All comments will be made public as-is, with no edits or redactions. Please be careful to not include confidential business or personal information, otherwise sensitive or protected information, or any information you do not wish to be posted.

Comment Template for Responses to NIST Artifical Intelligence Risk Management Framework Request for Infromation (RFI) Submit comments by August 19, 2021:

General RFI Topics (Use as many lines as you like)	Respon se #	Respondi ng organizati on	Responder's name	Paper Section (if applicab le)	Response/Comment (Include rationale)	Suggested change
Responses to Specific Request for						
information (pages 11,12, 13 and 14 of the RFI)						

1. The greatest challenges in	1	Future of Life Institute	Jared Brown Senior Advisor for Government Affairs	NA	One of the greatest challenges in managing AI risks is the evaluation of effects from AI systems that are characterized as being long-term, low probability,	To tackle the challenge of long-term, low probability, systemic,
improving			jared@futureoflife.org		systemic, and high impact. Proactively tackling	and high impact AI risk,
how AI			-		scenarios that can represent catastrophic or even	NIST should proactively
actors					existential risks to society within NIST's AI Risk	incorporate two lenses
manage Al-					Management Framework (RMF) should incorporate	into its RMF: tools and
related risks					two lenses: an emphasis on managing the	methods for evaluating
– where					aggregate risks from low probability, high	the aggregate risk of AI
"manage"					consequence effects of AI systems, and the need to	systems' effects on
means					proactively ensure the alignment of evermore	society and the
identify,					powerful advanced or general AI systems.	alignment of evermore
assess,						powerful advanced AI
prioritize,					The first lens NIST should consider is the aggregate	systems, including
respond to,					systematic impact of small effects by AI systems	those that are used as a
or					that, when deployed on a massive scale, can lead	foundation for other AI
communicat					to harms of a societal magnitude. To properly	systems. Concretely,
e those risks;					evaluate the long-term implications of any Al	this could entail:
					system, it is imperative that NIST develop	training on pitfalls and
					indicators, best practices, guidelines, and	safety remediations for
					standards, among other tools, with the objective of	powerful and
					enabling organizations to gauge the aggregate	potentially misaligned
					effects of their AI-based products and services. For	systems; increased
					example, consider the possibility of a catastrophic	attention to developing
					safety failure in the performance of autonomous	further technical and
					vehicles for conditions that are hard to model or	governance
					anticipate in a training environment. When this	remediations for such
					technology is deployed on a massive scale, society	issues; increasing
					may encounter the safety failures with a low, but	sensitivity to post-
					unacceptable, frequency. Another instance to	market effects of more
					consider are the aggregate effects on user	general AI systems
					polarization and radicalization that can occur with	through monitoring to
					content recommendation algorithms in social	identify precursor
					media. Though the vast majority of users may be	safety problems;
					relatively unaffected by being unintentionally	increasing NIST's
					recommended polarizing or radicalizing content, if	investment in AI safety
					even a small percentage (e.g., 0.1%) does evince	research; introducing
	J				negative effects, it can create a societal-wide	process standards for

conse	quence	•

The second lens addresses the prospect of a rapidly evolving slate of AI system capabilities. One concerning class of AI systems can be characterized as increasingly generalized in their purpose. When powerful versions of these systems are not properly aligned with intended objectives, the systems can become extremely unsafe or unpredictable when deployed. As described by the Office of Management and Budget in their regulatory guidance to federal agencies, "there is a risk that AI's pursuit of its defined goals may diverge from the underlying or original human intent and cause unintended consequencesincluding those that negatively impact privacy, civil rights, civil liberties, confidentiality, security, and safety" [1]. Certain plausible misalignments of incentives within the learning performed and decisions made by these powerful AI systems may even endanger the sustainability of human life, as has been argued by numerous leading scholars in Al research [2]. In this regard, NIST must develop mechanisms in the RMF that inform stakeholders on how to deal with this possibility and proactively prevent such outsized risks from becoming a reality.

1. U.S. Office of Management and Budget, "Guidance for Regulation of Artificial Intelligence Applications", M-21-06, p. 13, available at https://www.whitehouse.gov/wpcontent/uploads/2020/11/M-21-06.pdf.

2. See, for example, Russell S (2019), Human Compatible: Artificial Intelligence and the Problem of Control. Penguin, New York; Christian, B. (2020). The Alignment Problem: Machine Learning and

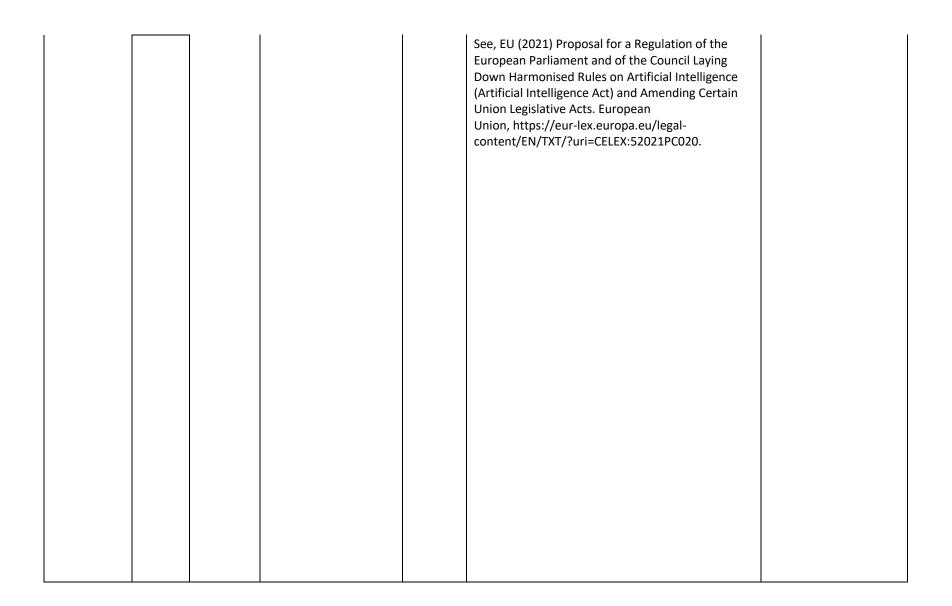
characterizing risk level and for proper design and implementation of Al systems' incentives; and developing safety requirements for applying for government AI research and development funding. Further, as has been agreed upon by thousands of leading AI experts and technologists in the Asilomar AI Principles (specifically its 21st principle), it is imperative that NIST incorporate catastrophic and existential risks into its purview and subject them to planning and mitigation testing efforts commensurate with their expected impact [3]. 3. Created at an FLI

organized workshop in 2017, the Asilomar AI Principles are signed by over 1,700 leading AI and robotics researchers, and over 3,900 other prominent individuals. For more, see:

		Human Values. W. W. Norton & Company; and Critch, A. and D. Krueger, Al Research Considerations for Human Existential Safety (ARCHES). arXiv preprint arXiv:2006.04948, 2020.	https://futureoflife.org/ ai-principles/.

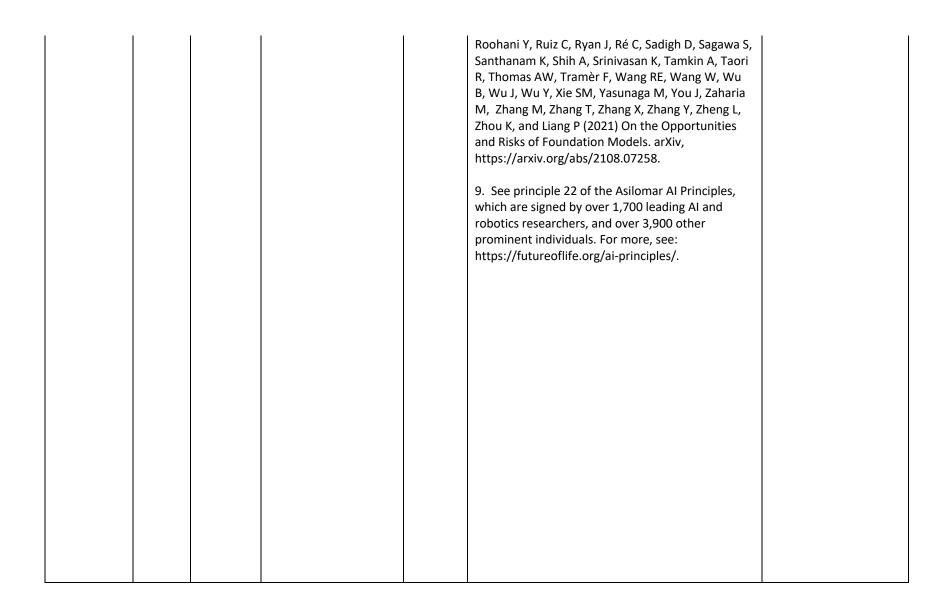
1. The	2	Future of	Jared Brown	NA	AI actors are challenged to manage the risks of AI	There are several ways
greatest	_	Life	Senior Advisor for		systems when there is uncertainty over how the	in that the RMF can
challenges in		Institute	Government Affairs		systems will be used, or misused, during	facilitate resolution of
improving			jared@futureoflife.org		deployment. This problem will amplify with the	this problem. For
how AI					growing trend in AI research and development	example, the RMF
actors					toward increasingly generalized AI systems capable	should further develop
manage Al-					of performing a wider range of tasks and activities	the explainable Al
related risks					within a single system or model. Such systems may	principle of knowledge
– where					also serve as foundations for other AI systems and	limits which NIST has
"manage"					applications [4]. These systems pose a unique	described as when
means					challenge in managing AI risk in that there is no	"systems identify cases
identify,					single use for them and the range of uses and	they were not designed
assess,					misuses is extremely uncertain. While developers	or approved to operate,
prioritize,					may have some scenarios in mind for how the	or their answers are not
respond to,					systems might ultimately be used most beneficially	reliable." Guidance on
or					or harmfully, the creativity of the public can easily	how stakeholders can
communicat					go beyond the imagination of AI actors (especially	implement knowledge
e those risks;					if the system is open-sourced). High uncertainty	limits will help AI actors
,					about the end use cases of a product or service is	understand when Al
					not unique to the broader field of risk	systems are being used
					management, but it is relatively unique to the	in ways unanticipated
					nascent field of AI risk management, which has	by developers that may
					typically depended upon a more rigid	not be reliable or safe.
					understanding of how a system will be employed to	Additionally, the RMF
					assess its likely risk [5].	should prescribe
					,	mechanisms for red-
					In NIST's RFI, in the section on Genesis for	teaming such
					Development of the AI Risk Management	considerations for
					Framework, it states that "With broad and complex	systems of relevant risk
					uses of AI, the Framework should consider risks	level. The RMF would
					from unintentional, unanticipated, or harmful	also benefit from
					outcomes that arise from intended uses, secondary	including specific
					uses, and misuses of the AI" and that the RMF	guidance for how to
					should "be adaptable to many different	manage the
					organizations, AI technologies, lifecycle phases,	unavoidable uncertainty
					sectors, and uses." While this is correct and	about the uses of
					commendable, we believe the RMF needs to go	generalized AI systems
					further than just considering a wide range of	that AI actors will

	<ul> <li>possible uses. The RMF must not depend on Al actors having high certainty of the expected use and misuse cases of Al systems. Put another way, conceptually, "use" should not be a variable that demands certainty or definition in the mathematical formula employed to calculate the risk of an Al system.</li> <li>4. Bommasani R, Hudson DA, Adeli E, Altman R, Arora S, von Arx S, Bernstein MS, Bohg J, Bosselut A, Brunskill E, Brynjolfsson E, Buch S, Card D, Castellon R, Chatterji N, Chen A, Creel K, Davis JQ, Demszky D, Donahue C, Doumbouya M, Durmus E, Ermon S, Etchemendy J, Ethayarajh K, Fei-Fei L, Finn C, Gale T, Gillespie L, Goel K, Goodman N, Grossman S, Guha N, Hashimoto T, Henderson P, Hewitt J, Ho DE, Hong J, Hsu K, Huang J, Icard T, Jain S, Jurafsky D, Kalluri P, Karamcheti S, Keeling G, Khani F, Khattab O, Kohd PW, Krass M, Krishna R, Kuditipudi R, Kumar A, Ladhak F, Lee M, Lee T, Leskovec J, Levent I, Li XL, Li X, Ma T, Malik A, Manning CD, Mirchandani S, Mitchell E, Munyikwa Z, Nair S, Narayan A, Narayanan D, Newman B, Nie A, Niebles JC, Nilforoshan H, Nyarko J, Ogut G, Orr L, Papadimitriou I, Park JS, Piech C, Portelance E, Potts C, Raghunathan A, Reich R, Ren H, Rong F, Roohani Y, Ruiz C, Ryan J, Ré C, Sadigh D, Sagawa S, Santhanam K, Shih A, Srinivasan K, Tamkin A, Taori R, Thomas AW, Tramèr F, Wang RE, Wang W, Wu B, Wu J, Wu Y, Xie SM, Yasunaga M, You J, Zaharia M, Zhang M, Zhang T, Zhang X, Zhang Y, Zheng L, Zhou K, and Liang P (2021) On the Opportunities and Risks of Foundation Models. arXiv, https://arxiv.org/abs/2108.07258.</li> <li>5. For example, see the European Commission's</li> </ul>	encounter, including for systems used as a foundation for other applications.
	proposal on AI, which depends heavily on use case to determine whether an AI system is "high-risk."	

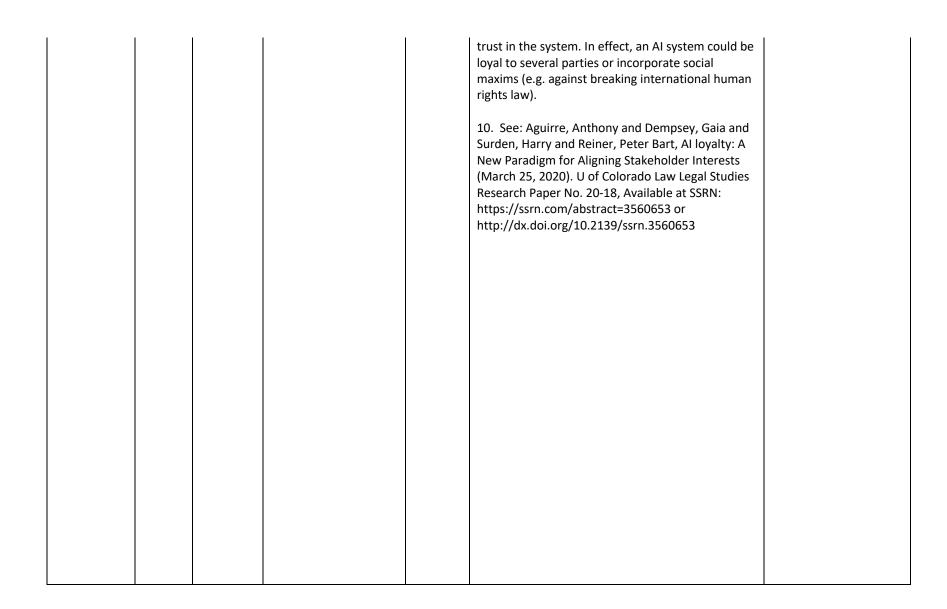


2. How organizations currently define and manage characteristic s of AI trustworthin ess and whether there are important characteristic s which should be considered in the Framework besides: accuracy, explainability and interpretabili ty, reliability, privacy, robustness, safety, security (resilience), and mitigation of harmful bias, or harmful outcomes from misuse of the AI;	4	Future of Life Institute	Jared Brown Senior Advisor for Government Affairs jared@futureoflife.org	NA	We believe that NIST should include an analysis of the AI system's generality as a characteristic essential for evaluating its trustworthiness. More general systems will require more sophisticated and comprehensive training, testing, and quality assurance processes, and should be expected to make unexpected decisions or actions of a qualitatively different nature from very narrow systems. An assessment of generality would evaluate where a system lies on the continuum between weak to strong AI, or narrow to general AI. An assessment of generality may also implicitly take into account, for example and among other capabilities, the system's: ability to do transfer learning, AutoML, perform robustly in few-shot or zero-shot conditions, operate across modalties, having advanced planning capabilities, and whether it is capable of self-improving or self- modeling [7]. Generality measures would not depend on such features, but are quantitative metrics and applicable for any AI system. Some systems that have high generalizability may also be used as a foundation for other AI applications, as has been recently noted by researchers at Stanford University [8]. A generality assessment is needed because of a range of issues that may arise in the deployment of systems with greater generality, particularly with regard to challenges identified in our comments to Topic 1 of the RFI. For example, systems with higher generality are more likely to produce unexpected aggregate or compound societal risks and have significantly greater uncertainty with respect to their likely use cases. In many ways, AI systems with high generality will demand a different set of risk management techniques than those that have low generality (i.e., very narrow AI systems with	Add a new characteristic of AI trustworthiness in the form of "generality" and develop appropriate guidance and tools for evaluating and managing its risk.
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highly controlled use cases and use environments). For example, experts agree that AI systems designed to recursively self-improve in a manner that could lead to rapidly increasing quality must be subject to strict safety and control measures [9].
7. For additional research on how to assess generality, see F. Martínez-Plumed and J.
Hernández-Orallo, "Dual Indicators to Analyze Al
Benchmarks: Difficulty, Discrimination, Ability, and Generality," in IEEE Transactions on Games, vol. 12,
no. 2, pp. 121-131, June 2020, doi:
10.1109/TG.2018.2883773; J. Hernández-Orallo,
"AI Generality and Spearman's Law of Diminishing
Returns" in Journal of Artificial Intelligence
Research, vol. 64, pp. 529–562, 2019; and S., Legg, and M. Hutter, "Universal intelligence: A definition
of machine intelligence," in Minds and Machines,
vol 17, pp. 391-444, 2007.
8. Bommasani R, Hudson DA, Adeli E, Altman R,
Arora S, von Arx S, Bernstein MS, Bohg J, Bosselut
A, Brunskill E, Brynjolfsson E, Buch S, Card D,
Castellon R, Chatterji N, Chen A, Creel K, Davis JQ,
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A, Niebles JC, Nilforoshan H, Nyarko J, Ogut G, Orr
L, Papadimitriou I, Park JS, Piech C, Portelance E,
Potts C, Raghunathan A, Reich R, Ren H, Rong F,



3. How organizations currently define and manage principles of AI trustworthin ess and whether those are	5	Future of Life Institute	Jared Brown Senior Advisor for Government Affairs jared@futureoflife.org	NA	Outside of transparency, fairness, and accountability, we recommend that NIST consider loyalty as a principle that fundamentally shapes the trustworthiness of AI systems [10]. Our proposal stems from the importance of informing individuals about the incentives that motivate the decisions or actions of an AI application. Specifically, we say that an AI agent is loyal to another entity insofar as the agent successfully serves or adopts that end user's goals and interests.	NIST should incorporate the concept of loyalty into its slate of principles for managing the trustworthiness of AI systems.
there are important principles which should be considered in the Framework besides: transparency					Incorporating loyalty into AI systems is important because of the differences in how they make decisions compared to their organic counterparts. Unlike humans, AI systems are not intrinsically self- interested. In other words, its developers make the determination for what incentives or objectives ought to be followed. If aligned, the system's goals (or objective function) will attempt to satisfy an individual's objectives.	
, fairness, and accountabilit γ;					In contrast, a conflict of interest will arise if an AI system attempts to be loyal to the goals of both an individual and another party (e.g. the company that created it) and the interests do not align. In addition, a system may be disloyal by representing itself as loyal to an individual, while prioritizing the interests of other parties instead, which may be discovered later or not. Therefore, loyalty can affect "perceived trustworthiness" because if a user perceives that a system (correctly or not) is serving an interest other than their own, they are less likely to trust it.	
					However, loyalty need not be binary. Transparently demarcating degrees of loyalty is crucial to avoid scenarios where blind allegiance to an entity leads to non-physical harms, including the loss of user	



5. Standards, frameworks, models, methodologi es, tools, guidelines and best practices, and principles to identify, assess, prioritize, mitigate, or communicat e AI risk and whether any currently meet the minimum attributes described above;	6	Future of Life Institute	Jared BrownSenior Advisor for Government Affairsjared@futureofli fe.org	NA	The Partnership on AI (PAI) has begun to maintain an AI Incident Database that shares useful information about "AI deployment harms or near harms across all disciplines, geographies, and use cases" [11]. In the NIST RMF, this practice and tool could be advanced to create standardized ways for stakeholders to submit information about observed incidents, either about their own AI systems or other systems that they have encountered. A version of this tool for the NIST RMF could be kept confidential or have its data anonymized as needed for encouraging participation from industry, allowing for lessons to be generated without risking reputation harm to particular AI systems. 11. The Partnership on AI's AI Incident Database (AIID) is available at https://incidentdatabase.ai/.	NIST should evaluate creating a reporting and database tool in its RMF to consolidated information about "AI deployment harms or near harms across all disciplines, geographies, and use cases," as has been started by PAI. However, unlike PAI's open-source dependent database, NIST should look to maintain a version of this tool that is confidential and anonymized so that industry practitioners can submit standardized information in a way that does not risk economic or reputational damage to their product.
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7. AI risk management standards, frameworks, models, methodologi es, tools, guidelines and best practices, principles, and practices which NIST should consider to ensure that the AI RMF aligns with and supports other efforts;	7	Future of Life Institute	Jared Brown Senior Advisor for Government Affairs jared@futureoflife.org	NA	Soft law programs whose objectives are to manage Al risks are continuously created by stakeholders (government, non-profit, and private sector) globally. For NIST to consider a large sample of these programs, we recommend an examination of the database developed by Arizona State University [12]. This project is the largest compilation and analysis of soft law (with over 600 programs) devoted to the management of Al methods and applications in areas including risk, safety, and security, among others. We believe that its evaluation by NIST could provide an important overview of the diversity of efforts undertaken with objectives similar to its own. 12. See: Arizona State University. Soft Law Governance of Artificial Intelligence: https://papers.ssrn.com/sol3/papers.cfm?abstract id=3855171	Examine the database developed by Arizona State University that compiles the largest sample of soft law programs dedicated to the management of AI I with the goal of expanding the purview of prospective NIST standards.
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9. The appropriaten ess of the attributes	8	Future of Life Institute	Jared Brown Senior Advisor for Government Affairs jared@futureoflife.org	NA	The eight listed attributes for the AI RMF are commendable, but we believe there is a chance that the final attribute, "Be a living document" could lead to an over acceptance of risk in	NIST should clarify its intentions with regard to how it will address established,
NIST has			Jarea@ratareonne.org		instances where there is scientific uncertainty	qualitatively identifiable
developed					about an aspect of AI trustworthiness. The eighth	risks that are not
for the Al					attribute states:	"sufficiently developed"
Risk						with regard to the
Management					"The Framework should be capable of being readily	RMF's attribute of being
Framework.					updated as technology, understanding, and	a "living document."
(See above,					approaches to AI trustworthiness and uses of AI	We propose that a
"AI RMF					change and as stakeholders learn from	ninth attribute may be
Development					implementing AI risk management."	necessary to highlight
and						this need, which could
Attributes");					We concur with the above statement. However,	state "9. Effectively
					the RFI then states that NIST "expects there may be	communicate novel Al
					aspects of AI trustworthiness that are not	trustworthiness
					sufficiently developed for inclusion in the initial	research and means for
					Framework." We are are alarmed by the possible	managing uncertainty."
					implications of this statement, particularly because	Through this attribute,
					the word choice of "sufficiently developed" is	the RMF should, at a
					highly subjective. To be clear, being a living	minimum, properly
					document does not mean that the RMF should	communicate to
					ignore, or leave unmanaged for a later date, risks	stakeholders any
					that be characterized by their considerable	possible risk, even if it is
					uncertainty in the science of AI, especially if these	only to say that the
					risks can produce significant harm. For example,	possible risk requires
					many problems with the trustworthiness of Al	additional attention and
					systems are often identified in the scientific	research in their
					literature prior to there being a definitive analysis	development of AI
					of how and in which circumstances the problem	products and services.
					occurs probabilistically, or without there being	Other risk management
					definitive techniques for mitigating the problem	frameworks, for instance in the field of
					[13]. The NIST RMF cannot simply ignore such problems for future iterations of the living	medical devices and
					document until there is greater certainty about the	pharmaceuticals
					likelihood of the risk or means for its mitigation. As	managed by the Food
					a matter of risk management, it would be	and Drug
					a matter of fisk management, it would be	

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13. For example, see the problem of "underspecification" in D'Amour, A., Heller, K., highlight parti- Moldovan, D., Adlam, B., Alipanahi, B., Beutel, A.,official safety communicatio highlight parti- issues on a rol	ns to cular ling basis
13. For example, see the problem of       communication         "underspecification" in D'Amour, A., Heller, K.,       highlight partier         Moldovan, D., Adlam, B., Alipanahi, B., Beutel, A.,       issues on a rol	cular ling basis
"underspecification" in D'Amour, A., Heller, K.,       highlight parti         Moldovan, D., Adlam, B., Alipanahi, B., Beutel, A.,       issues on a rol	cular ling basis
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Chen, C., Deaton, J., Eisenstein, J., Hoffman, M. D., as new inform	ation
et al., (2020) Underspecification presents comes to light	about
challenges for credibility in modern machine particular post	ible risks.
learning. arXiv preprint, arXiv:2011.03395. NIST should de	velop
similar method	ls for the
14. See particularly the work of Cass Sunstein, the RMF to enhan	ce the
former Administrator of the Office of Information attribute of it	being a
and Regulatory Affairs, in Cass R. Sunstein, living docume	nt, and
Irreversible and Catastrophic, 91 Cornell Law specifically em	brace
Review. 841, 848 (2006), and Cass R. Sunstein, The ways of comm	unicating
Catastrophic Harm Precautionary Principle, Issues potential risk,	especially
in Legal Scholarship (2007). potential cata	trophic
risks, even wh	en the
science may n	ot met
the "sufficient	y
developed" th	reshold.
The RMF shou	ld also
avoid strong	
assumptions r	egarding
upper limits of	
Al capabilities,	
been affirmed	
leading AI scie	-
roboticists, an	
technologists	
	-
15. See princi	ble 19 of
the Asilomar A	
Principles, whi	
signed by over	
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			researchers, and over 3,900 other prominent individuals. For more, see: https://futureoflife.org/ ai-principles/.

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limited to –					
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Cybersecurit					
y Framework					
or Privacy					
Framework,					
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on					
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implementati					
on; and					

12. The extent to which the Framework should include governance issues, including but not limited to make up of design and development teams, monitoring and evaluation, and grievance and redress.	10	Future of Life Institute	Jared Brown Senior Advisor for Government Affairs jared@futureoflife.org	NA	To build an effective framework, we suggest that NIST provide guidance in two key areas that would benefit its design and implementation. First, it should explicitly state the organizational roles of AI actors required for implementing the framework. In effect, the RMF should delineate the accountability of AI actors as defined by the OECD AI Principle 1.5, which has been endorsed and adopted by the U.S. government. The OECD defines AI actors as "those who play an active role in the AI system lifecycle, including organisations and individuals that deploy or operate AI." The actors "should be accountable for the proper functioning of AI systems based on their roles, the context, and consistent with the state of art." Concretely, a core purpose of the RMF should be to provide practical guidance on how US stakeholders can fulfill this OECD principle through governance. For example, it should include the roles and responsibilities needed for activities related to implementation, monitoring and evaluation of long-term safety risks, auditing, and external communications in the form of risk reporting. Particularly important is the composition of the teams that design and deploy AI systems. These should contain individuals with diverse experiences and knowledge to inform the organization about potential AI risks. In addition, we believe individuals developing AI systems need to have options to communicate risks that are disregarded by their superiors. Providing this recourse is fundamental to ensure that risk-laden AI systems are not brought to market. To do so, options such as an internal ombudsman or whistleblower protection need to be explicitly considered.	It is in NIST's interests to consider two areas where guidance on their framework would benefit its stakeholders: 1) organizational roles necessary for its implementation; and 2) processes to identify safety and security risks of AI systems.
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