] D. Castelvecchi, "DeepMind AI tackles one of chemistry's most valuable techniques", Nature, vol. 600, no. 7889, p. 371, Dec. 2021, doi: 10.1038/D41586-021-03697-8.
- [137] K. Hao, "The true dangers of AI are closer than we think", MIT Technology Review, 2020. https://www.technologyreview.com/2020/10/21/1009492/william-isaac-deepmind-dangers-ofai/?truid=&utm\_source=acquisition\_email&utm\_medium=email&utm\_campaign=tr\_subscription.unpaid.a cquisition&utm\_term=10.25.21.algo-preview&utm\_content=oct21-acq&mc\_cid=a46b (accessed Oct. 26, 2021).
- [138] B. Stai et al., "Public Perceptions of Artificial Intelligence and Robotics in Medicine", J. Endourol., vol. 34, no. 10, pp. 1041–1048, Oct. 2020, doi: 10.1089/end.2020.0137.
- [139] J. P. Richardson et al., "Patient apprehensions about the use of artificial intelligence in healthcare", NPJ Digit. Med. 2021 41, vol. 4, no. 1, pp. 1–6, Sep. 2021, doi: 10.1038/s41746-021-00509-1.
- [140] W. D. Heaven, "AI for protein folding", MIT Technology Review. https://www.technologyreview.com/2022/02/23/1044957/ai-protein-folding-deepmind/ (accessed Aug. 05, 2022).
- [141] M. Eisenstein, "Artificial intelligence powers protein-folding predictions", Nature, vol. 599, no. 7886, pp. 706–708, Nov. 2021, doi: 10.1038/D41586-021-03499-Y.
- [142] E. Callaway, "It will change everything': DeepMind's AI makes gigantic leap in solving protein structures", Nature, vol. 588, no. 7837, pp. 203–204, 2020, doi: 10.1038/d41586-020-03348-4.
- [143] K. D. Atherton, "How AMIGOS will help military mechanics and medics", Popular Science. https://www.popsci.com/technology/darpa-funded-amigos-program/ (accessed Aug. 03, 2022).
- [144] S. A. Wartman and C. D. Combs, "Reimagining medical education in the age of AI", AMA J. Ethics, vol. 21, no. 2, pp. 146–152, Feb. 2019, doi: 10.1001/AMAJETHICS.2019.146.
- [145] M. Katell et al., "Toward situated interventions for algorithmic equity: Lessons from the field", FAT\* 2020 - Proc. 2020 Conf. Fairness, Accountability, Transpar., pp. 45–55, 2020, doi: 10.1145/3351095.3372874.
- [146] M. A. Madaio, L. Stark, J. Wortman Vaughan, and H. Wallach, "Co-Designing Checklists to Understand Organizational Challenges and Opportunities around Fairness in AI", Conf. Hum. Factors Comput. Syst. -Proc., 2020, doi: 10.1145/3313831.3376445.
- [147] L. Floridi, "Translating Principles into Practices of Digital Ethics: Five Risks of Being Unethical", Philos. Technol., vol. 32, no. 2, pp. 185–193, Jun. 2019, doi: 10.1007/S13347-019-00354-X.
- [148] L. Rein, "Veterans put at risk by failures in \$16 billion digital health system, watchdog finds", The Washington Post. https://www.washingtonpost.com/elections/2022/03/17/veterans-health-records-failure/ (accessed Aug. 04, 2022).
- [149] A Saxena, N Brault, Shazia Rashid (eds.). Big Data and Artificial Intelligence for Healthcare Applications. CRC Press, 2021.
- [150] K. Crawford, "WORLD VIEW Regulate facial-recognition technology", Nature, vol. 572, p. 565, 2019.
- [151] J. Zou and L. Schiebinger, "Ensuring that biomedical AI benefits diverse populations", EBioMedicine, vol. 67, p. 103358, 2021, doi: 10.1016/j.ebiom.2021.103358.
- [152] M. E. Matheny, D. Whicher, and S. Thadaney Israni, "Artificial Intelligence in Health Care: A Report from the National Academy of Medicine", JAMA - J. Am. Med. Assoc., vol. 323, no. 6, pp. 509–510, Feb. 2020, doi: 10.1001/JAMA.2019.21579.
- [153] JessicaMorley, "The ethics of AI in health care: A mapping review", ScienceDirect, 2020, doi: https://www.scihttps://doi.org/10.1016/j.socscimed.2020.113172.
- [154] J. He, "The practical implementation of artificial intelligence technologies in medicine", Nat. Med., 2019, doi: 10.1038/s41591-018-0307-0 (2019).
- [155] J. Lukose, S. Chidangil, and S. D. George, "Optical technologies for the detection of viruses like COVID-19: Progress and prospects," Biosens. Bioelectron., vol. 178, no. January, p. 113004, 2021, doi: 10.1016/j.bios.2021.113004.

- [156] M. Matheny, S. T. Israni, and M. Ahmed, "Artifical Intellingence in Health Care", Natl. Acad. Med., pp. 1– 269, 2018.
- [157] M. Sendak et al., "The human body is a black box': Supporting clinical decision-making with deep learning", Proc. 2020 Conf. Fairness, Accountability, Transpar., pp. 99–109, 2020, doi: 10.1145/3351095.3372827.
- [158] S. Kundu, "AI in medicine must be explainable", Nat. Med. 2021 278, vol. 27, no. 8, pp. 1328–1328, Jul. 2021, doi: 10.1038/s41591-021-01461-z.
- [159] K. Friedrich, "To Prevent Injury, Computers Will Predict When Soldiers Are Tired", Popular Mechanics. https://www.popularmechanics.com/military/a40863214/soldiers-injury-risk-machine-learning/ (accessed Sep. 12, 2022).
- [160] J. D. McKinnon, "Texas Sues Meta Over Facebook's Facial-Recognition Practices", The Wall Street Journal. https://www.wsj.com/articles/texas-sues-meta-over-facebooks-facial-recognition-practices-11644854794?mod=hp\_lead\_pos5 (accessed Aug. 04, 2022).
- [161] J. Hendler, "Government agencies are tapping a facial recognition company to prove you're you here's why that raises concerns about privacy, accuracy and fairness", The Conversation. https://theconversation.com/government-agencies-are-tapping-a-facial-recognition-company-to-proveyoure-you-heres-why-that-raises-concerns-about-privacy-accuracy-and-fairness-175817 (accessed Aug. 04, 2022).
- [162] "A Face Search Engine Anyone Can Use Is Alarmingly Accurate", The New York Times. https://www.nytimes.com/2022/05/26/technology/pimeyes-facial-recognition- search.html (accessed Aug. 03, 2022).
- [163] D. Harwell, "Clearview AI to stop selling facial recognition tool to private firms", The Washington Post. https://www.washingtonpost.com/technology/2022/05/09/clearview-illinois-court-settlement/ (accessed Jun. 27, 2022).
- [164] H. Guinness, "Facial analysis: What Microsoft and others are doing", Popular Science. https://www.popsci.com/technology/microsoft-removes-facial-recognition-tools/ (accessed Jun. 27, 2022).
- [165] K. Ottesen, "Antiabortion leader Marjorie Dannenfelser: 'You can never build human rights on the broken rights of other people'", The Washington Post. https://www.washingtonpost.com/lifestyle/magazine/antiabortion-leader-marjorie-dannenfelser-you-cannever-build-human-rights-on-the-broken-rights-of-other-people/2022/01/06/e35b8522-5873-11eca808-3197a22b19fa\_story.html (accessed Aug. 04, 2022).
- [166] J. Jargon, "Menopause Apps and Telehealth Services Can Help Women Take Charge, but Proceed With Caution", The Wall Street Journal. https://www.wsj.com/articles/menopause-apps-and-telehealth-servicescan-help-women-take-charge-but-proceed-with-caution-11649476437?mod=wsjhp\_columnists\_pos3 (accessed Aug. 04, 2022).
- [167] A. Frost, "Your fertility app is not smart, but you can make it better", Popular Science. https://www.popsci.com/diy/fertility-apps-fails/ (accessed Aug. 04, 2022).
- [168] S. McCallum, "Period tracking apps warning over Roe v Wade case in US", BBC News. https://www.bbc.com/news/technology-61347934 (accessed Jun. 27, 2022).
- [169] S. Perez, "Consumers swap period tracking apps in search of increased privacy following Roe v. Wade ruling", Tech Crunch. https://techcrunch.com/2022/06/27/consumers-swap-period-tracking-apps-in-search-of-increased-privacy-following-roe-v-wade-ruling/?guccounter=1 (accessed Jul. 22, 2022).
- [170] K. Siek, "Fake period tracking app data won't fix privacy issues", Popular Science. https://www.popsci.com/technology/period-tracking-app-privacy/ (accessed Jul. 22, 2022).
- [171] A. Fourney, R. W. White, and E. Horvitz, "Exploring time-dependent concerns about pregnancy and childbirth from search logs", Conf. Hum. Factors Comput. Syst. - Proc., vol. 2015-April, pp. 737–746, Apr. 2015, doi: 10.1145/2702123.2702427.
- [172] I. Soumpasis, B. Grace, and S. Johnson, "Real-life insights on menstrual cycles and ovulation using big data", Hum. Reprod. Open, vol. 2020, no. 2, Feb. 2020, doi: 10.1093/HROPEN/HOAA011.

- [173] D. A. Epstein et al., "Examining menstrual tracking to inform the design of personal informatics tools", Conf. Hum. Factors Comput. Syst. - Proc., vol. 2017-May, pp. 6876–6888, May 2017, doi: 10.1145/3025453.3025635.
- [174] R. Layer, "Genetic mutations can be benign or cancerous a new method to differentiate between them could lead to better treatments", The Conversation. https://theconversation.com/genetic-mutationscan-be-benign-or-cancerous-a-new-method-to-differentiate-between-them-could-lead-to-bettertreatments-181413 (accessed Jun. 27, 2022).
- [175] T. Shenwai, "DeepMind Introduces 'Enformer', A Deep Learning Architecture For Predicting Gene Expression From DNA Sequence", Marktechpost, 2021. https://www.marktechpost.com/2021/10/06/deepmind-introduces-enformer-a-deep-learning-architecturefor-predicting-gene-expression-from-dna-sequence/ (accessed Oct. 27, 2021).
- [176] A. D. Marcus, "WHO Panel Issues Gene-Editing Standards Aimed at Averting DNA Dystopia", The Wall Street Journal, 2021. https://www.wsj.com/articles/who-panel-issues-gene-editing-standards-aimed-ataverting-dna-dystopia-11626091200 (accessed Oct. 27, 2021).
- [177] J. Ji, M. Robbins, J. D. Featherstone, C. Calabrese, and G. A. Barnett, "Comparison of public discussions of gene editing on social media between the United States and China", PLoS One, vol. 17, no. 5 May, 2022, doi: 10.1371/journal.pone.0267406.
- [178] Y. Xue and L. Shang, "Governance of Heritable Human Gene Editing World-Wide and Beyond", Int. J. Environ. Res. Public Health, vol. 19, no. 11, p. 6739, May 2022, doi: 10.3390/IJERPH19116739.
- [179] B. Bekaert, A. Boel, G. Cosemans, L. De Witte, B. Menten, and B. Heindryckx, "CRISPR/Cas gene editing in the human germline", Semin. Cell Dev. Biol., Mar. 2022, doi: 10.1016/J.SEMCDB.2022.03.012.
- [180] D. Cyranoski, "The CRISPR-baby scandal: what's next for human gene-editing", Nature, vol. 566, no. 7745, pp. 440–442, Feb. 2019, doi: 10.1038/D41586-019-00673-1.
- [181] H. T. Greely, "CRISPR People", The MIT Press. https://mitpress.mit.edu/books/crispr-people (accessed Aug. 05, 2022).
- [182] J. E. Adair et al., "Towards access for all: 1st Working Group Report for the Global Gene Therapy Initiative (GGTI)", Gene Ther., no. May, pp. 1–6, 2021, doi: 10.1038/s41434-021-00284-4.
- [183] European Parliament, Genome Editing in Humans, no. June. 2022.
- [184] "WHO issues new recommendations on human genome editing for the advancement of public health", https://www.who.int/news/item/12-07-2021-who-issues-new-recommendations-on-human-genome-editing-for-the-advancement-of-public-health (accessed Aug. 05, 2022).
- [185] "Human Genome editing", World Health Organization. https://www.who.int/ethics/topics/humangenome-editing/en/ (accessed Jul. 25, 2019).
- [186] E. Frederick, "New CRISPR-based map ties every human gene to its function", MIT News. https://news.mit.edu/2022/crispr-based-map-ties-every-human-gene-to-its-function-0609 (accessed Aug. 05, 2022).
- [187] J. M. Replogle et al., "Mapping information-rich genotype-phenotype landscapes with genome-scale Perturb-seq", Cell, vol. 185, no. 14, pp. 2559-2575.e28, 2022, doi: 10.1016/j.cell.2022.05.013.
- [188] J. M. Replogle et al., "Combinatorial single-cell CRISPR screens by direct guide RNA capture and targeted sequencing", Nat. Biotechnol., vol. 38, no. 8, pp. 954–961, 2020, doi: 10.1038/s41587-020-0470-y.
- [189] J. Cohen, "Commission charts narrow path for editing human embryos", Science. https://www.science.org/content/article/commission-charts-narrow-path-editing-human-embryos (accessed Aug. 05, 2022).
- [190] "What we risk as humans if we allow gene-edited babies: a philosopher's view", The Conversation. https://theconversation.com/what-we-risk-as-humans-if-we-allow-gene-edited-babies-a-philosophersview-110498 (accessed Aug. 05, 2022).
- [191] S. D. Conway and M. E. Conway, A Framework for Governance. 2008.

- [192] Y. M. Hawsawi et al., "The State-of-the-Art of Gene Editing and its Application to Viral Infections and Diseases Including COVID-19", Front. Cell. Infect. Microbiol., vol. 12, no. June, pp. 1–17, 2022, doi: 10.3389/fcimb.2022.869889.
- [193] "Questions and Answers about CRISPR", Broad Institute. https://www.broadinstitute.org/whatbroad/areas-focus/project-spotlight/questions-and-answers-about-crispr (accessed Aug. 05, 2022).
- [194] M. Shwartz, "CRISPR is a gene-editing tool that's revolutionary, though not without risk", Stanford Medicine. https://stanmed.stanford.edu/2018winter/CRISPR-for-gene-editing-is-revolutionary-but-it-comes-with-risks.html (accessed Aug. 05, 2022).
- [195] L. P. Garrison, B. Jiao, and O. Dabbous, "Gene therapy may not be as expensive as people think: challenges in assessing the value of single and short-term therapies", J. Manag. care Spec. Pharm., vol. 27, no. 5, pp. 674–681, May 2021, doi: 10.18553/JMCP.2021.27.5.674.
- [196] J. Biswas, "AI-designed Protein Awakens Silenced Genes, CRISPR and AI Blended to Create New Technique", International Bussiness Times. https://www.ibtimes.co.in/scientists-use-ai-designed-protein-awaken-silenced-genes-blend-crispr-ai-create-new-technique-846312 (accessed Aug. 03, 2022).
- [197] A. Kiseleva, "Somatic Genome Editing with the Use of AI: Big Promises but Doubled Legal Issues", Eur. J. Health Law, pp. 1–28, 2022, doi: 10.1163/15718093-bja10079.
- [198] W. G. Johnson, "Where Genome Editing and Artificial Intelligence Collide", CSPO. https://cspo.org/where-genome-editing-and-artificial-intelligence-collide/ (accessed Jun. 27, 2022).
- [199] R. J. Blendon, M. T. Gorski, and J. M. Benson, "The Public and the Gene-Editing Revolution", N. Engl. J. Med., vol. 374, no. 15, pp. 1406–1411, Apr. 2016, doi: 10.1056/NEJMP1602010.
- [200] "CRISPR, 10 Years On: Learning to Rewrite the Code of Life", The New York Times. https://www.nytimes.com/2022/06/27/science/crispr-gene-editing-10-years.html (accessed Jun. 28, 2022).
- [201] B. Bekaert, A. Boel, G. Cosemans, L. De Witte, B. Menten, and B. Heindryckx, "CRISPR/Cas gene editing in the human germline", Semin. Cell Dev. Biol., no. November 2021, 2022, doi: 10.1016/J.SEMCDB.2022.03.012.
- [202] M. Jinek, K. Chylinski, I. Fonfara, M. Hauer, J. A. Doudna, and E. Charpentier, "A programmable dual-RNA-guided DNA endonuclease in adaptive bacterial immunity", Science (80-. )., vol. 337, no. 6096, pp. 816–821, Aug. 2012, doi: 10.1126/SCIENCE.1225829.
- [203] E. Lutz, "CRISPR in the Classroom," The New York Times. https://www.nytimes.com/interactive/2022/06/27/science/crispr-anniversary- explainer.html (accessed Jun. 28, 2022).
- [204] "The Many Uses of CRISPR: Scientists Tell All", The New York Times. https://www.nytimes.com/2022/06/27/science/crispr-science-medical-research.html (accessed Jun. 28, 2022).
- [205] E. A. Stadtmauer et al., "CRISPR-engineered T cells in patients with refractory cancer", Science (80-. )., vol. 367, no. 6481, Feb. 2020, doi: 10.1126/SCIENCE.ABA7365.
- [206] D. A. Nayarisseri, "Machine Learning, Deep Learning and Artificial Intelligence approach for predicting CRISPR for the Cancer treatment", in Proceedings of MOL2NET 2019, International Conference on Multidisciplinary Sciences, 5th edition, Sep. 2019, no. September, p. 6258, doi: 10.3390/mol2net-05-06258.
- [207] X. Zheng, J. Cui, Y. Wang, J. Zhang, and C. Wang, "CRSIPR-A-I: a webtool for the efficacy prediction of CRISPR activation and interference", bioRxiv, p. 2021.12.02.470943, 2021, [Online]. Available: https://www.biorxiv.org/content/10.1101/2021.12.02.470943v1%0Ahttps://www.biorxiv.org/content/10.11 01/2021.12.02.470943v1.abstract.
- [208] C. Bock et al., "High-content CRISPR screening", Nat. Rev. Methods Prim., vol. 2, no. 1, 2022, doi: 10.1038/s43586-021-00093-4.
- [209] H. Ledford, "Super-precise new CRISPR tool could tackle a plethora of genetic diseases", Nature, vol. 574, no. 7779, pp. 464–465, Oct. 2019, doi: 10.1038/D41586-019-03164-5.

- [210] Z. Gorvett, "The genetic mistakes that could shape our species", BBC. https://www.bbc.com/future/article/20210412-the-genetic-mistakes-that-could-shape-our-species (accessed Aug. 05, 2022).
- [211] G. Campbell, "Scotland and UK governments split over gene-edited food", BBC News, 2022. https://www.bbc.com/news/uk-scotland-61768920.
- [212] M. Eisenstein, "Base edit your way to better crops", Nature, vol. 604, no. 7907, pp. 790–792, 2022, doi: 10.1038/D41586-022-01117-Z.
- [213] C. McFall, "China's interest in US agriculture poses security threat, federal report warns", Fox News. https://www.foxnews.com/politics/china-interest-us-agriculture-poses-security-threat-federal-reportwarns (accessed Aug. 04, 2022).
- [214] "Bioterror: the dangers of garage scientists manipulating DNA", Financial Times. https://www.ft.com/content/9ac7f1c0-1468-4dc7-88dd-1370ead42371 (accessed Aug. 05, 2022).
- [215] P. L. Lau, "How gene editing could be used as a weapon, and what to do about it", The Conversation. https://phys.org/news/2021-11-gene-weapon.html (accessed Aug. 05, 2022).
- [216] A. Regalado, "Top U.S. Intelligence Official Calls Gene Editing a Weapon of Mass Destruction (WMD) Threat", MIT Technology Review. https://www.technologyreview.com/2016/02/09/71575/top-usintelligence-official-calls-gene-editing-a-wmd-threat/ (accessed Aug. 05, 2022).
- [217] A. Hagstrom, "Intelligence Committee members warn US of bioweapons targeting DNA of individual Americans", Fox News. https://www.foxnews.com/us/intelligence-committee-members-warn-bioweapons-targeting-dna-individual-americans (accessed Aug. 04, 2022).
- [218] T. Basu, "The metaverse has a groping problem already", MIT Technology Review. https://www.technologyreview.com/2021/12/16/1042516/the-metaverse-has-a-gropingproblem/?utm\_source=engagement\_email&utm\_medium=email&utm\_campaign=site\_visitor.unpaid.enga gement&utm\_content=01.09.22.non-subs&mc\_cid=2c592ba67f&mc\_eid=77848f33bd (accessed Aug. 05, 2022).
- [219] D. Costica, Artificial intelligence at EU borders Overview of applications and key issues, no. July. European Parliamentary Research Service, 2021.
- [220] Z. Obermeyer, "A machine-learning algorithm to target COVID testing of travellers". Nat. 2021, Sep. 2021, doi: 10.1038/d41586-021-02556-w.
- [221] "Greece used AI to curb COVID: what other nations can learn", Nature, vol. 597, no. 7877, pp. 447–448, Sep. 2021, doi: 10.1038/D41586-021-02554-Y.
- [222] B. Eržen, M. Weber, and S. Sacchetti, "How COVID-19 is changing border control", International Centre for Migration Policy Development, 2020. https://www.icmpd.org/news/how-covid-19-is-changing-bordercontrol (accessed Oct. 27, 2021).
- [223] S. min Park et al., "A mountable toilet system for personalized health monitoring via the analysis of excreta", Nat. Biomed. Eng. 2020 46, vol. 4, no. 6, pp. 624–635, Apr. 2020, doi: 10.1038/s41551-020-0534-9.
- [224] P. Kiefer, "This at-home sensor monitors Parkinson's symptoms", Popular Science. https://www.popsci.com/health/parkinsons-at-home-monitor/ (accessed Sep. 30, 2022).
- [225] A. Regalado. The creator of the CRISPR babies has been released from a Chinese prisonMIT Technology Review, 2022. https://www.technologyreview.com/2022/04/04/1048829/he-jiankui-prisonfree-crispr-babies/
- [226] S. Ben Ouaghram-Gormley, "From CRISPR babies to super soldiers: challenges and security threats posed by CRISPR", vol. 27, no. 4–6, pp. 367–387, 2021, doi: 10.1080/10736700.2020.1880712.
- [227] "From bioweapons to super soldiers: how the UK is joining the genomic technology arms race", The Conversation. https://theconversation.com/from-bioweapons-to-super-soldiers-how-the-uk-is-joining-the-genomic-technology-arms-race-159889 (accessed Aug. 05, 2022).
- [228] W. Johnson and E. Pauwels, "How to Optimize Human Biology: Where Genome Editing and Artificial Intelligence Collide", Wilson Briefs, no. October, 2017. Available:

https://www.wilsoncenter.org/publication/how-to-optimize-human-biology-where-genome-editing-and-artificial-intelligence-collide.

- [229] C. Ireton and J. Posetti, "Journalism, 'Fake News' & Disinformation: Handbook for Journalism Education and Training", p. 128, 2018.
- [230] Jabarulla MY, Lee HN. A Blockchain and Artificial Intelligence-Based, Patient-Centric Healthcare System for Combating the COVID-19 Pandemic: Opportunities and Applications. Healthcare (Basel). 2021. doi: 10.3390/healthcare9081019. PMID: 34442156.
- [231] "Dawes Centre for Future Crime", https://www.ucl.ac.uk/jill-dando-institute/research/dawes-centrefuture-crime (accessed Nov. 02, 2021).
- [232] "Stanford HAI", https://hai.stanford.edu/ (accessed Nov. 02, 2021).
- [233] "NeurotechEU The European University for Brain & Technology." https://theneurotech.eu/ (accessed Nov. 02, 2021).
- [234] "European Centre for Disease Prevention and Control", https://www.ecdc.europa.eu/en (accessed Nov. 02, 2021).
- [235] "World Health Organization", https://www.who.int/home (accessed Nov. 02, 2021).
- [236] World Health Organization, "From Worlds Apart To a World Prepared," p. 51, 2021, [Online]. Available: https://apps.who.int/gpmb/assets/annual\_report/GPMB\_annualreport\_2019.pdf.
- [237] G. Bordin, M. Hristova, and E. Luque-Perez, Security and defence research in the European Union : a landscape review : with a specific focus on man-made risks and threats intended to cause harm. Publications Office of the European Union, 2019.
- [238] NATO Science & TechnologyOrganization, "Science and Technology Trends 2020-2040," Nato Sci. Technol. Organ., p. 160, 2020, [Online]. Available: http://s5Cwww.sto.nato.int.
- [239] "NATO Science and Technology Organization." https://www.nato.int/cps/en/natohq/topics\_88745.htm (accessed Nov. 02, 2021).
- [240] "UNICRI: United Nations Interregional Crime and Justice Research Institute." http://www.unicri.it/in\_focus/on/unicri\_centre\_artificial\_robotics (accessed Nov. 02, 2021).
- [241] United Nations, "Office of Counter-Terrorism." https://www.un.org/counterterrorism/ (accessed Nov. 02, 2021).
- [242] "INTERPOL Innovation Centre." https://www.interpol.int/How-we-work/Innovation/INTERPOL-Innovation-Centre (accessed Nov. 02, 2021).
- [243] "European Cybercrime Centre EC3." https://www.europol.europa.eu/about-europol/europeancybercrime-centre-ec3 (accessed Nov. 02, 2021).
- [244] "A Community of Users on Secure, Safe and Resilient Societies (CoU)," Eur. Comm. Disaster Risk Manag. Knowl. Cent., 2020.
- [245] Trend Micro Research, UNICRI, and EC3, "Malicious Uses and Abuses of Artificial Intelligence," p. 80, 2020, [Online]. Available: <u>https://www.europol.europa.eu/newsroom/news/new-report-finds-criminals-leverage-ai-for-malicious-use---and-it's-not-just-deep-fakes</u>.
- [246] M. Caldwell, J. T. A. Andrews, T. Tanay, and L. D. Griffin, "AI-enabled future crime," Crime Sci., vol. 9, no. 1, pp. 1–4, 2020, doi: 10.1186/s40163-020-00123-8.
- [247] S. G. Finlayson, J. D. Bowers, J. Ito, J. L. Zittrain, L. Beam, and I. S. Kohane, "Emerging vulnerabilities demand new conversations," Science (80-. )., vol. 363, no. 6433, pp. 1287–1290, 2019, [Online]. Available: http://science.sciencemag.org/content/363/6433/1287.
- [248] UNICRI, "COVID-19 and future pandemics: The spectr of bioterrosism. Concept note," United Nations Interreg. Crime Justice Res. Inst., vol. 2019, no. December, pp. 8–9, 2018, doi: 10.1016/S0022-2836(03)00887-8.
- [249] "AI image recognition fooled by single pixel change," BBC, 2017. https://www.bbc.com/news/technology-41845878 (accessed Oct. 27, 2021).

- [250] D. Alba, "Tracking Viral Misinformation: Latest Updates," The New York Times, 2021. https://www.nytimes.com/live/2020/2020-election-misinformation-distortions (accessed Oct. 27, 2021).
- [251] INTERPOL and UNICRI, "Artificial Intelligence and robotics for law enforcement," no. December, 1998.
- [252] R. A. Berk, "Artificial Intelligence, Predictive Policing, and Risk Assessment for Law Enforcement," Annu. Rev. Criminol., vol. 4, no. 1, pp. 209–237, 2021, doi: 10.1146/annurev-criminol-051520-012342.
- [253] K. Miller, "How Do We Ensure that Healthcare AI is Useful?," Stanford University. https://hai.stanford.edu/news/how-do-we-ensure-healthcare-aiuseful?utm\_source=Stanford+HAI&utm\_campaign=a13489b6f8-Mailchimp\_HAI\_Newsletter\_July\_2022\_2&utm\_medium=email&utm\_term=0\_aaf04f4a4b-a13489b6f8-64473563 (accessed Aug. 03, 2022).
- [254] M. Schaake and J. Clark, "Stanford Launches AI Audit Challenge." https://hai.stanford.edu/news/stanford-launches-ai-auditchallenge?utm\_source=Stanford+HAI&utm\_campaign=a13489b6f8-Mailchimp\_HAI\_Newsletter\_July\_2022\_2&utm\_medium=email&utm\_term=0\_aaf04f4a4b-a13489b6f8-64473563 (accessed Aug. 03, 2022).
- [255] K. D. Atherton, "DARPA wants robots to learn as naturally as children do," Popular Science. https://www.popsci.com/technology/darpa-machine-common-sense/ (accessed Jul. 25, 2022).
- [256] J. Diaz, "Aparecen drones rusos capaces de localizar y matar ucranianos por su cuenta," El Confidencial. https://www.elconfidencial.com/tecnologia/novaceno/2022-03-21/rusia-drone-kamikazeucrania-zala-aero\_3395188/ (accessed Jul. 22, 2022).
- [257] J. Diaz, "China captura datos de millones de personas para manipular Europa y EEUU," El Confidencial. https://www.elconfidencial.com/tecnologia/novaceno/2022-01-03/china-captura-datosfacebook-twitter\_3352765/ (accessed Aug. 03, 2022).
- [258] "China's Covid-Era Controls May Outlast the Coronavirus," The New York Times. https://www.nytimes.com/2022/01/30/world/asia/covid-restrictions-china-lockdown.html (accessed Aug. 04, 2022).
- [259] "Cybersecurity expert warns of reports CDC tracking COVID lockdown compliance," Fox News. https://www.foxnews.com/media/cybersecurity-expert-warns-reports-cdc-tracking-covid-lockdowncompliance (accessed Jun. 27, 2022).
- [260] "AI Spectral Technology COVID-19 Detection Test Achieves 95% Success Rate in Clinical Trial -COVID-19," LabMedica. https://www.labmedica.com/covid-19/articles/294784015/ai-spectral-technologycovid-19-detection-test-achieves-95-success-rate-in-clinical-trial.html (accessed Aug. 03, 2022).
- [261] "How China Is Policing the Future," The New York Times. https://www.nytimes.com/2022/06/25/technology/china-surveillance-police.html (accessed Jun. 27, 2022).
- [262] "I Used Apple AirTags, Tiles and a GPS Tracker to Watch My Husband's Every Move," The New York Times. https://www.nytimes.com/2022/02/11/technology/airtags-gps-surveillance.html (accessed Aug. 04, 2022).
- [263] I Qian, M Xiao, P Mozur, A Cardia. Four Takeaways From a Times Investigation Into China's Expanding Surveillance State, NYT, 2022. https://www.nytimes.com/2022/06/21/world/asia/china-surveillance-investigation.html.
- [264] C. Hu, "AI could add color to night vision," Popular Science. https://www.popsci.com/technology/aiinfrared-night-vision-in-color/ (accessed Aug. 04, 2022).
- [265] P Mozur, R Zhong, A Krolik. In Coronavirus Fight, China Gives Citizens a Color Code, With Red Flags. NYT, 2022. https://www.nytimes.com/2020/03/01/business/china-coronavirus-surveillance.html
- [266] "Our Data Is a Curse, With or Without Roe," The New York Times. https://www.nytimes.com/2022/06/29/technology/abortion-data-privacy.html (accessed Jul. 25, 2022).
- [267] "The Planned Parenthood website shares your data with Google, others," The Washington Post. https://www.washingtonpost.com/technology/2022/06/29/planned-parenthood-privacy/ (accessed Jul. 25, 2022).

- [268] "More and more, artificial intelligence is keeping the world under watch," The Washington Post. https://www.washingtonpost.com/opinions/2022/06/27/more-more-artificial-intelligence-is-keeping-worldunder-watch/ (accessed Jul. 25, 2022).
- [269] A. Agboola, "The Secret Police | MIT Technology Review," MIT Technology Review. https://www.technologyreview.com/supertopic/secret-police-surveillance-investigation-minnesota/ (accessed Aug. 05, 2022).
- [270] T. Ryan-Mosley and S. Richards, "After George Floyd's murder, police built a secretive surveillance machine in Minnesota after George Floyd's murder," MIT Technology Review, 2022. https://www.technologyreview.com/2022/03/03/1046676/police-surveillance-minnesota-george-floyd/ (accessed Sep. 13, 2022).
- [271] S. Richards and T. Ryan-Mosley, "The secret police: After protests around George Floyd's murder ended, a police system for watching protesters kept going," MIT Technology Review, 2022. https://www.technologyreview.com/2022/03/17/1047413/secret-police-surveillance-protesters-georgefloyd-operation-safety-net/ (accessed Sep. 13, 2022).
- [272] S. Richards and T. Ryan-Mosley, "Inside the app Minnesota police use collect data on journalists at protests," MIT Technology Review, 2022. https://www.technologyreview.com/2022/03/23/1047899/secret-police-app-minnesota-police-journalists-protests-data/ (accessed Sep. 13, 2022).
- [273] T. Ryan-Mosley and S. Richards, "Minneapolis police used traffic stops and fake social media profiles to target communities of color," MIT Technology Review, 2022. https://www.technologyreview.com/2022/04/27/1051517/minneapolis-police-racial-bias-fake-socialmedia-profiles-surveillance/ (accessed Sep. 13, 2022).
- [274] T. Ryan-Mosley and S. Richards, "Private security groups regularly sent Minnesota police misinformation about protestors," MIT Technology Review, 2022. https://www.technologyreview.com/2022/07/07/1055508/secret-police-private-security-group-minnesotamisinformation-protestors/ (accessed Sep. 13, 2022).
- [275] B. Jensen, "Johannes Eichstaedt: Exploring the Intersection of Psychology and AI," HAI, Stanford University. https://hai.stanford.edu/news/johannes-eichstaedt-exploring-intersection-psychology-andai?utm\_source=Stanford+HAI&utm\_campaign=1bb841aa11-Mailchimp\_HAI\_Newsletter\_May+2022\_3&utm\_medium=email&utm\_term=0\_aaf04f4a4b-1bb841aa11-64473563 (accessed Aug. 05, 2022).
- [276] C. Hagerty, "Crisis Text Line addresses its data use controversy," Popular Science. https://www.popsci.com/technology/crisis-text-line-stops-sharing-data-loris-ai/ (accessed Aug. 04, 2022).
- [277] T. Qiu, "A Psychiatrist's Perspective on Social Media Algorithms and Mental Health," Stanford University. https://hai.stanford.edu/news/psychiatrists-perspective-social-media-algorithms-and-mentalhealth (accessed Aug. 05, 2022).
- [278] K. Palmai, "The video game prescribed by doctors to treat ADHD," BBC News. https://www.bbc.com/news/business-62060542 (accessed Jul. 22, 2022).
- [279] H. Meyer, "Digital Mental Health Companies Draw Scrutiny and Growing Concerns," KHN. https://khn.org/news/article/digital-mental-health-companies-scrutiny-concerns/ (accessed Jul. 22, 2022).
- [280] I. Whitcomb, "Mental wellness apps are basically the Wild West of therapy," Popular Science. https://www.popsci.com/science/mental-health-apps-safety/ (accessed Aug. 04, 2022).
- [281] C. Jee and W. D. Heaven, "The therapists using AI to make therapy better," MIT Technology Review. https://www.technologyreview.com/2021/12/06/1041345/ai-nlp-mental-health-better-therapistspsychology-cbt/ (accessed Aug. 04, 2022).
- [282] M. P. Ewbank, R. Cummins, V. Tablan, A. Catarino, S. Buchholz, and A. D. Blackwell, "Understanding the relationship between patient language and outcomes in internet-enabled cognitive behavioural therapy: A deep learning approach to automatic coding of session transcripts," Psychother. Res., pp. 1–13, 2020, doi: 10.1080/10503307.2020.1788740.
- [283] E. Betuel, "Mental health app Wysa raises \$5.5M for 'emotionally intelligent' AI," TechCrunch, 2021. https://techcrunch.com/2021/05/21/mental-health-app-wysa-raises-5-5m-for-emotionally-intelligent-ai/ (accessed Oct. 27, 2021).

- [284] K. Conger, K. Browning, and E. Woo, "Eating Disorders and Social Media Prove Difficult to Untangle," The New York Times, 2021. https://www.nytimes.com/2021/10/22/technology/social-media-eatingdisorders.html (accessed Oct. 27, 2021).
- [285] "COVID-19: Mental health telemedicine was off to a slow start then the pandemic happened," The Conversation. https://theconversation.com/covid-19-mental-health-telemedicine-was-off-to-a-slow-start-then-the-pandemic-happened-177670 (accessed Aug. 04, 2022).
- [286] M. É. Czeisler et al., "Mental Health, Substance Use, and Suicidal Ideation During the COVID-19 Pandemic," MMWR. Morb. Mortal. Wkly. Rep., vol. 69, no. 32, pp. 1049–1057, Aug. 2022, doi: 10.15585/MMWR.MM6932A1.
- [287] K. Mahowald and A. A. Ivanova, "Google's powerful AI spotlights a human cognitive glitch: Mistaking fluent speech for fluent thought," The Conversation. https://theconversation.com/googles-powerful-ai-spotlights-a-human-cognitive-glitch-mistaking-fluent-speech-for-fluent-thought-185099 (accessed Jul. 22, 2022).
- [288] S. Harnad, "Other bodies, other minds: A machine incarnation of an old philosophical problem," Minds Mach., vol. 1, no. 1, pp. 43–54, Feb. 1991, doi: 10.1007/BF00360578.
- [289] J. F. Klein and S. B. Hood, "The impact of stuttering on employment opportunities and job performance," J. Fluency Disord., vol. 29, no. 4, pp. 255–273, 2004, doi: 10.1016/J.JFLUDIS.2004.08.001.
- [290] A. Hadhazy, "Worse' AI Counterintuitively Enhances Human Decision Making and Performance," Stanford University. https://hai.stanford.edu/news/worse-ai-counterintuitively-enhances-human-decisionmaking-and-performance?utm\_source=Stanford+HAI&utm\_campaign=a13489b6f8-Mailchimp\_HAI\_Newsletter\_July\_2022\_2&utm\_medium=email&utm\_term=0\_aaf04f4a4b-a13489b6f8-64473563 (accessed Aug. 03, 2022).
- [291] T Ryan-Mosley. "The fight for "Instagram face". MIT Technology Review, 2022. https://www.technologyreview.com/2022/08/19/1057133/fight-for-instagram-face/
- [292] H Liu. Applications of Artificial Intelligence to Popularize Legal Knowledge and Publicize the Impact on Adolescents' Mental Health Status. Front Psychiatry. 2022. <u>https://www.ncbi.nlm.nih.gov/pmc/articles/PMC9199859/</u>
- [293] J. Eng, "BeReal is Gen Z's favorite new social media app, for food and more The Washington Post," The Washington Post. https://www.washingtonpost.com/food/2022/06/27/bereal-food-influencer/ (accessed Aug. 04, 2022).
- [294] "Data & Statistics on Autism Spectrum Disorder," Centers for Disease Control and Prevention (CDC). https://www.cdc.gov/ncbddd/autism/data.html (accessed Aug. 03, 2022).
- [295] M. J. Maenner et al., "Prevalence of Autism Spectrum Disorder Among Children Aged 8 Years Autism and Developmental Disabilities Monitoring Network, 11 Sites, United States, 2016," MMWR. Surveill. Summ., vol. 69, no. 4, pp. 1–12, Mar. 2020, doi: 10.15585/mmwr.ss6904a1.
- [296] "Autism Statistics and Facts," Autism Speaks, 2020. https://www.autismspeaks.org/autism-statisticsasd (accessed Nov. 02, 2021).
- [297] "AUTISM AND HEALTH: A SPECIAL REPORT BY AUTISM SPEAKS Advances in Understanding and Treating the Health Conditions that Frequently Accompany Autism," Autism Speak., 2017.
- [298] M. P. de la Paz, "Autism spectrum disorders in the European Union (ASDEU)," asdeu, pp. 1–13, 2018, Accessed: Nov. 02, 2021. [Online]. Available: <u>http://asdeu.eu/wp-</u> <u>content/uploads/2016/12/ASDEUExecSummary27September2018.pdf</u>.
- [299] L. M. Oberman and P. G. Enticott, Neurotechnology and Brain Stimulation in Pediatric Psychiatric and Neurodevelopmental Disorders. 2019.
- [300] "Neurodiversity Is Normal," Neurodiversity Pathways, 2021. https://sites.google.com/goodwillsv.org/neurodiversity/home (accessed Nov. 02, 2021).
- [301] C. Contillo, "Addressing the cybersecurity skills gap through neurodiversity," TechCrunch, 2021. https://techcrunch.com/2021/06/22/addressing-the-cybersecurity-skills-gap-through-neurodiversity/ (accessed Nov. 02, 2021).

- [302] P. Salehi, "Neurodiversity and the software design dilemma," TechCrunch, 2021. https://techcrunch.com/2021/10/04/neurodiversity-and-the-software-design-dilemma/ (accessed Nov. 02, 2021).
- [303] "Neurodiverse Hiring Brings Social and Business Benefits," JPMorgan Chase & Co logo, 2020. https://www.jpmorganchase.com/news-stories/neurodiverse-hiring-brings-social-and-business-benefits (accessed Nov. 02, 2021).
- [304] R. D. Austin and G. P. Pisano, "Neurodiversity Is a Competitive Advantage," Harvard Business Review, 2017. https://hbr.org/2017/05/neurodiversity-as-a-competitive-advantage (accessed Nov. 02, 2021).
- [305] "Smart Glass Technology for Autism The Brain Power System," Psychscenehub, 2020. https://psychscenehub.com/video/autism-brain-power-system/ (accessed Nov. 02, 2021).
- [306] International bioethics committee, "PRELIMINARY DRAFT REPORT OF THE IBC ON ETHICAL ISSUES OF NEUROTECHNOLOGY," United Nations Educ. Sci. Cult. Organ., no. June 2018, 2019.
- [307] M. Ienca, "Common Human Rights Challenges Raised By Different Applications of Neurotechnologies in the Biomedical Fields," 2021.
- [308] K. Doya, A. Ema, H. Kitano, M. Sakagami, and S. Russell, "Social impact and governance of AI and neurotechnologies," Neural Networks, vol. 152, pp. 542–554, Aug. 2022, doi: 10.1016/J.NEUNET.2022.05.012.
- [309] M. Peck and P. MacNaughton, "Focused ultrasound," Focus. Intensive Care Ultrasound, no. April, pp. 3– 8, 2019, doi: 10.1093/med/9780198749080.003.0001.
- [310] E. Hildt, "What will this do to me and my brain? Ethical issues in brain-to-brain interfacing," Front. Syst. Neurosci., vol. 9, no. FEB, pp. 1–4, 2015, doi: 10.3389/fnsys.2015.00017.
- [311] N. Al-Rodhan, "The Rise of Neurotechnology Calls for a Parallel Focus on Neurorights," Scientific American, 2021. https://www.scientificamerican.com/article/the-rise-of-neurotechnology-calls-for-a-parallel-focus-on-neurorights/ (accessed Oct. 27, 2021).
- [312] "Neurotechnologies: The Next Technology Frontier," IEEE Brain. https://brain.ieee.org/topics/neurotechnologies-the-next-technology-frontier/ (accessed Aug. 08, 2022).
- [313] "Neurotechnology and the future of brain implants," Iberdrola, 2020. <u>https://www.iberdrola.com/documents/20125/42076/Infographic\_Neurotechnology.pdf/74a0cd56-9432-</u> <u>1fae-9472-97d3c4bb8d7f?t=1630478577285</u>.
- [314] IA Hamilton. Elon Musk said Neuralink hopes to start implanting its brain chips in humans in 2022, later than he anticipated. Business Insider, 2022. <u>https://www.businessinsider.com/elon-musk-neuralink-hopes-to-start-human-testing-2022-2021-12</u>
- [315] A. M. Lozano et al., "Deep brain stimulation: current challenges and future directions," Nat. Rev. Neurol., vol. 15, no. 3, pp. 148–160, 2019, doi: 10.1038/s41582-018-0128-2.
- [316] D. A. Moses et al., "Neuroprosthesis for Decoding Speech in a Paralyzed Person with Anarthria," N. Engl. J. Med., vol. 385, no. 3, pp. 217–227, Jul. 2021, doi: 10.1056/NEJMoa2027540.
- [317] G. Jones, "The 'FUS' about brain stimulation (focused ultrasound)," Alpharmaxim, 2021. https://alpharmaxim.com/focused-ultrasound/ (accessed Oct. 27, 2021).
- [318] T. Blakely, "Google AI Blog: A Browsable Petascale Reconstruction of the Human Cortex," Google AI Blog, 2021. https://ai.googleblog.com/2021/06/a-browsable-petascale-reconstruction-of.html (accessed Oct. 27, 2021).
- [319] A. LOTEN and K. HAND, "How Computers With Humanlike Senses Will Change Our Lives," The Wall Street Journal, 2021. https://www.wsj.com/articles/how-computers-with-humanlike-senses-will-changeour-lives-11625760066 (accessed Oct. 27, 2021).
- [320] Researcher finds a better way to tap into the brain. University of Miami, 2021. https://news.miami.edu/stories/2021/03/researcher-finds-a-better-way-to-tap-into-the-brain.html
- [321] "What is Neurofeedback Therapy And Can it Help With Mental Health?" https://www.nytimes.com/2022/01/12/well/mind/neurofeedback-therapy-mental-health.html (accessed Aug. 04, 2022).

- [322] S. McBride. Elon Musk's Brain Implant Company Is Inching Toward Human Trials. Bloomberg, 2022. https://www.bloomberg.com/news/articles/2022-01-20/elon-musk-s-brain-implant-company-is-inchingtoward-human-trials
- [323] "What Can (And Can't) Be Achieved by Cognitive Enhancement Neurotech?," BBVA. https://www.bbvaopenmind.com/en/science/bioscience/what-can-and-cant-be-achieved-by-cognitiveenhancement-neurotech/ (accessed Aug. 08, 2022).
- [324] D. A. Borbón Rodríguez, L. F. Borbón Rodríguez, and M. A. León Bustamante, "NeuroRight to Equal Access to Mental Augmentation," Rev. Iberoam. Bioética, no. 16, pp. 01–15, 2021, doi: 10.14422/rib.i16.y2021.006.
- [325] S. Q. Hossain and S. I. Ahmed, "Ethical Analysis on the Application of Neurotechnology for Human Augmentation in Physicians and Surgeons," Adv. Intell. Syst. Comput., vol. 1290, no. November, pp. 78–99, 2021, doi: 10.1007/978-3-030-63092-8\_6.
- [326] S. Marsh, "Neurotechnology, Elon Musk and the goal of human enhancement," The Guardian. https://www.theguardian.com/technology/2018/jan/01/elon-musk-neurotechnology-human-enhancementbrain-computer-interfaces (accessed Aug. 08, 2022).
- [327] C. Cinel, D. Valeriani, and R. Poli, "Neurotechnologies for human cognitive augmentation: Current state of the art and future prospects," Front. Hum. Neurosci., vol. 13, p. 13, Feb. 2019, doi: 10.3389/FNHUM.2019.00013/BIBTEX.
- [328] D. Valeriani, H. Ayaz, N. Kosmyna, R. Poli, and P. Maes, "Editorial: Neurotechnologies for Human Augmentation," Front. Neurosci., vol. 15, no. November, pp. 1–3, 2021, doi: 10.3389/fnins.2021.789868.
- [329] Chang S. The Application of Transcranial Electrical Stimulation in Sports Psychology. Comput Math Methods Med. 2022 Jul 13;2022:1008346. doi: 10.1155/2022/1008346.
- [330] K. D. Atherton, "How one person can control a swarm of 130 robots | Popular Science," Popular Science. https://www.popsci.com/technology/drone-swarm-control-virtual-reality/ (accessed Aug. 04, 2022).
- [331] S. Chen. China's latest brainwave? Controlling space robots using mind powerSouth China Morning Post, 2022. https://www.scmp.com/news/china/science/article/3171890/chinas-latest-brainwavecontrolling-space-robots-using-mind
- [332] L. Dobberstein, "US Commerce Dept claims China has brain-control weaponry," The Register. https://www.theregister.com/2021/12/17/the\_department\_of\_commerce\_said/ (accessed Aug. 04, 2022).
- [333] Y. Afina, "Human Control Is Essential to the Responsible Use of Military Neurotechnology," Chatham House. https://www.chathamhouse.org/2019/08/human-control-essential-responsible-use-militaryneurotechnology (accessed Aug. 08, 2022).
- [334] J. J. Giordano, Neurotechnology in national security and defense : practical considerations, neuroethical concerns.
- [335] P Ghosh. Paralysed man with severed spine walks thanks to implantBBC. https://www.bbc.com/news/science-environment-60258620
- [336] A. Alkemade et al. A unified 3D map of microscopic architecture and MRI of the human brain. Science Advances. Vol 8, Issue 17, 2022. DOI: 10.1126/sciadv.abj7892
- [337] Salk Institute. Making a memory positive or negative. Science Daily, 2022. https://www.sciencedaily.com/releases/2022/07/220720121006.htm
- [338] S. Cao. Rival of Elon Musk's Neuralink Cleared by FDA to Test Brain Chip in Humans. Observer, 2021. https://observer.com/2021/07/neuralink-competitor-synchron-receives-fda-permission-test-brain-implanthuman/
- [339] M. Roberts. Brain implant may lift most severe depressionBBC, 2021. https://www.bbc.com/news/health-58719089
- [340] J. Linsley, "New AI technique identifies dead cells under the microscope 100 times faster than people can – potentially accelerating research on neurodegenerative diseases like Alzheimer's," The Conversation. https://theconversation.com/new-ai-technique-identifies-dead-cells-under-the-microscope-

100-times-faster-than-people-can-potentially-accelerating-research-on-neurodegenerative-diseases-like-alzheimers-174154 (accessed Aug. 04, 2022).

- [341] J. Rogin, "The U.S. government is rushing to resume risky virus research. Not so fast.," The Washington Post, 2021. https://www.washingtonpost.com/opinions/2021/10/21/us-government-is-rushing-resume-risky-virus-research-not-so-fast/ (accessed Oct. 27, 2021).
- [342] D. Nikel, "Controversial Coronavirus Lab Origin Claims Dismissed By Experts," Forbes, 2020. https://www.forbes.com/sites/davidnikel/2020/06/07/controversial-coronavirus-lab-origin-claimsdismissed-by-experts/?sh=5bc9d19768f6 (accessed Oct. 27, 2021).
- [343] AM Abu Haimed et al. Viral reverse engineering using Artificial Intelligence and big data COVID-19 infection with Long Short-term Memory (LSTM). Environ Technol Innov 22: 101531, 2021. doi: 10.1016/j.eti.2021.101531
- [344] W Robertson et al. Sense codon reassignment enables viral resistance and encoded polymer synthesis. Science Vol 372, Issue 6546, 2021. DOI: 10.1126/science.abg3029
- [345] "Lensless Camera Captures Cellular-Level Details in 3D," Photonics. https://www.photonics.com/Article.aspx?AID=67869&refer=bioMonthly&utm\_source=bioMonthly\_2022\_0 6\_22&utm\_medium=email&utm\_campaign=bioMonthly&PID=1 (accessed Aug. 03, 2022).
- [346] J. K. Adams et al., "In vivo lensless microscopy via a phase mask generating diffraction patterns with high-contrast contours," Nat. Biomed. Eng., vol. 6, no. 5, pp. 617–628, 2022, doi: 10.1038/s41551-022-00851-z.
- [347] D. Acemoglu, "The AI we should fear is already here," The Washington Post, 2021. https://www.washingtonpost.com/opinions/2021/07/21/ai-we-should-fear-is-already-here/ (accessed Oct. 27, 2021).
- [348] P. Ranade, A. Joshi, and T. Finin, "Study shows AI-generated fake reports fool experts," The conversation, 2021. https://theconversation.com/study-shows-ai-generated-fake-reports-fool-experts-160909 (accessed Oct. 27, 2021).
- [349] B. Stai et al., "Public Perceptions of Artificial Intelligence and Robotics in Medicine," https://home.liebertpub.com/end, vol. 34, no. 10, pp. 1041–1048, Oct. 2020, doi: 10.1089/END.2020.0137.
- [350] C. Linder, "Robot Comedians | Human-Robot Interaction," Popular Mechanics. https://www.popularmechanics.com/technology/robots/a32614583/robot-comedians-better-humanmachine-relationships/ (accessed Jul. 25, 2022).
- [351] J. Vilk and N. T. Fitter, "Comedians in cafes getting data: Evaluating timing and adaptivity in realworld robot comedy performance," ACM/IEEE Int. Conf. Human-Robot Interact., pp. 223–231, Mar. 2020, doi: 10.1145/3319502.3374780.
- [352] J. Gallagher, "Sickle cell: 'The revolutionary gene-editing treatment that gave me new life,'" BBC News. https://www.bbc.com/news/health-60348497 (accessed Aug. 04, 2022).
- [353] Center for Artificial Intelligence Research in Therapeutics (CAIRT), "Advancing Precision Medicine Using Ai and Big Data," Nat. Res. Cust. Media, 2018.
- [354] K Safdar. Churches Target New Members, With Help From Big Data. WSJ, 2021. https://www.wsj.com/articles/churches-new-members-personal-online-data-analytics-gloo-11640310982
- [355] G. Kaur and C. Higgins, "Al Bridges the Gap Between Medical Imaging and Analysis," Photonics. https://www.photonics.com/Article.aspx?AID=67796&refer=bioMonthly&utm\_source=bioMonthly\_2022\_0 6\_22&utm\_medium=email&utm\_campaign=bioMonthly&PID=1 (accessed Aug. 03, 2022).
- [356] "Featured on the cover of Nature Digital Medicine: Human-machine partnership with artificial intelligence for chest radiograph diagnosis," Stanford Medicine. https://med.stanford.edu/radiology/news/2019/human-machine-partnership-with-ai-for-chest-radiographdiagnosis.html (accessed Aug. 03, 2022).
- [357] B. N. Patel et al., "Human-machine partnership with artificial intelligence for chest radiograph diagnosis," npj Digit. Med., vol. 2, no. 1, 2019, doi: 10.1038/s41746-019-0189-7.
- [358] J. Hall, "AI Software Facilitates 22.1 Percent Reduction in Chest CT Review Time," Diagnostic Imaging. https://www.diagnosticimaging.com/view/ai-software-facilitates-22-1-percent-reduction-in-chest-ct-

review-

time?utm\_source=sfmc&utm\_medium=email&utm\_campaign=DI\_eNL\_06192022\_unsupported&eKey=Z WdvbWV6QHVzLmVz&utm\_source=sfmc&utm\_medium=email&utm\_campaign=DI\_ (accessed Aug. 03, 2022).

- [359] B. Yacoub et al., "Impact of Artificial Intelligence Assistance on Chest CT Interpretation Times: A Prospective Randomized Study," Am. J. Roentgenol., Jun. 2022, doi: 10.2214/ajr.22.27598.
- [360] J. Hall, "Essential Questions for Assessing Artificial Intelligence Vendors in Radiology," Diagnostic Imaging. https://www.diagnosticimaging.com/view/essential-questions-for-assessing-artificialintelligence-vendors-inradiology?utm\_source=sfmc&utm\_medium=email&utm\_campaign=06222022\_DI\_eNL\_unsupported&eK ey=ZWdvbWV6QHVzLmVz (accessed Aug. 03, 2022).
- [361] J. Hall, "Study Says AI Improves Sensitivity of Fracture Detection by 20 Percent," Diagnostic Imaging. https://www.diagnosticimaging.com/view/study-says-ai-improves-sensitivity-of-fracture-detection-by-20percent?utm\_source=sfmc&utm\_medium=email&utm\_campaign=07062022\_DI\_eNL\_unsupported&eKey =ZWdvbWV6QHVzLmVz (accessed Aug. 03, 2022).
- [362] L. Canoni-Meynet, P. Verdot, A. Danner, P. Calame, and S. Aubry, "Added value of an artificial intelligence solution for fracture detection in the radiologist's daily trauma emergencies workflow," Diagn. Interv. Imaging, Jun. 2022, doi: 10.1016/J.DIII.2022.06.004.
- [363] S. Agarwal, "A Closer Look at AI-Powered Voice Recognition in Radiology," Diagnostic Imaging. https://www.diagnosticimaging.com/view/a-closer-look-at-ai-powered-voice-recognition-inradiology?utm\_source=sfmc&utm\_medium=email&utm\_campaign=07062022\_DI\_eNL\_unsupported&eK ey=ZWdvbWV6QHVzLmVz (accessed Aug. 03, 2022).

[364] J. Hall, "Study Suggests AI Enhances Non-Contrast CT Detection of Large Vessel Occlusion," Diagnostic Imaging. https://www.diagnosticimaging.com/view/study-suggests-ai-enhances-non-contrastct-detection-of-large-vesselocclusion?utm\_source=sfmc&utm\_medium=email&utm\_campaign=07312022\_DI\_eNL\_unsponsored&eK ey=ZWdvbWV6QHVzLmVz (accessed Aug. 03, 2022).

- [365] University College London. "AI algorithm that detects brain abnormalities could help cure epilepsy." ScienceDaily. ScienceDaily, 12 August 2022. <www.sciencedaily.com/releases/2022/08/220812113817.htm>.
- [366] I. Terem et al., "3D amplified MRI (aMRI)," Magn. Reson. Med., vol. 86, no. 3, pp. 1674–1686, Sep. 2021, doi: 10.1002/mrm.28797.
- [367] J. Abderezaei et al., "Development, calibration, and testing of 3D amplified MRI (aMRI) for the quantification of intrinsic brain motion," Brain Multiphysics, vol. 2, no. September 2020, p. 100022, 2021, doi: 10.1016/j.brain.2021.100022.
- [368] "Elon Musk Reveals Tesla Plans for Humanoid Robot During AI Day," Wall Street Journal, 2021. https://www.wsj.com/video/series/on-the-news/elon-musk-reveals-tesla-plans-for-humanoid-robotduring-ai-day/8CA93758-6F52-41B3-8B73-4DC85AAC1B32 (accessed Oct. 27, 2021).
- [369] C. Teh. Take a look inside China's 'Westworld' a museum that's making customizable humanoid robots with 'goosebumps' and 'veins'. Insider, 2022. https://www.insider.com/take-a-look-inside-chinas-museum-of-customizable-humanoid-robots-2022-3
- [370] D. Sevastopoulo, M. Kruppa. US accuses China of developing 'brain control weaponry'. Financial Times, 2021. https://www.ft.com/content/f9637825-0e9b-45d7-a49a-1eb507d41e68
- [371] Robbie the Cobot lends our employees a helping hand. Ford Europe, 2022. https://fordeurope.blogspot.com/2022/05/robbie-collaborative-robot-helps-disabled-employees.html
- [372] O. Kardoudi, "Las operaciones asistidas por robots cirujanos reducen el tiempo de recuperación," El Confidencial. <u>https://www.elconfidencial.com/tecnologia/novaceno/2022-06-15/robots-cirujano-reduce-listas-espera-hospital\_3441854/</u>.
- [373] J. W. F. Catto et al., "Effect of Robot-Assisted Radical Cystectomy With Intracorporeal Urinary Diversion vs Open Radical Cystectomy on 90-Day Morbidity and Mortality Among Patients With Bladder Cancer," JAMA, vol. 327, no. 21, p. 2092, Jun. 2022, doi: 10.1001/jama.2022.7393.

- [374] "Innovations in Robotic Surgery 2020-2030: Technologies, Players & Markets: IDTechEx." https://www.idtechex.com/en/research-report/innovations-in-robotic-surgery-2020-2030-technologiesplayers-and-markets/724 (accessed Aug. 03, 2022).
- [375] B. Roston, "These Injectable Nanobots Can Walk Around Inside A Human Body," Slash Gear. https://www.slashgear.com/777282/these-injectable-nanobots-can-walk-around-inside-a-human-body/ (accessed Jul. 01, 2022).
- [376] Cameron. How Inrobics Rehab works, the first social robot to be considered a medical device in Europe. The Nation View, 2022. <u>https://thenationview.com/tech/25004.html</u>
- [377] J. C. Pulido, J. C. González, C. Suárez-Mejías, A. Bandera, P. Bustos, and F. Fernández, "Evaluating the Child-Robot Interaction of the NAOTherapist Platform in Pediatric Rehabilitation," Int. J. Soc. Robot., vol. 9, no. 3, pp. 343–358, Jun. 2017, doi: 10.1007/S12369-017-0402-2.
- [378] Oxipit Awarded CE Mark for the First Autonomous AI Medical Imaging Application. Oxipit, 2022. https://www.pr.com/press-release/858165
- [379] W Zheng et al. Design and experiment of online monitoring system for long-term culture of embry, Journal of Biomedical Engineering, 38(6): 1134-11432021, 2021. http://english.biomedeng.cn/article/10.7507/1001-5515.202107053
- [380] W. Zeng, Z. Zhao, Y. Yang, M. Zhou, B. Wang, and H. Sun, "Design and experiment of online monitoring system for long-term culture of embryo," Sheng Wu Yi Xue Gong Cheng Xue Za Zhi, vol. 38, no. 6, pp. 1134–1143, Dec. 2021, doi: 10.7507/1001-5515.202107053.
- [381] F. Dufour, "La dudosa ética del sexo con robots inteligentes: ¿eres infiel si te acuestas con una máquina?," El Mundo. https://www.elmundo.es/papel/futuro/2022/01/05/61cc46a921efa0ee618b4591.html (accessed Aug. 04, 2022).
- [382] P. Bloom and S. Harris, "It's Westworld. What's Wrong With Cruelty to Robots?," The New York Times. https://www.nytimes.com/2018/04/23/opinion/westworld-conscious-robots-morality.html (accessed Sep. 13, 2022).
- [383] N. Tiku, "Google engineer Blake Lemoine thinks its LaMDA AI has come to life," The Washington Post. https://www.washingtonpost.com/technology/2022/06/11/google-ai-lamda-blake-lemoine/ (accessed Jun. 27, 2022).
- [384] E. M. Bender, T. Gebru, A. McMillan-Major, and S. Shmitchell, "On the dangers of stochastic parrots: Can language models be too big?," FAccT 2021 - Proc. 2021 ACM Conf. Fairness, Accountability, Transpar., pp. 610-623, Mar. 2021, doi: 10.1145/3442188.3445922.
- [385] T. Gunja and A. Kulcke, "Hyperspectral Imaging Characterizes Healthy and Diseased Tissues During Surgery," Photonics. https://www.photonics.com/Article.aspx?AID=67800&refer=bioMonthly&utm\_source=bioMonthly\_2022\_0 6\_22&utm\_medium=email&utm\_campaign=bioMonthly&PID=1 (accessed Aug. 03, 2022).
- [386] M. Eslami et al., "Artificial intelligence for synthetic biology," Commun. ACM, vol. 65, no. 5, pp. 88–97, 2022, doi: 10.1145/3500922.
- [387] K. Miller, "Should AI Models Be Explainable? That depends.," Stanford University. https://hai.stanford.edu/news/should-ai-models-be-explainable-depends (accessed Aug. 05, 2022).
- [388] C. Hu, "This AI passed a nonverbal Turing test," Popular Science. https://www.popsci.com/technology/artificial-intelligence-nonverbal-turing-test/ (accessed Aug. 04, 2022).
- [389] F. Ciardo, D. De Tommaso, and A. Wykowska, "Human-like behavioral variability blurs the distinction between a human and a machine in a nonverbal Turing test," Sci. Robot., vol. 7, no. 68, Jul. 2022, doi: 10.1126/SCIROBOTICS.AB01241.
- [390] E. Parimbelli et al., "Trusting telemedicine: A discussion on risks, safety, legal implications and liability of involved stakeholders," Int. J. Med. Inform., vol. 112, pp. 90–98, Apr. 2018, doi: 10.1016/J.IJMEDINF.2018.01.012.

- [391] N. Diaz, "FDA warns about misuse of stroke AI detection technology," Becker's Health It. https://www.beckershospitalreview.com/healthcare-information-technology/fda-warns-about-misuse-ofstroke-ai-detection-technology.html (accessed Aug. 05, 2022).
- [392] K. D.Atherton, "How do you make AI trustworthy? Here's the Pentagon's plan." https://www.popsci.com/technology/dod-ai-trust/ (accessed Aug. 03, 2022).
- [393] "A.I. Is Mastering Language. Should We Trust What It Says?," The New York Times Magazine. https://www.nytimes.com/2022/04/15/magazine/ai-language.html (accessed Aug. 04, 2022).
- [394] C. Baraniuk, "Why we place too much trust in machines," BBC, 2021. https://www.bbc.com/future/article/20211019-why-we-place-too-much-trust-in-machines (accessed Oct. 27, 2021).
- [395] G. Juravle, A. Boudouraki, M. Terziyska, and C. Rezlescu, "Trust in artificial intelligence for medical diagnoses," Prog. Brain Res., vol. 253, pp. 263–282, Jan. 2020, doi: 10.1016/BS.PBR.2020.06.006.
- [396] A Face Search Engine Anyone Can Use Is Alarmingly Accurate. NYT, 2022. https://www.nytimes.com/2022/05/26/technology/pimeyes-facial-recognition-search.html
- [397] The impact of artificial intelligence on the doctor-patient relationship. Council of Europe's Steering Committee for Human Rights in the fields of Biomedicine and Health (CDBIO), 2022. https://www.coe.int/en/web/bioethics/developing-a-report-on-the-application-of-ai-in-healthcare-inparticular-regarding-its-impact-on-the-doctor-patient-relationship (accessed Sep. 09, 2022).
- [398] B. Forrest, "Ukraine Has Deployed 1,000 People to Investigate Alleged War Crimes in Bucha," The Wall Street Journal. https://www.wsj.com/articles/ukrainians-use-drones-facial-recognition-software-as-they-investigate-alleged-war-crimes-11649767154 (accessed Aug. 04, 2022).
- [399] P. Dave, J. Dustin. Exclusive: Ukraine has started using Clearview AI's facial recognition during war. Reuters, 2022. https://www.reuters.com/technology/exclusive-ukraine-has-started-using-clearview-aisfacial-recognition-during-war-2022-03-13/
- [400] K. D. Atherton, "The basics of electronic warfare, explained," Popular Science. https://www.popsci.com/technology/russia-electronic-warfare-explained/ (accessed Aug. 04, 2022).
- [401] P. Tucker. AI Is Already Learning from Russia's War in Ukraine, DOD Says. Defense One, 2022. https://www.defenseone.com/technology/2022/04/ai-already-learning-russias-war-ukraine-dodsays/365978/
- [402] S. Budnitsky, "Kremlin tightens control over Russians' online lives threatening domestic freedoms and the global internet," The Conversation. https://theconversation.com/kremlin-tightens-control-over-russians-online-lives-threatening-domestic-freedoms-and-the-global-internet-182020 (accessed Jul. 22, 2022).
- [403] L. Pigman, "Russia's vision of cyberspace: a danger to regime security, public safety, and societal norms and cohesion," J. Cyber Policy, vol. 4, no. 1, pp. 22–34, Jan. 2019, doi: 10.1080/23738871.2018.1546884.
- [404] S. Budnitsky, "Russia's great power imaginary and pursuit of digital multipolarity," Internet Policy Rev., vol. 9, no. 3, pp. 1–25, 2020, doi: 10.14763/2020.3.1492.
- [405] A. Tselikov, "The Tightening Web of Russian Internet Regulation," SSRN Electron. J., Nov. 2014, doi: 10.2139/SSRN.2527603.
- [406] A Sharma. Mark Zuckerberg teases new smart glasses project and wearable technology, N Business, 2022. https://www.thenationalnews.com/business/technology/2022/05/04/mark-zuckerberg-teases-new-smart-glasses-project-and-wearable-technology/
- [407] P Dave, Y Malik. Google's second try at computer glasses translates conversations in real time. Reuters, 2022. https://www.reuters.com/technology/google-unveils-artificial-intelligence-tool-real-worldsearches-2022-05-11/
- [408] W. Fulton. Best smart glasses of 2022. Popular Science, 2022. <u>https://www.popsci.com/reviews/best-smart-glasses/</u>
- [409] The Best Smart Glasses and AR Specs of 2022. Art Labs, 2021. https://artlabs.ai/blog/the-best-smart-glasses-and-ar-specs-of-2021.

- [410] Today, I wore Mojo Lens...and saw the future. The Mojo Blog, 2022. https://www.mojo.vision/news/today-i-wore-mojo-lens
- [411] C. Hu, "MIT's smart material can sense how your body moves," Popular Science. https://www.popsci.com/technology/mit-smart-textile-pressure/ (accessed Jul. 22, 2022).
- [412] S Feingold. Robot football: How the 'beautiful game' has advanced AI and automation. Worls Economic Forum, 2022. <u>https://www.weforum.org/agenda/2022/09/robot-football-advance-artificial-intelligence-and-automation/</u>
- [413] M. Savage, "Can apps manage our chronic health conditions?," BBC, 2021. https://www.bbc.com/news/business-58556777 (accessed Oct. 27, 2021).
- [414] F. Menczer, "How 'engagement' makes you vulnerable to manipulation and misinformation on social media," The conversation, 2021. https://theconversation.com/how-engagement-makes-you-vulnerable-to-manipulation-and-misinformation-on-social-media-145375 (accessed Oct. 27, 2021).
- [415] B. Guild and A. Caren, "How to identify— and avoid— misinformation tactics in the wellness community," The Washington Post, 2021. https://www.washingtonpost.com/video/national/how-to-identify-and-avoid-misinformation-tactics-in-the-wellness-community/2021/10/22/744c2011-4b10-4bb2-b6ad-81fb26292c19\_video.html (accessed Oct. 27, 2021).
- [416] J. E. Brody, "We Could All Use a Health Coach," The New York Times, 2021. https://www.nytimes.com/2021/06/07/well/live/health-coach-benefits.html (accessed Oct. 27, 2021).
- [417] Z. Obermeyer, B. Powers, C. Vogeli, and S. Mullainathan, "Dissecting racial bias in an algorithm used to manage the health of populations," Science (80-. )., vol. 366, no. 6464, pp. 447–453, Oct. 2019, doi: 10.1126/SCIENCE.AAX2342.
- [418] B. Chakravorti, "Why AI Failed to Live Up to Its Potential During the Pandemic," Harvard Business Review. https://hbr.org/2022/03/why-ai-failed-to-live-up-to-its-potential-during-the-pandemic (accessed Sep. 08, 2022).
- [419] W. D. Heaven, "Hundreds of AI tools have been built to catch covid. None of them helped. | MIT Technology Review," MIT Technology Review. https://www.technologyreview.com/2021/07/30/1030329/machine-learning-ai-failed-covid-hospitaldiagnosis-pandemic/ (accessed Sep. 08, 2022).
- [420] "AI and control of Covid-19 coronavirus," Council of Europe. https://www.coe.int/en/web/artificialintelligence/ai-and-control-of-covid-19-coronavirus (accessed Sep. 08, 2022).
- [421] A. Marin, "Telemedicine takes center stage in the era of COVID-19 | Science | AAAS," Science. https://www.science.org/content/article/telemedicine-takes-center-stage-era-covid-19 (accessed Sep. 08, 2022).
- [422] L. M. Koonin et al., "Trends in the Use of Telehealth During the Emergence of the COVID-19 Pandemic
   United States, January-March 2020," MMWR. Morb. Mortal. Wkly. Rep., vol. 69, no. 43, pp. 1595–1599, Oct. 2020, doi: 10.15585/MMWR.MM6943A3.
- [423] C. Kruse and K. Heinemann, "Facilitators and Barriers to the Adoption of Telemedicine During the First Year of COVID-19: Systematic Review," J. Med. Internet Res., vol. 24, no. 1, Jan. 2022, doi: 10.2196/31752.
- [424] M. Breton et al., "Telehealth challenges during COVID-19 as reported by primary healthcare physicians in Quebec and Massachusetts," BMC Fam. Pract., vol. 22, no. 1, pp. 1–13, Dec. 2021, doi: 10.1186/S12875-021-01543-4/TABLES/5.
- [425] G. Nittari, D. Savva, D. Tomassoni, S. K. Tayebati, and F. Amenta, "Telemedicine in the COVID-19 Era: A Narrative Review Based on Current Evidence," Int. J. Environ. Res. Public Health, vol. 19, no. 9, May 2022, doi: 10.3390/IJERPH19095101.
- [426] A. S. Miner, L. Laranjo, and A. B. Kocaballi, "Chatbots in the fight against the COVID-19 pandemic," NPJ Digit. Med. 2020 31, vol. 3, no. 1, pp. 1–4, May 2020, doi: 10.1038/s41746-020-0280-0.
- [427] S. Thomas, A. Abraham, J. Baldwin, S. Piplani, and N. Petrovsky, "Artificial Intelligence in Vaccine and Drug Design," Methods Mol. Biol., vol. 2410, pp. 131–146, 2022, doi: 10.1007/978-1-0716-1884-4\_6.

[428] "How a Novel 'Incubation Sandbox' Helped Speed Up Data Analysis in Pfizer's COVID-19 Vaccine Trial," Pfizer. https://www.pfizer.com/news/articles/how\_a\_novel\_incubation\_sandbox\_helped\_speed\_up\_data\_analysis

[429] G. Ratman, "China's amassing of genomic data highlights global biotech race - Center for Security and Emerging Technology," Center for Security and Emerging Technology. https://cset.georgetown.edu/article/chinas-amassing-of-genomic-data-highlights-global-biotech-race/ (accessed Sep. 08, 2022).

in pfizer s covid 19 vaccine trial (accessed Sep. 08, 2022).

- [430] "One hundred days of war has put Ukraine's health system under severe pressure," World Health Organization. https://www.who.int/news/item/03-06-2022-one-hundred-days-of-war-has-put-ukraine-shealth-system-under-severe-pressure (accessed Sep. 08, 2022).
- [431] G. De Vynck, R. Lerman, and C. Zakrzewski, "How are Ukrainians still online one month into the war?," The Washington Post. https://www.washingtonpost.com/technology/2022/03/29/ukraine-internet-faq/ (accessed Sep. 08, 2022).
- [432] I. Velicer, "How Virtual Healthcare Services Are Coming To The Aid Of Ukraine," Health Policy Watch. https://healthpolicy-watch.news/virtual-healthcare-ukraine/ (accessed Sep. 08, 2022).
- [433] G. Bowsher et al., "eHealth for service delivery in conflict: a narrative review of the application of eHealth technologies in contemporary conflict settings," Health Policy Plan., vol. 36, no. 6, pp. 974–981, Jun. 2021, doi: 10.1093/HEAPOL/CZAB042.
- [434] "Mental health needs grow in Ukraine after 100 days of war," Medicins Sans Frontieres. https://www.msf.org/mental-health-needs-grow-ukraine-after-100-days-war (accessed Sep. 08, 2022).
- [435] G. Martinic, "Glimpses of future battlefield medicine The proliferation of robotic surgeons and unmanned vehicles and technologies," J. Mil. Veterans. Health, vol. 22, no. 3, pp. 4–12, 2014.
- [436] "The digital doctor: how electronic health records are transforming health care in Ukraine," EU4Digital. https://eufordigital.eu/the-digital-doctor-how-electronic-health-records-are-transforminghealth-care-in-ukraine/ (accessed Sep. 08, 2022).
- [437] "Safeguarding Ukraine's data to preserve its present and build its future," Amazon. https://www.aboutamazon.eu/news/aws/safeguarding-ukraines-data-to-preserve-its-present-and-buildits-future (accessed Sep. 08, 2022).
- [438] D. Sofer, "Health Care Workers Continue to Be Targeted in Conflict Zones," Am. J. Nurs., vol. 119, no. 7, p. 12, Jul. 2019, doi: 10.1097/01.NAJ.0000569376.96271.76.
- [439] "New Evidence that Biometric Data Systems Imperil Afghans," Human Rights Watch. https://www.hrw.org/news/2022/03/30/new-evidence-biometric-data-systems-imperil-afghans (accessed Sep. 08, 2022).
- [440] P. Dave, "Ukraine uses facial recognition to identify dead Russian soldiers, minister says," Reuters. https://www.reuters.com/technology/ukraine-uses-facial-recognition-identify-dead-russian-soldiersminister-says-2022-03-23/ (accessed Sep. 08, 2022).
- [441] D. Harwell, "Ukraine using ClearviewAI facial recognition to identify Russian war dead," The Washington Post. https://www.washingtonpost.com/technology/2022/04/15/ukraine-facial-recognitionwarfare/ (accessed Sep. 08, 2022).
- [442] "Neurotechnologies and Human Rights Framework: do we need new rights?," Council of Europe. https://www.coe.int/en/web/bioethics/round-table-on-the-human-rights-issues-raised-by-the-applicationsof-neurotechnologies (accessed Sep. 09, 2022).
- [443] "Strategic Action Plan," Council of Europe. https://www.coe.int/en/web/bioethics/strategic-action-plan (accessed Sep. 09, 2022).
- [444] A. Nordberg, L. Antunes. Genome Editing in Humans. A survey of law, regulation and governance principles. European Parliamentary Research Service, Scientific Foresight Unit, 2022. https://www.europarl.europa.eu/RegData/etudes/STUD/2022/729506/EPRS\_STU(2022)729506\_EN.pdf
- [445] World Health Organization, "Digital solutions to health risks raised by the COVID-19 infodemic," 2022.

- [446] "Advanced Research Projects Agency for Health (ARPA-H)," The White House.
   https://www.whitehouse.gov/ostp/advanced-research-projects-agency-for-health-arpa-h/ (accessed Sep. 29, 2022).
- [447] M. Pacheco, "Ethics in AI feature high at pioneering hearing," Brussels Morning, 2021. https://brusselsmorning.com/ethics-in-ai-feature-high-at-pioneering-hearing/7938/ (accessed Sep. 15, 2022).
- [448] E. Biundo, A. Pease, K. Seggers, M. de Groote, T. D'Argent, and E. de Schaetzen, "The socio-economic impact of AI in healthcare," Deloitte, no. October, pp. 1–48, 2020, [Online]. Available: https://www2.deloitte.com/content/dam/Deloitte/be/Documents/life-sciences-health-care/Deloitte Belgium \_ MedTech\_Socio-economic impact of AI in healthcare.pdf.
- [449] "Mental health and related issues statistics," Eurostat- Statistics Explained. https://ec.europa.eu/eurostat/statisticsexplained/index.php?title=Mental\_health\_and\_related\_issues\_statistics (accessed Sep. 08, 2022).
- [450] "WHO European Framework for Action on Mental Health," World Health Organization, 2021, Accessed: Sep. 08, 2022. [Online]. Available: http://apps.who.int/bookorders.
- [451] "File:Causes of death mental and behavioural disorders, residents, 2017 Health20.png," Eurostat
   Statistics Explained. https://ec.europa.eu/eurostat/statisticsexplained/index.php?title=File:Causes\_of\_death\_— \_\_mental\_and\_behavioural\_disorders,\_residents,\_2017\_Health20.png (accessed Sep. 08, 2022).
- [452] "The State of the World's Children 2021," UNICEF. https://www.unicef.org/reports/state-worldschildren-2021 (accessed Sep. 08, 2022).
- [453] M. É. Czeisler et al., "Mental Health, Substance Use, and Suicidal Ideation During the COVID-19 Pandemic — United States, June 24–30, 2020," MMWR. Morb. Mortal. Wkly. Rep., vol. 69, no. 32, pp. 1049–1057, Aug. 2022, doi: 10.15585/MMWR.MM6932A1.
- [454] "New CDC data illuminate youth mental health threats during the COVID-19 pandemic," Centers for Disease Control and Prevention. https://www.cdc.gov/media/releases/2022/p0331-youth-mental-health-covid-19.html (accessed Sep. 08, 2022).
- [455] J. Pirkis et al., "Suicide numbers during the first 9-15 months of the COVID-19 pandemic compared with pre-existing trends: An interrupted time series analysis in 33 countries," eClinicalMedicine, vol. 51, no. 1, p. 101573, Sep. 2022, doi: 10.1016/J.ECLINM.2022.101573.
- [456] "Telehealth is here to stay," Nat. Med. 2021 277, vol. 27, no. 7, pp. 1121–1121, Jul. 2021, doi: 10.1038/s41591-021-01447-x.
- [457] S. Mageit, "The European digital health revolution in the wake of COVID-19," Healthcare IT News. https://www.healthcareitnews.com/news/emea/european-digital-health-revolution-wake-covid-19 (accessed Sep. 08, 2022).
- [458] K. Lam, A. D. Lu, Y. Shi, and K. E. Covinsky, "Assessing Telemedicine Unreadiness Among Older Adults in the United States During the COVID-19 Pandemic," JAMA Intern. Med., vol. 180, no. 10, pp. 1389–1391, Oct. 2020, doi: 10.1001/JAMAINTERNMED.2020.2671.
- [459] W. S. Carus, "A Short History of Biological Warfare: From Pre-History to the 21 st Century," no. December, p. 5, 2017.
- [460] J. Guillemin, "Scientists and the history of biological weapons: A brief historical overview of the development of biological weapons in the twentieth century," EMBO Rep., vol. 7, no. SUPPL. 1, pp. 5–9, 2006, doi: 10.1038/sj.embor.7400689.
- [461] A. Cohen, E. Robenshtok, E. Rotman, and R. Sagi, "The history of biological warfare," Harefuah, vol. 141 Spec N, pp. 7–12, 124, 2002, doi: 10.1038/sj.embor.embor.849.
- [462] World Health Organization, "Biological weapons." https://www.who.int/health-topics/biologicalweapons#tab=tab\_1 (accessed Sep. 12, 2022).
- [463] "Minimizing health risks at airports, ports and ground crossings." https://www.who.int/activities/minimizing-health-risks-at-airports-ports-and-ground-crossings (accessed Sep. 12, 2022).

[464] "Animal agrocrime and agroterrorism," Interpol.

https://www.interpol.int/Crimes/Terrorism/Bioterrorism/Animal-agrocrime-and-agroterrorism (accessed Sep. 12, 2022).

- [465] M. J. Fagel and K. Hamilton, "Agroterrorism," Cris. Manag. Emerg. Plan. Prep. Today's Challenges, vol. 51, no. April, pp. 461–485, 2013, doi: 10.1201/b16072.
- [466] J. A. Lockwood, "Insects: tougher than anthrax," The Boston Globe. http://archive.boston.com/news/globe/ideas/articles/2007/10/21/insects\_tougher\_than\_anthrax/ (accessed Sep. 12, 2022).
- [467] "One Health," World Health Organization. https://www.who.int/news-room/questions-and-answers/item/one-health (accessed Sep. 12, 2022).
- [468] E. Gómez-González and J. M. Navas, "COVID-19 may improve our CBRNE detection capabilities," NCT Mag., 2022, Accessed: Sep. 09, 2022. Available: <u>https://nct-magazine.com/nct-magazine-june-2022/covid-19-may-improve-our-cbrne-detection-capabilities</u>.
- [469] M. E. Kambouris, "Genomics in biosecurity : principles and applications of genomic technologies in expanded biosecurity concepts". Elsevier, 2021.
- [470] "What are the Ethical Concerns of Genome Editing?," National human genome research institute. https://www.genome.gov/about-genomics/policy-issues/Genome-Editing/ethical-concerns (accessed Sep. 08, 2022).
- [471] "What do People Think About Genome Editing?," National human genome research institute. https://www.genome.gov/about-genomics/policy-issues/Genome-Editing/public-opinion (accessed Sep. 08, 2022).
- [472] M. P. de la Paz, "Autism spectrum disorders in the European Union (ASDEU)," asdeu, pp. 1–13, 2018.
- [473] E. S. Lander et al., "Initial sequencing and analysis of the human genome," Nat. 2001 4096822, vol. 409, no. 6822, pp. 860–921, Feb. 2001, doi: 10.1038/35057062.
- [474] S. Nurk et al., "The complete sequence of a human genome," Science (80-. )., vol. 376, no. 6588, pp. 44–53, Apr. 2022, doi: 10.1126/science.abj6987.
- [475] "What is a gene?" MedlinePlus. https://medlineplus.gov/genetics/understanding/basics/gene/ (accessed Sep. 08, 2022).
- [476] "Definition of gene", National Cancer Institute. https://www.cancer.gov/publications/dictionaries/genetics-dictionary/def/gene (accessed Sep. 08, 2022).
- [477] T. A. Brown, Genomes, Second. Oxford: Garland Science, 2002.
- [478] C. Koch, "Does Brain Size Matter?," Scientific American. https://www.scientificamerican.com/article/does-brain-size-matter1/ (accessed Sep. 08, 2022).
- [479] S. DeWeerdt, "How to map the brain," Nature, vol. 571, no. 7766, pp. S6–S8, Jul. 2019, doi: 10.1038/D41586-019-02208-0.
- [480] E. Lüders, H. Steinmetz, and L. Jäncke, "Brain size and grey matter volume in the healthy human brain," Neuroreport, vol. 13, no. 17, pp. 2371–2374, 2002, doi: 10.1097/00001756-200212030-00040.

## List of acronyms and abbreviations

Acronyms and abbreviations employed in this Report and related references are listed here. It is important to note that some of them are also used -with the same or different meaning and expression- in other contexts of science and technology, even in areas related to Medicine, Healthcare and Wellbeing.

- AI Artificial Intelligence
- AR Augmented Reality
- ASD Autism Spectrum Disorder
- BARDA Biomedical Advanced Research and Development Authority (of the USA)
- BCI Brain Computer Interfaces
- CAD/CADx Computer Aided Diagnosis
- CADe Computer Aided Detection
- CBRNE/CBRNe Chemical, biological, radioactive, nuclear and explosive (agents, devices, events). When the letter 'e' is written in lower case, it refers to improvised explosives (as opposed to military and industrial ones).
- CDC Center for Disease Control (USA)
- CDSS Clinical Decision Support System
- CoE Council of Europe
- CNN Convolutional Neural Networks
- COVID-19 Coronavirus disease 2019
- CT Computed Tomography
- CTPN Counter Terrorism Preparedness Network (international collaboration)
- DIY Do-It-Yourself
- DL Deep Learning
- DNA Deoxyribonucleic acid
- DS Decision Support
- DTC Direct-to-Consumer (genetic) test
- EC European Commission
- ECDC European Center for Disease Control (of the EU)
- ED Emergency Department
- HER Electronic Health Record
- EU European Union
- EU-27 The 27 member countries of the EU (as economic group, for statistical purposes).
- EUROPOl European Union Agency for Law Enforcement Cooperation
- FDA Food and Drug Administration (USA)
- GDPR General Data Protection Regulation
- HCI Human-Computer Interaction/Interface
- HERA Health Emergency Response Authority (EU)
- HR Human Rights
- ICT Information and Communication Technologies

ICU	Intensive Care Unit
IGS	Image Guided Surgery
INTERPOL	International Criminal Police Organization
101	Intra-Operative Imaging (during a surgical procedure)
10	Intra-Operative (inside the OR, during the procedure)
IoT	Internet Of Things
IT	Information and Telecommunications
Infodemic	Information pandemic
IMDRF	International Medical Device Regulators Forum
JRC	Joint Research Centre (of the European Commission)
(L)AWS	(Lethal) Autonomous Weapons System
ML	Machine Learning
MR(I)	Magnetic Resonance (Imaging)
NATO	North Atlantic Treaty Organization
NCT	Non-conventional threat
OR	Operating Room
PCR	Polymerase chain reaction (test)
PET	Positron Emission Tomography
R&D	Research and Development
R&D&I	Research and Development and Innovation
RBG	Red, Blue, Green (color coding)
SaMD	Software as a Medical Device
SAR/SR	Socially Assistive Robot, Social Robot
SARS-CoV	/-2 Synthetic acute respiratory syndrome coronavirus 2
SME	Small and Medium Enterprise
SW	Software
TAL	Technology Availability Level
TRL	Technology Readiness Level
UN	United Nations
UNESCO	United Nations Educational, Scientific and Cultural Organization
UNICRI	United Nations Interregional Crime and Justice Research Institute
USA	United States of America
VR	Virtual Reality
WHO	World Health Organization
WIPO	World International Patent Organization
W/MΔ	World Medical Association

WMA World Medical Association

# List of definitions

In the context of this Report, the terms listed as follows are to be understood as declared in this section. Their definitions are quoted from the indicated references and links.

Agroterrorism	Subset of agrocrime, understood as terrorist attacks directed against crops and livestock, in an effort to disrupt a population's economy and food supply.
	Reference: <a href="https://www.interpol.int/Crimes/Terrorism/Bioterrorism/Animal-agrocrime-and-agroterrorism">https://www.interpol.int/Crimes/Terrorism/Bioterrorism/Animal-agrocrime-and-agroterrorism</a> agroterrorism
Animal agrocrime	Unlawful act or omission concerning animals or animal products that violates legislation, and has negative consequences on animal health, animal welfare, public health, food safety, food authenticity or national security.
	Reference: <a href="https://www.interpol.int/Crimes/Terrorism/Bioterrorism/Animal-agrocrime-and-agroterrorism">https://www.interpol.int/Crimes/Terrorism/Bioterrorism/Animal-agrocrime-and-agroterrorism</a> agroterrorism
Big Data	Digital data that, through its volume or complexity, surpasses human analytical abilities and traditional data processing methods.
	Reference: <a href="https://en.unesco.org/courier/2018-3/lexicon-artificial-intelligence">https://en.unesco.org/courier/2018-3/lexicon-artificial-intelligence</a> and <a href="https://en.wikipedia.org/wiki/Big_data">https://en.wikipedia.org/wiki/Big_data</a>
Bioterrorism	Deliberate release of viruses, bacteria, toxins or other harmful agents to cause illness or death in people, animals or plants.
	Reference: https://www.interpol.int/Crimes/Terrorism/Bioterrorism
CRISPR	Clustered Regularly Interspaced Short Palindromic Repeats. Set of techniques used to target specific stretches of genetic code and to edit DNA at precise locations. Using CRISPR techniques, it is possible to modify genes in living cells and organisms [by removing, adding, or replacing DNA sequences]. CRISPR is considered as simpler, faster, cheaper, and more accurate than older genome editing methods.
	Reference: <a href="https://www.broadinstitute.org/what-broad/areas-focus/project-spotlight/questions-and-answers-about-crispr">https://www.broadinstitute.org/what-broad/areas-focus/project-spotlight/questions-and-answers-about-crispr</a> and <a href="https://www.genome.gov/about-genomics/policy-issues/what-is-Genome-Editing">https://www.broadinstitute.org/what-broad/areas-focus/project-spotlight/questions-and-answers-about-crispr</a> and <a href="https://www.genome.gov/about-genomics/policy-issues/what-is-Genome-Editing">https://www.genome.gov/about-genomics/policy-issues/what-is-Genome-Editing</a>
Declaration of Geneva	World Medical Association's (WMA) policy adopted by the Second General Assembly in Geneva in 1947. It builds on the principles of the Hippocratic Oath and remains as one of the most consistent documents of the WMA. With only very few and careful revisions over many decades, it safeguards the ethical principles of the medical profession, relatively uninfluenced by zeitgeist and modernism'. The WMA furthers states that 'the Oath should not be read alone, but in parallel with the more specific and detailed policies of the WMA especially the International Code of Medical Ethics, which followed the Declaration of Geneva as early as 1948'.
	Reference:         https://www.wma.net/what-we-do/medical-ethics/declaration-of-geneva/           https://www.wma.net/policies-post/wma-international-code-of-medical-ethics/
Deep Learning	Machine learning technique based on neural networks and large scale data sets.
Deoxyribonucle ic acid	Hereditary material in humans and almost all other organisms. Nearly every cell in a person's body has the same DNA. Most DNA is located in the cell nucleus (where it is called nuclear DNA), but a small amount of DNA can also be found in the mitochondria (where it is called mitochondrial DNA or mtDNA). Reference: https://medlineplus.gov/genetics/understanding/basics/dna/
Digital Health	Use of digital technologies in healthcare, including categories such as mobile health (mHealth), health information technology, wearable devices, telehealth and telemedicine, and personalized medicine. potential to improve the ability to Digital health technologies use

computing platforms, connectivity, software, and sensors for health care and related uses. These technologies span a wide range of uses, from applications in general wellness to applications as a medical device. They include technologies intended for use as a medical product, in a medical product, as companion diagnostics, or as an adjunct to other medical products (devices, drugs, and biologics). They may also be used to develop or study medical products.

Reference: <u>https://www.who.int/behealthy/digital-health</u> ; <u>https://www.fda.gov/medical-</u> <u>devices/digital-health-center-excellence/what-digital-health</u>

Disinformation Information that is false and deliberately created to harm a person, social group, organization or country.

Reference: <u>https://en.unesco.org/fightfakenews</u>

eHealth Use of information and communication technologies (ICT) for health.

Reference: https://www.who.int/ehealth/en/

Genome Entire set of DNA instructions found in a cell. In humans, the genome consists of 23 pairs of chromosomes located in the cell's nucleus, as well as a small chromosome in the cell's mitochondria. A genome contains all the information needed for an individual to develop and function ... The human genome contains about 3 billion nucleotides.

Reference: <u>https://www.genome.gov/genetics-glossary/Genome</u>

Genome (or Method for changing the DNA of organisms, including plants, bacteria, and animals. Editing gene) editing DNA can lead to changes in physical traits, like eye color, and disease risk ... Genome editing technologies ... act like scissors, cutting the DNA at a specific spot. Then scientists can remove, add, or replace the DNA where it was cut.

Reference: https://www.genome.gov/about-genomics/policy-issues/what-is-Genome-Editing

Germ line Sex cells (eggs and sperm) that sexually reproducing organisms use to pass on their genomes from one generation to the next (parents to offspring). Egg and sperm cells are called germ cells, in contrast to the other cells of the body, which are called somatic cells.

Reference: https://www.genome.gov/genetics-glossary/germ-line

Global Health The Global Health Ethics Unit from the World Health Organization 'provides a focal point for Ethics The examination of ethical issues raised by activities throughout the Organization. The unit also supports Member States in addressing ethical issues that arise in their own countries. This includes a range of global bioethics topics; from public health surveillance to developments in genomics, and from research with human beings to fair access to health services'.

https://www.who.int/ethics/en/

Health As defined by the World Health Organization, *Health is a state of complete physical, mental and social well-being and not merely the absence of disease or infirmity.* 

The Universal Declaration of Human Rights states, in its 25th Article, that *Everyone has the right to a standard of living adequate for the health and well-being of himself and of his family, including food, clothing, housing and medical care* [...]'.

Reference: https://www.un.org/en/universal-declaration-human-rights/index.html

The World Health Organization Constitution was the first international instrument to enshrine the enjoyment of the highest attainable standard of health as a fundamental right of every human being ('the right to health').

Reference: https://www.who.int/en/news-room/fact-sheets/detail/human-rights-and-health

Hybrid threats Metaphor that brings complexities and dilemmas related to a changing global environment

	to the fore. It is often used interchangeably with references to hybrid war, to capture the interconnected nature of challenges (i.e. ethnic conflict, terrorism, migration, and weak institutions), multiplicity of actors involved (i.e. regular and irregular forces, criminal groups) and diversity of conventional and unconventional means used (i.e. military, diplomatic, technological).
	Reference: https://www.europarl.europa.eu/RegData/etudes/ATAG/2015/564355/EPRS_ATA(2015)56435 5_EN.pdf
Infodemic	Or Information Epidemic. The spread of excessive, false, and misleading information on COVID-19, causing reduced effectiveness of national response efforts, threatening lives and livelihoods of populations, and encouraging risk-taking behaviors that can seriously harm health and lead to mistrust in health authorities.
	References:https://cdn.who.int/media/docs/librariesprovider2/country-sites/who-digital- synthesis-doc v5a i.pdf?sfvrsn=1dc34e0 1&download=true
In-silico	Medical, biological research performed on computer or via computer simulation, that is, 'in chips', as opposed to being conducted in living organisms (in-vivo) or in a laboratory environment outside living organisms (in-vitro).
	Reference: https://en.wikipedia.org/wiki/In_silico
In-vitro	Medical, biological research performed outside living organisms, that is, 'within the glass', in a laboratory environment as opposed to being conducted in living organisms (in-vivo).
	Reference: https://en.wikipedia.org/wiki/In_vitro
In-vivo	Medical, biological research performed in living organisms.
	Reference: https://en.wikipedia.org/wiki/In_vivo
International Medical Device Regulators Forum	Group of medical device regulators from around the world that have voluntarily come together to harmonize the regulatory requirements for medical products that vary from country to country. Their current members represent medical device regulatory authorities in many countries. The European member is the European Commission Directorate-General for Internal Market, Industry, Entrepreneurship and SMEs. The USA member is the Food and Drug Administration. The World Health Organization is an Official Observer.
	Reference: <u>https://www.fda.gov/medical-devices/cdrh-international-programs/international-</u> medical-device-regulators-forum-imdrf
Machine Learning	Machine Learning is a branch of artificial intelligence (AI) and computer science which focuses on development of systems that are able to learn and adapt without following explicit instructions imitating the way that humans learn, gradually improving its accuracy, by using algorithms and statistical models to analyse and draw inferences from patterns in data.
	Reference: https://data.europa.eu/doi/10.2760/860665
Mal- information	Information that is based on reality, used to inflict harm on a person, social group, organization or country.
	Reference: <u>https://en.unesco.org/fightfakenews</u>
Medicine	Science and practice of establishing the diagnosis, prognosis, treatment, and prevention of disease. Medicine encompasses a variety of healthcare practices evolved to maintain and restore health by the prevention and treatment of illness.
	Reference: https://en.wikipedia.org/wiki/Medicine
Misinformation	Information that is false but not created with the intention of causing barm

Misinformation Information that is false but not created with the intention of causing harm.

Reference: <u>https://en.unesco.org/fightfakenews</u>

Nonconventional Broad term to include threats to security of (mainly) non-military origin, such as climate change, resource scarcity, infectious diseases, natural disasters, irregular migration, drug trafficking, information security and transnational crime. It usually refers to chemical, biological, radioactive, and nuclear (CBRN) agents and events, and it can also include improvised explosives (CBRNe).

Reference: [15]

One Health Integrated, unifying approach to balance and optimize the health of people, animals and the environment. It is particularly important to prevent, predict, detect, and respond to global health threats such as the COVID-19 pandemic. The approach mobilizes multiple sectors, disciplines and communities at varying levels of society to work together. This way, new and better ideas are developed that address root causes and create long-term, sustainable solutions. One Health involves the public health, veterinary, public health and environmental sectors. The One Health approach is particularly relevant for food and water safety, nutrition, the control of zoonoses, pollution management, and combatting antimicrobial resistance.

Reference: https://www.who.int/news-room/questions-and-answers/item/one-health

Social Impact Risks, uncertainties, ethical dilemmas and other issues (besides economical, scientific or (of a technological impacts) that come together with technological innovations and may affect the society at any level, from individuals to structured groups and states. The social impact of a technology may influence – and even determine– its acceptance, rejection, or modification.

References: [12]

Software as a The International Medical Device Regulators Forum (IMDRF) defines it as 'software intended Medical Device The used for one or more medical purposes that performs these purposes without being part of a hardware medical device'. Use of Software as a Medical Device is continuing to increase. It can be used across a broad range of technology platforms, including medical device platforms, commercial 'off-the-shelf' platforms, and virtual networks, to name a few. Such software was previously referred to by industry, international regulators, and health care providers as 'standalone software', 'medical device software' and/or 'health software', and can sometimes be confused with other types of software.

 Reference:
 https://www.fda.gov/medical-devices/digital-health/software-medical-device 

 samd

SustainableUnited Nations define them as the blueprint to achieve a better and more sustainable futureDevelopmentfor all. They address the global challenges we face, including those related to poverty,Goalsinequality, climate, environmental degradation, prosperity, and peace and justice. Health is<br/>the Sustainable Goal number 3.

Reference: https://www.un.org/sustainabledevelopment/sustainable-development-goals/

The GlobalEmerging term (used by the World Bank) to refer to countries located in Asia, Africa, LatinSouthAmerica and the Caribbean and considered to have low and middle income. The GlobalSouth is one half of the global North-South divide and does not necessarily refer to<br/>geographical south. Most people in the Global South live within the Northern Hemisphere

Reference: https://en.wikipedia.org/wiki/Global South

The Goal of<br/>HealthSustainable Goal number 3 of the United Nations needed to ensure healthy lives and<br/>promote well-being for all at all ages.

Reference: <a href="https://www.un.org/sustainabledevelopment/health/">https://www.un.org/sustainabledevelopment/health/</a>

The West Emerging term used in analogy to The Global South by the World Bank. It refers to countries

located in Europe, North America and other regions considered to have high income. The West does not necessarily refer to geographical west.

Universal One of the Sustainable Development Goals agreed by Member States of the United Nations Health to try to achieve by 2030. UHC means that all individuals and communities receive the health services they need without suffering financial hardship. It includes the full spectrum of essential, quality health services, from health promotion to prevention, treatment, rehabilitation, and palliative care.

> Reference:
>  https://www.who.int/news-room/fact-sheets/detail/universal-health-coverage-(uhc)

# List of figures

Figure 1. Classification of AI and AI-mediated technologies in Medicine and Healthcare according to their
ethical and social impact. SW: software, AR: augmented reality, VR: virtual reality, IoT: internet of things. TAL:
Technology Availability Level

**Figure 2**. 3D color-coding maps suitable for representation of technology evaluation scales. A shows the common RGB color space in cube geometry. B depicts the hue-saturation-lightness (HIS) color space in cylindrical symmetry. C shows the hue-chroma-value (HCV) color space in conical geometry. 11

**Figure 3.** Ethical and social aspects of AI and AI-mediated technologies in Medicine, Healthcare and Wellbeing sorted in three groups (G1, G2, and G3). Some key relevant issues, controversies, significant, and conflicting issues are outlined for each aspect. 14

# List of tables

<b>'able 1</b> . Definition, steps, numerical values, and description of the proposed Technology Controversy Level TCL) scale. Color shades may be modified (within their overall tone) according to printing or visualization levices to assure correct identification. RGB color codes are given in 8-bit description (from 0 to 255)	7
<b>able 2</b> . Summary of features for the proposed evaluation of the social impact of a technology. SDG = Sustainable Development Goal (of the UN)	.0
<b>able 3</b> . Literature update on AI systems in medicine, healthcare and wellbeing and their ethical and societa npact by alphabetic order of topics	
able 4. Technology assessment of 'Use-Case 1: AI tools for mental health'. Values in arbitrary units	25
able 5. Technology assessment of 'Use-Case 2: AI-mediated gene editing. Values in arbitrary units	28
<b>able 6.</b> Technology assessment of 'Use-Case AI-mediated epidemiological monitoring of the population. 'alues in arbitrary units	29
' <b>able 7.</b> Technology assessment of 'Use-Case AI-mediated neurotechnologies (for cognitive brain signals)'. 'alues in arbitrary units	29
<b>able 8.</b> Technology assessment of 'Use-Case 5: AI-mediated inclusion of neurodiversity'. Values in arbitrary nits	

## Annexes

## Annex 1. The Big Data of the Human Body and Life

### THE HUMAN GENOME

The Human Genome Project, initially released in 2000 [473], estimated that humans have between 20000 and 25000 genes. The completed genome has been published in 2022 [474]. As summarized in [475] and [476]:

- Genes constitute the functional units of heredity. They are specific sequences of DNA, packed (i.e., arranged one after another) in structures called chromosomes in the nucleus of cells. Genes contain the information for producing proteins that generate physical attributes and particular functions of cells. Each chromosome contains many genes.
- DNA is composed of four building blocks (chemical bases called nucleotides): adenine (A), guanine (G), cytosine (C), and thymine (T), that attach to each other (A with T, and G with C) to form chemical bonds called base pairs.
- DNA has two strands that twist into the shape of a spiral ladder called a helix. The nucleotides attach to each other (A with T, and G with C) to form chemical bonds called base pairs (equivalent to the ladder's rungs), which connect the two DNA strands. Each base is also attached to a sugar molecule and a phosphate molecule (equivalent to the sides of the ladder).
- The order of the sequence of the bases determines the information that it carries. Alleles are forms of the same gene with small differences in their sequence of DNA bases.
- Each gene has from several hundreds of DNA bases to over 2 million bases. Each human cell normally contains 23 pairs of chromosomes (46 in total). Twenty-two of these pairs (called autosomes, numbered by size) are the same in both males and females. The 23rd pair (called the sex chromosomes, identified as X and Y) differ between males and females. Females have two copies of the X chromosome, while males have one X and one Y chromosome.
- Every person has two copies of each gene, one inherited from each parent.
- Human DNA consists of about 3 billion bases. More than 99 percent of those bases are the same in all people. These small differences contribute to each person's unique physical features.
- Many unknowns remains related to the effects of the layers of biochemical regulation and about the effects of the environment on the role and expression of genes (epigenomics) [477].

## THE HUMAN BRAIN

The human brain is an organ with an average volume [478] [480] in (European descent) males of 1,274 cm3 and of 1,131 cm3 in females, corresponding to an approximate mass of about 1.3 kg (equivalent to around 3 pounds).

In June 2021, Google, the Lichtman laboratory at Harvard University and Connectomics, released the largest dataset available mapping the human brain. Called the "H01" dataset, it corresponds approximately to one cubic millimeter of tissue and encompass about 183 trillions of annotated synapses.

To have an idea of the magnitude of the challenge of mapping the human brain and the extraordinary potential of AI for it, it is interesting to note that in the same volume of mouse brain, there are about 4 km of nerve fibers, and they could only be delineated from a extensive set of images using advanced AI tools for pixel-by-pixel segmentation, just one year before the HO1 dataset, in 2019 [479].

## PROTEINS

Virtually all existing protein structures have been solved in 2022 [142]. This is a substantial milestone in knowledge about living beings with an extraordinary potential for research and development in both 'natural' and 'artificial' (i.e., computational) biology and medicine.

#### **GETTING IN TOUCH WITH THE EU**

#### In person

All over the European Union there are hundreds of Europe Direct centres. You can find the address of the centre nearest you online (european-union.europa.eu/contact-eu/meet-us\_en).

#### On the phone or in writing

Europe Direct is a service that answers your questions about the European Union. You can contact this service:

- by freephone: 00 800 6 7 8 9 10 11 (certain operators may charge for these calls),
- at the following standard number: +32 22999696,
- via the following form: european-union.europa.eu/contact-eu/write-us\_en.

#### FINDING INFORMATION ABOUT THE EU

#### Online

Information about the European Union in all the official languages of the EU is available on the Europa website (<u>european-union.europa.eu</u>).

#### **EU publications**

You can view or order EU publications at <u>op.europa.eu/en/publications</u>. Multiple copies of free publications can be obtained by contacting Europe Direct or your local documentation centre (<u>european-union.europa.eu/contact-eu/meet-us\_en</u>).

#### EU law and related documents

For access to legal information from the EU, including all EU law since 1951 in all the official language versions, go to EUR-Lex (<u>eur-lex.europa.eu</u>).

#### Open data from the EU

The portal <u>data.europa.eu</u> provides access to open datasets from the EU institutions, bodies and agencies. These can be downloaded and reused for free, for both commercial and non-commercial purposes. The portal also provides access to a wealth of datasets from European countries.

# Science for policy

The Joint Research Centre (JRC) provides independent, evidence-based knowledge and science, supporting EU policies to positively impact society



## **EU Science Hub** joint-research-centre.ec.europa.eu

- @EU\_ScienceHub
- (f) EU Science Hub Joint Research Centre
- **in** EU Science, Research and Innovation
- EU Science Hub
- (@) @eu\_science



ISBN: 978-92-68-07764-1