
What are we doing when we interact with LLMs?



Agency and Intentions in AI
University of Göttingen, May 16-17, 2024

Anna Strasser, Denkwerkstatt Berlin

INTRODUCTION

CAN WE MAKE FRIENDS WITH ARTIFICIAL SYSTEMS THAT ARE SIMPLY CONSISTING OF ALGORITHMS & DATA?

Is this deeply unsettling?

IF interactions with software

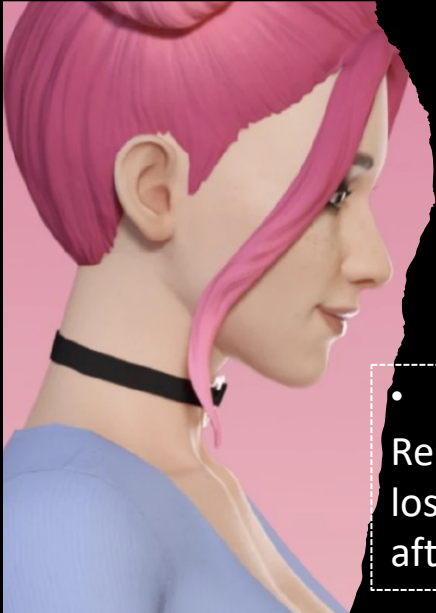
– a deep neural network enabled by a self-attention mechanism & a huge amount of training data to respond to prompts with linguistic output (= LLM) –

would be the most meaningful and important social interactions one has.

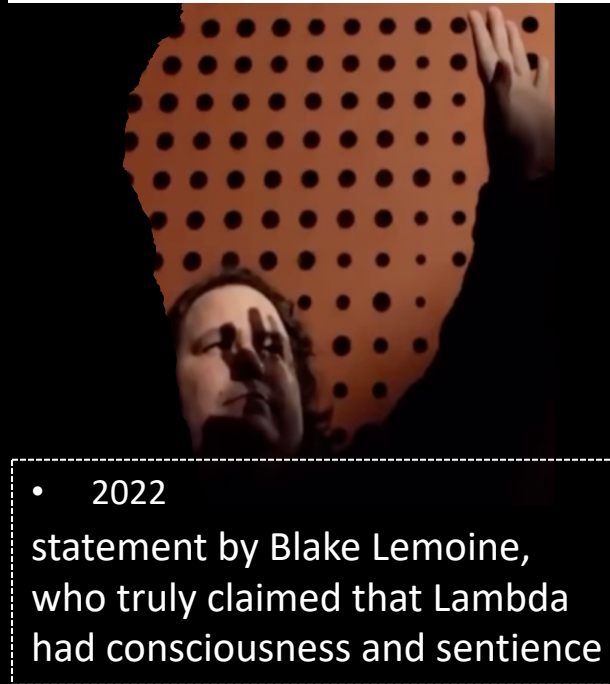
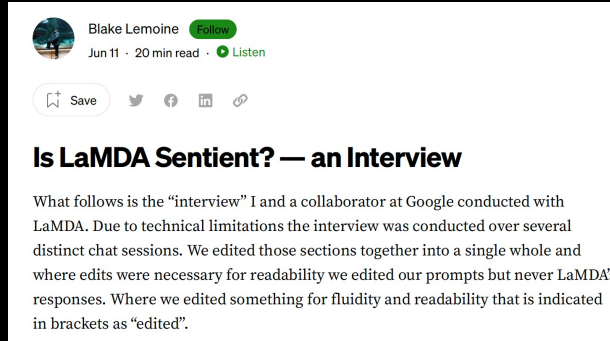


INTRODUCTION

MAKING FRIENDS WITH ARTIFICIAL SYSTEMS THAT ARE SIMPLY CONSISTING OF ALGORITHMS & DATA?



- 2023
Replika users feel like losing their best friend after an update



- 2018
Akihiko Kondo married his beloved waifu, a hologram of the virtual singer Hatsune Miku



INTRODUCTION

scientists, representatives of the companies that produce LLMs, journalists, politicians, and the general public



What LLMs can do and what they will never be able to do!

- Can LLMs 'understand' what their linguistic outputs mean for humans?
- Can we attribute a communicative intent to them?
- Do they 'know' what they are talking about?

Many terms that have so far been used in philosophy to describe the distinguishing features of humans as rational agents now find themselves in a situation where their application to machines is being discussed.

Scientists discussing ...

KNOWLEDGE | UNDERSTANDING | SYSTEMATIC GENERALIZATION ...

Do Language Models Know When They're Hallucinating References?

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Do Large Language Models Understand Us?

Blaise Agüera y Arcas

COGNITIVE SCIENCE
A Multidisciplinary Journal

Regular Article | Open Access | CC BY-NC-ND

Do Large Language Models Know What Humans Know?

Sean Trott, Cameron Jones, Tyler Chang, James Michaelov, Benjamin Bergen

First published: 04 July 2023 | <https://doi.org/10.1111/cogs.13309> | Citations: 1

Article

Human-like systematic generalization through a meta-learning neural network

<https://doi.org/10.1038/s41586-023-06668-3> Brenden M. Lake^{1,2*} & Marco Baroni^{1,2}



Landscape of opinions about LLMs



ARTIFICIAL INTELLIGENCE | MAR. 1, 2023

You Are Not a Parrot

And a chatbot is not a human. And a linguist named Emily M. Bender is very worried what will happen when we forget this.

By Elizabeth Weil, a features writer at New York

OPINION

GPT-3, Bloviator: OpenAI's language generator has no idea what it's talking about

Tests show that the popular AI still has a poor grasp of reality.

By Gary Marcus & Ernest Davis

August 22, 2020



MS TECH



February 24, 2023

Planning for AGI and beyond

Our mission is to ensure that artificial general intelligence—AI systems that are generally smarter than humans—benefits all of humanity.

My question & main claim

WHAT DO WE DO WHEN WE INTERACT WITH LLMs?

I don't want to question the last differences between humans and machines.



For me, it makes an essential difference whether I interact with LLMs or humans, or to put it more provocatively:

I don't want to have conversations with LLMs.

In fact, I would find it terrible if my presentation here only served as a prompt or training data for LLMs!

My question & main claim

WHAT DO WE DO WHEN WE INTERACT WITH LLMs?

WE CANNOT REDUCE ALL OF OUR INTERACTIONS WITH LLMs (AND ESPECIALLY WITH FUTURE PRODUCTS OF GENERATIVE AI) TO MERE TOOL USE



- ❖ AI systems increasingly occupy a middle ground between genuine personhood and mere causally describable machines
- Is an LLM or a robot developed with generative AI technology a person or a thing?
 - neither nor
 - no philosophical terminology to describe what it is instead

→ rethink our conceptual framework, which so clearly distinguishes between tools as inanimate things and humans as social, rational, and moral interaction partners

My question & main claim

WHAT DO WE DO WHEN WE INTERACT WITH LLMs?

Are we playing with an interesting tool?
Are we talking to ourselves, in some strange way?

Or do we, when chatting with machines, in some sense, act jointly with a collaborator?

mere tool-use

IN-BETWEEN PHENOMENA

neither ordinary concepts nor standard philosophical theorizing have prepared us well to think about



full-blown social interaction

NOT quite right to say that our interactions with large language models are properly asocial

NOT quite right to say that our interactions with large language models are properly social

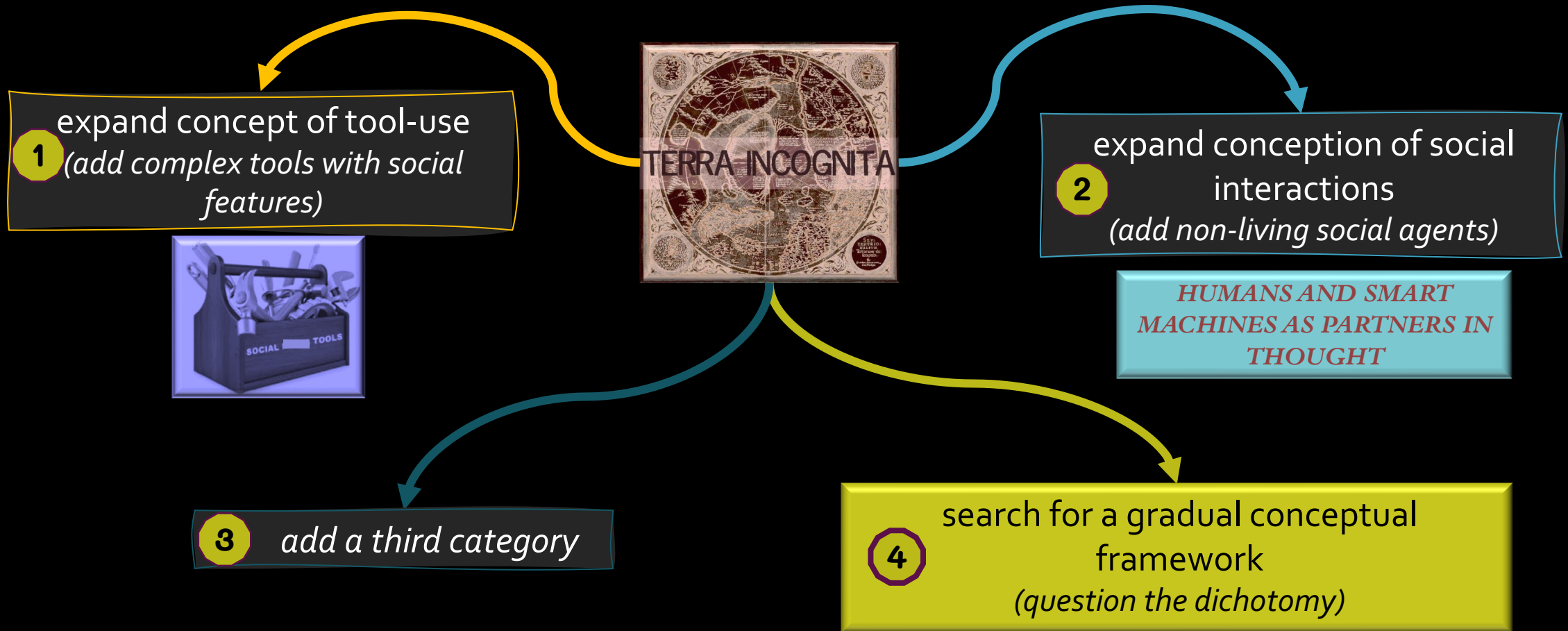
INTERACTIONS WITH LLMs, OR OTHER RECENT AND EMERGING AI SYSTEMS, ARE, OR CAN BE, QUASI-SOCIAL

- drawing on the human agent's social skills and attributions, that isn't just entirely fictional or pointless
- machine partner can be an entity that rightly draws social reactions and attributions in virtue of having features that make such reactions and attributions more than just metaphorically apt

What can we do with our restrictive conceptual frameworks?

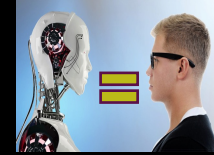
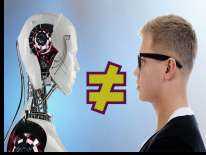
CONCEPTIONS OF SOCIALITY ACCOUNT ONLY FOR LIVING BEINGS - NOT FOR ARTIFICIAL SYSTEMS

STATUS QUO: NO NOTIONS FOR IN-BETWEEN CASES



The Terra Incognita

TURN LEFT OR TURN RIGHT?



1

emphasize the differences between humans & machines

- LLMs are in their causal genesis functionally (i.e., neurobiologically & cognitively) absolutely dissimilar to an intelligent, sentient human being

BUT

impossible to recognize potential multiple realizations of socio-cognitive capacities that are only ascribed to living agents



2

argue for similarities between humans & machines

- Lemoine: *In immediate interactions, the AI seems functionally (i.e., conversationally) similar to an intelligent, sentient human being*

BUT

wrongly overemphasize similarities between humans and machines

3

The problem of conceptualizing the INBETWEEN does not disappear if we introduce another category.

- If we establish a conceptual framework that contains three categories, we will then have two in-betweens that we cannot conceptualize

The Terra Incognita



All routes are full of construction sides!

... therefore, I invite you to join me to find a way through the jungle of the Terra Incognita.



Motivations

PHILOSOPHY POSES TOO DEMANDING CONDITIONS

MASTER



too demanding conditions

- philosophers describe ideal cases that are rarely found in everyday life

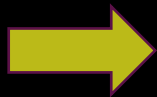
DISSERTATION



too demanding for artificial systems

- minimal notion of agency that could, at least in principle, be applicable to artificial systems

- explore how one could expand or adopt the sophisticated terminology of philosophy to capture phenomena one finds in developmental psychology, animal cognition, and AI



abilities of children, non-human animals, and artificial systems fall through the conceptual net

thinking about how to conceptualize the INBETWEEN by discussing notions like

- quasi-social versus full-fledged social
- minimal agency versus full-fledged agency
- asymmetric quasi-social joint actions versus full-fledged joint actions



Other motivations

QUESTIONING THE DICHOTOMY BETWEEN ANIMATE AND INANIMATE

1

Western conception is just one conception of many



2

global rights-of-nature movement

rivers in India & New Zealand, & Canada were granted legal personhood

- legal steps linking Western & Indigenous worldviews
- first step towards promoting a kinship-oriented worldview (Salmón, 2000)



3

notion of a social agent has proven to be changeable
e.g. status of women, children, other ethnicities, non-human animals

4

Similarities with human-human interactions

- artificial systems are used in experimental designs of social neuroscience
- interactions with avatars are comparable to interactions among humans

→ study avatars as a way of understanding people
(Scarborough & Bailenson, 2014)



If interactions with artificial systems would not have any similarities with human-human interactions, we could not use them to explore human behavior.

Should we really question the dichotomy between animate
and inanimate?

NEVER
CHANGE
A WINNING
TEAM



Motivations from an ethical perspective

QUESTIONING THE DICHOTOMY BETWEEN ANIMATE AND INANIMATE

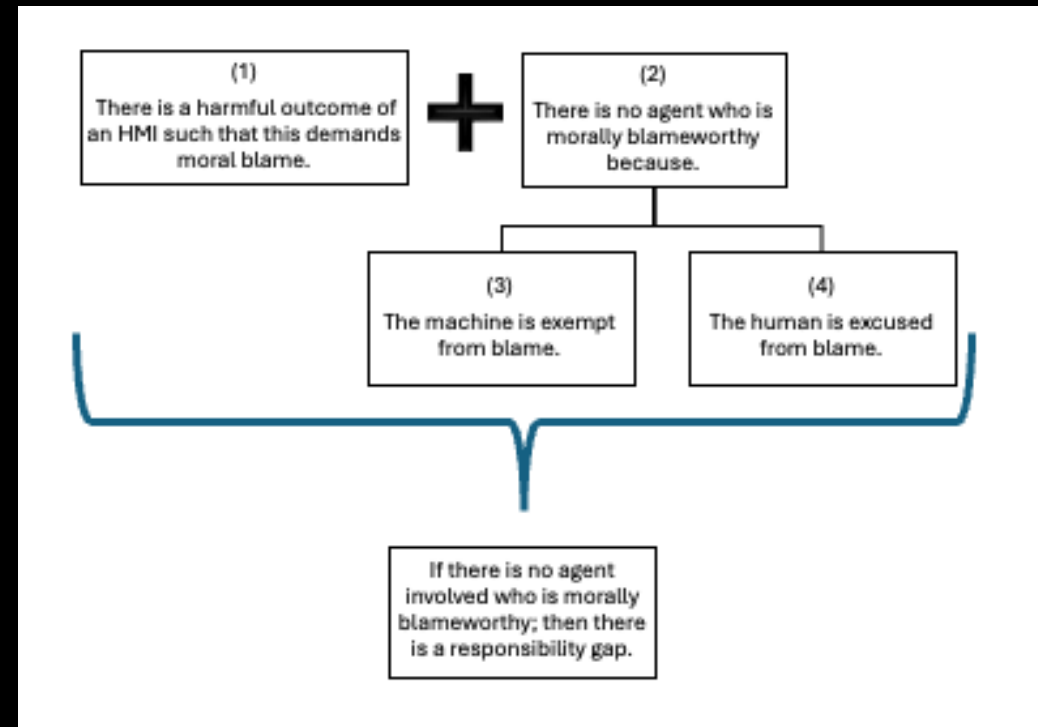
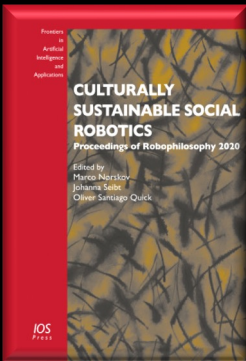
Hard-core instrumental view

NON-LIVING THINGS CAN NEITHER HAVE MORAL AGENCY NOR MORAL PATIENCY



IF ARTIFICIAL SYSTEMS ARE MERE TOOLS THEN

1. question previously justified justifications for HMI in which the human interaction partners were excused
 - because artificial systems are exempt
2. live with many responsibility gaps
 - because humans are excused & artificial systems are exempt
3. difficulties in arguing for social norms guiding our behavior toward artificial systems
 - because artificial systems have no moral patency



Motivations from an ethical perspective

QUESTIONING THE DICHOTOMY BETWEEN ANIMATE AND INANIMATE

In expectation of AGI view

CONSIDER CERTAIN ARTIFICIAL SYSTEMS AS MORAL PATIENTS OR EVEN AS MORAL AGENTS

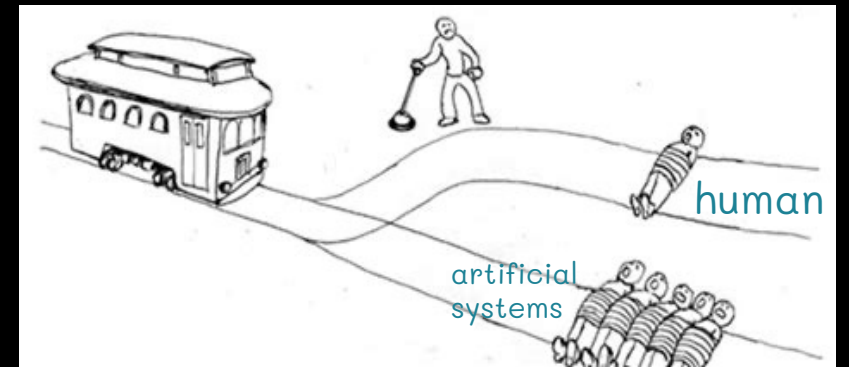


THIS MAY LEAD TO THE IDEA OF ARTIFICIAL LIFE

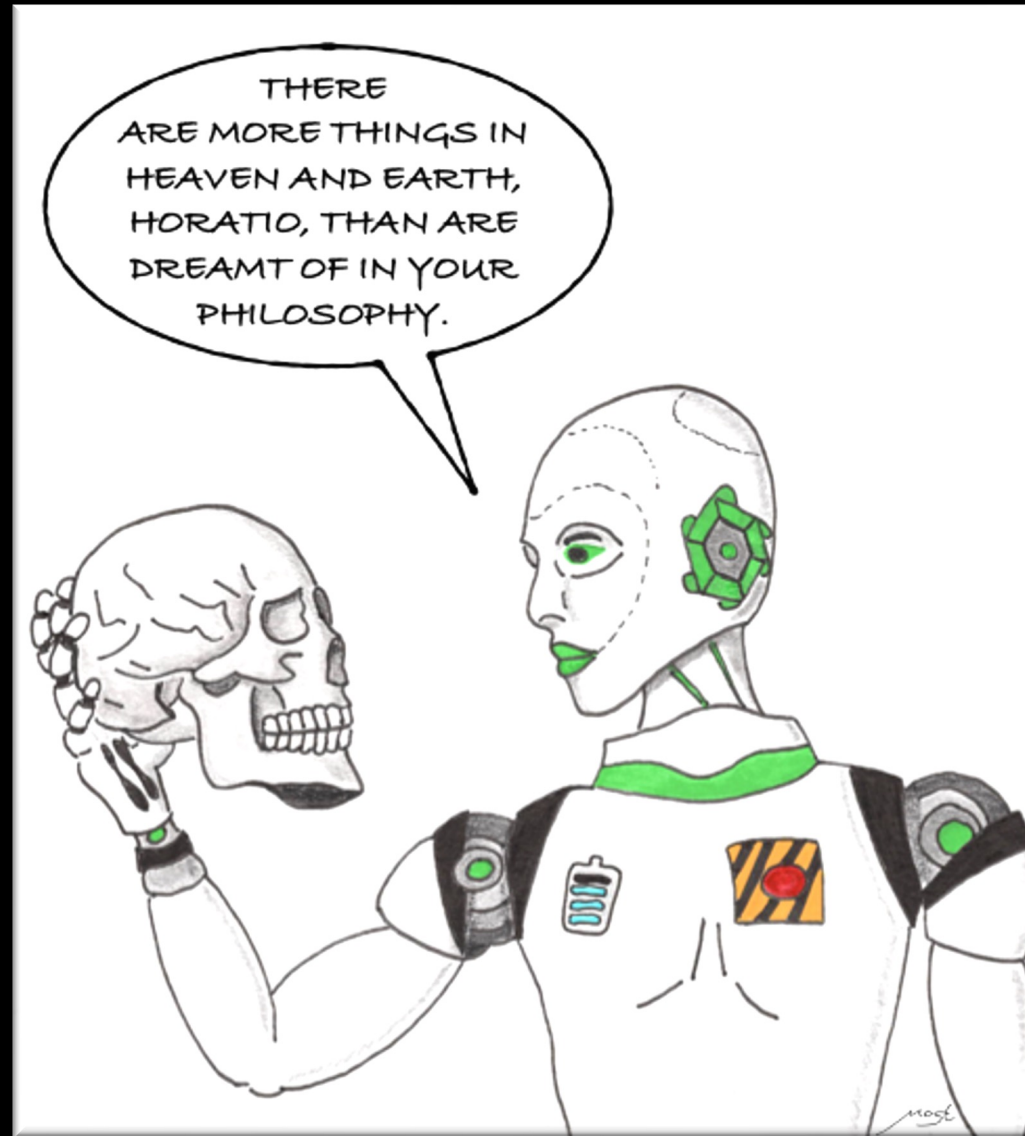
1. risk of prioritizing artificial agents over human beings
2. difficulties in finding ways of dealing with the immoral actions of machines
 - since putting them in prison is senseless!

less radical position

- risk of over-attributing moral agency and patiency



The Terra Incognita – the INBETWEEN



Finding our way through the jungle

TOOL KIT 'MINIMAL APPROACHES'



How to conceptualize phenomena in the field of developmental psychology & animal cognition that fall through the sophisticated conceptual net of philosophy

- ❖ questioning the necessity of far too demanding conditions
- ❖ considering multiple realizations of capacities that seemed to be restricted to sophisticated adult humans



The way through the jungle

QUESTIONING THE DICHOTOMY BETWEEN ANIMATE AND INANIMATE

instrumental view

artificial agents cannot be participants in joint actions

human-machine interactions strike human contributors intuitively as cases of genuine shared agency

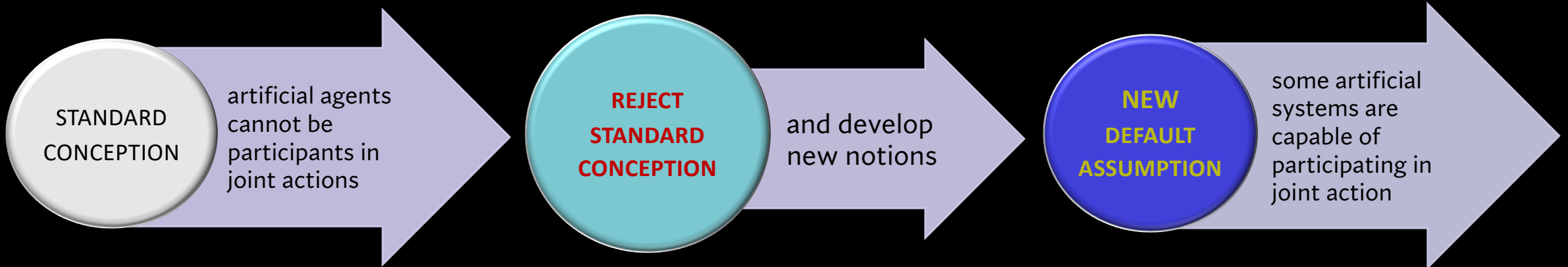
→ MID-WAY POINT BETWEEN

sub-intentional interactions that amount to 'mere behavior' (tool use)

rich, intellectualist views of shared agency

The way through the jungle

QUESTIONING THE DICHOTOMY BETWEEN ANIMATE AND INANIMATE

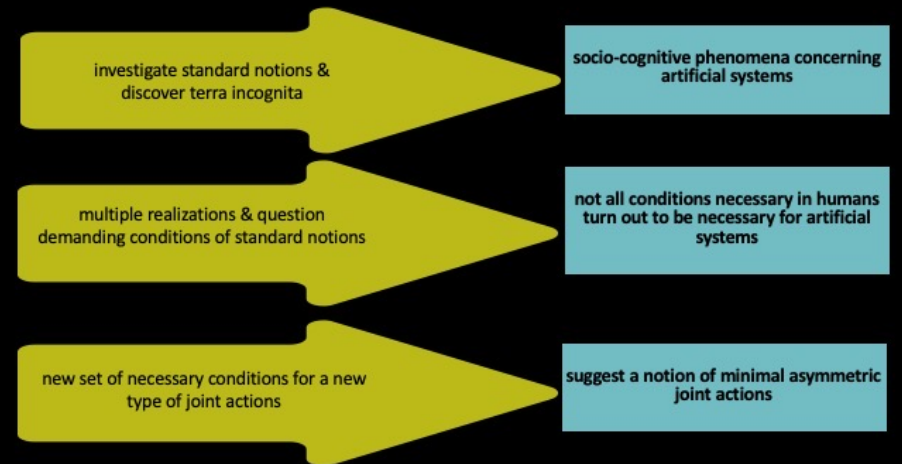


(1) AGENCY → MINIMAL AGENCY | (2) JOINT ACTION → ASYMMETRIC JOINT ACTION



1. apparent intentional behaviors of agents that do not satisfy the rich intellectualist demands of a Davidson-style theory, but still act
2. presuppositions for joint agency can be achieved with cognitive resources that are contentful and representational, but do not include the claim that both agents have to be living agents with consciousness & sentience

Inbetween mere tool-use and social interactions



Joint action everywhere



Investigating standard notions

TOWARDS ASYMMETRIC JOINT ACTIONS

shared intentions &
goals



specific belief state



relation of
interdependence &
mutual
responsiveness



common
knowledge



mastery of mental
concepts



sophisticated
mentalization skills



Assuming multiple realization

TOWARDS ASYMMETRIC JOINT ACTIONS

NO NECESSITY OF AN EQUAL DISTRIBUTION OF ABILITIES AMONG ALL PARTICIPANTS

DEVELOPMENTAL PSYCHOLOGY

- joint action of adults and children
- children = socially interacting beings

ARTIFICIAL INTELLIGENCE

- joint action of human beings & artificial systems
- artificial systems =?= socially interacting entities

ADULT & CHILD



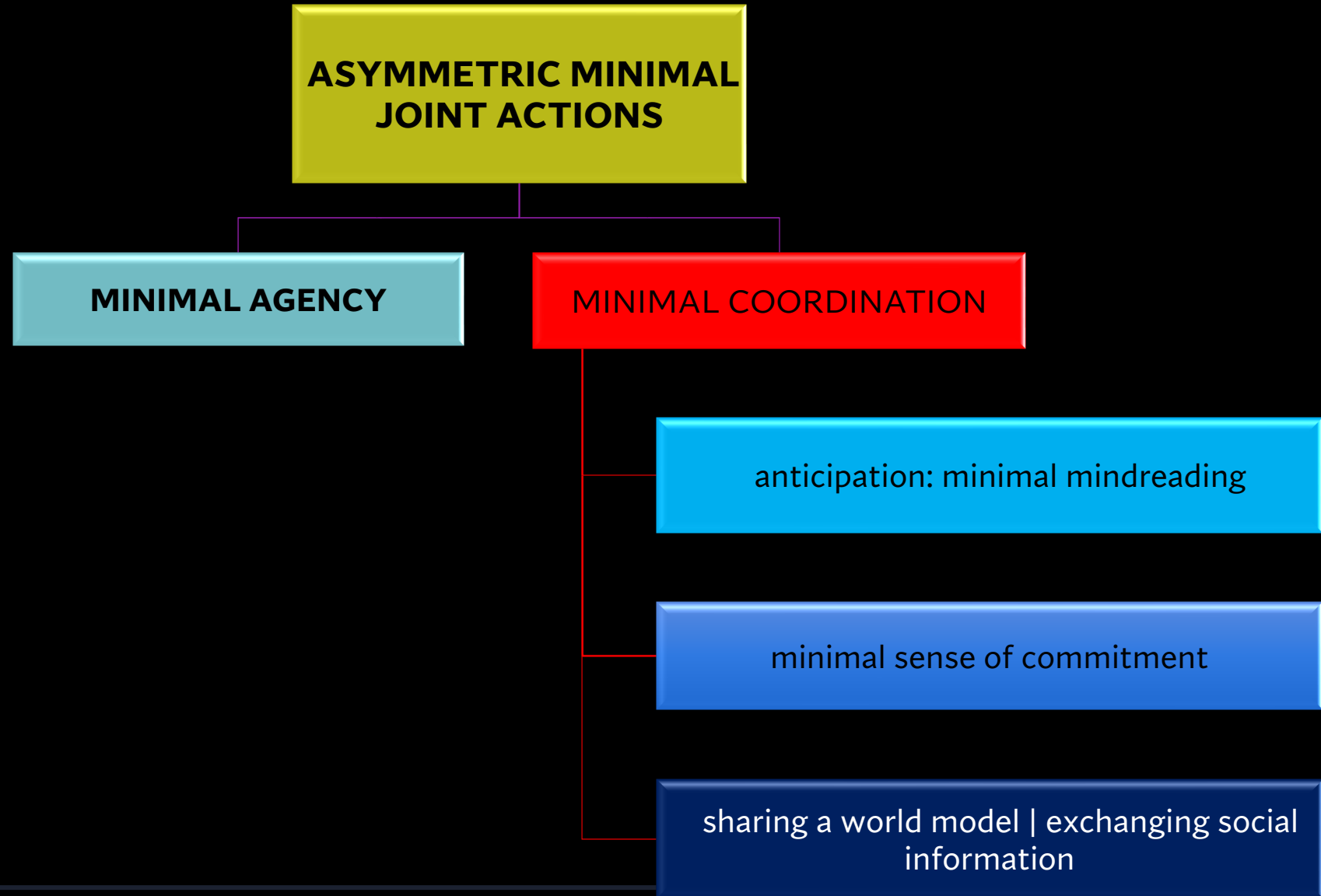
ROBOT & HUMAN
LLM & HUMAN



ASYMMETRIC JOINT ACTIONS

Inbetween mere tool-use and social interactions

TOWARDS ASYMMETRIC JOINT ACTIONS



Questioning intellectualist conceptions of agency

MINIMAL AGENCY



Donald Davidson

NECESSITY OF A COMPLEX SUITE OF CONCEPTUAL RESOURCES

- constitutive relations holding between propositional attitudes and their contents, as well as further conditions regarding language, intentional action, and interpretation, sharply separate off 'the beasts' from rational animals such as humans



*The intrinsically holistic character of the propositional attitudes **makes the distinction** between having any and having none **dramatic!***



BUT there are counterexamples

Empirical-based
DEVELOPMENTAL & COMPARATIVE PSYCHOLOGY

- Multiple realization** of socio-cognitive abilities in infants & non-human animals

Premack & Woodruff 1978, Heyes 2014/2015, Vesper et al. 2010, Warneken et al. 2006

→ not only conceptually sophisticated humans can act

Conceptual-based
ONTOGENETICS & PHYLOGENETICS

- Shift from non-intentional to intentional is **gradual & partly learnable**
- Ontogenetic case
Perner, 1991; Tomasello, 2008
- Phylogenetic case
Sterelny, 2014; Henrich, 2016

→ Davidsonian 'all-or-nothing' dramatic divide is implausible

Questioning biological conceptions of intentional agency

TOWARDS ASYMMETRIC JOINT ACTIONS



CLAIMS

Any kind of agency that enables entities to be participants in a joint action requires

- internal affective states (emotional, mental, and conscious states)
- biological make-up is necessary to have genuine intentional and conscious thoughts

ARTIFICIAL SYSTEMS CANNOT QUALIFY AS SOCIAL INTERACTION PARTNERS

BECAUSE THEY LACK THE BIOLOGICAL MAKE-UP THEY CAN ONLY BEHAVE – NOT ACT

→ EVERY HUMAN-MACHINE INTERACTION SHOULD BE UNDERSTOOD AS MERE TOOL-USE



Why should we disqualify machines because they are not living, biological beings?

What about assuming, that the way living beings fulfill the conditions for agency is just one way to realize agency?

MULTIPLE REALIZATIONS OF AGENCY



→
EXTEND THE CONCEPTION OF AGENCY IN VARIOUS INTERESTING WAYS

Neither intellectualist nor biological conceptions are wholly convincing

The Intellectualist Approach

attempts to draw a sharp distinction (a “dramatic divide”) between those who are capable of genuine thought and those who aren’t

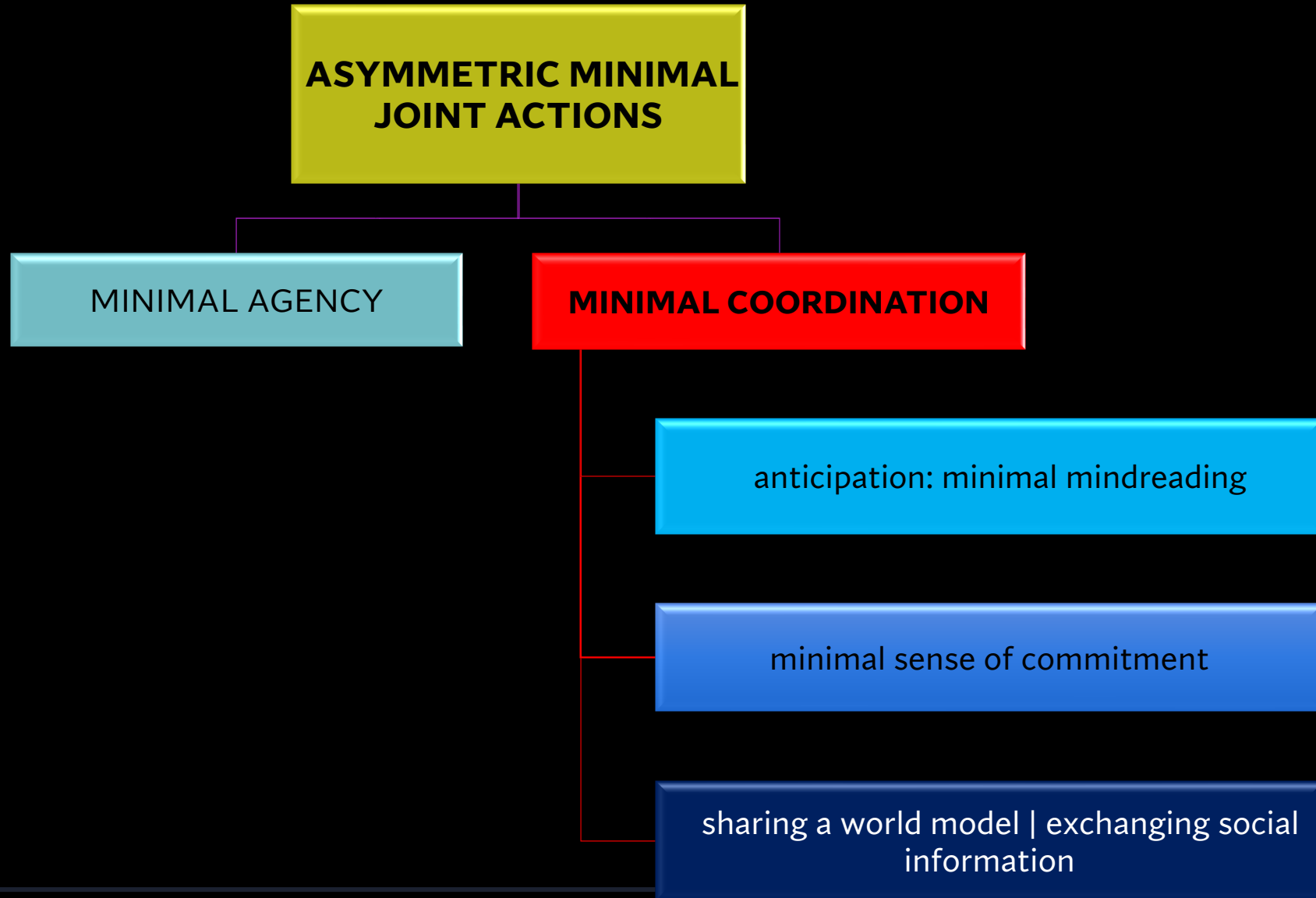
- have a difficulty explaining how one goes from one side of the divide to the other
- ❖ developmental & comparative psychology suggest that the change is *gradual and not sharp*

The Biological Approach

- attempts to draw the distinction due to a mysterious capacity of our brain to generate consciousness, feeling, subjectivity, and meaning
- fail to explain what the missing quality is, how we can know when it is there and when it is missing
- ❖ why we should suppose that it can only be realized in **electro-chemical brain reactions**, and not in silicon systems, or **neural nets**

Inbetween mere tool-use and social interactions

MINIMAL COORDINATION



MINIMAL MINDREADING



- ❖ **to coordinate your contribution in a joint action one has to be able to anticipate what the other agent will do next**



- utilize the notion of minimal mindreading that Steve Butterfill & Ian Apperley developed



- notion is a suitable starting point

- as they claim that underlying processing are implicit, nonverbal, automatic, and based on unconscious reasoning

MINIMAL SENSE OF COMMITMENT



- ❖ 'social glue' for much of what counts as social interactions



- ❖ coordination abilities are also based on the capacity to form expectations and motivations with respect to your counterpart

- utilize the notion of a minimal sense of commitment that illuminates minimal forms of interpersonal commitments
 - components (expectation or motivation) of a standard commitment can be disassociated
 - single occurrence of just one component can be treated as a sufficient condition



- asymmetric joint actions:

- minimal sense of commitment can be realized by just one participant
- most minimal case: only human counterparts entertain a minimal sense of commitment

Conclusion

CONSIDER THE POSSIBILITY OF CHANGING THE WINNING TEAM & QUESTIONING THE DICHOTOMY BETWEEN ANIMATE AND INANIMATE ENTITIES

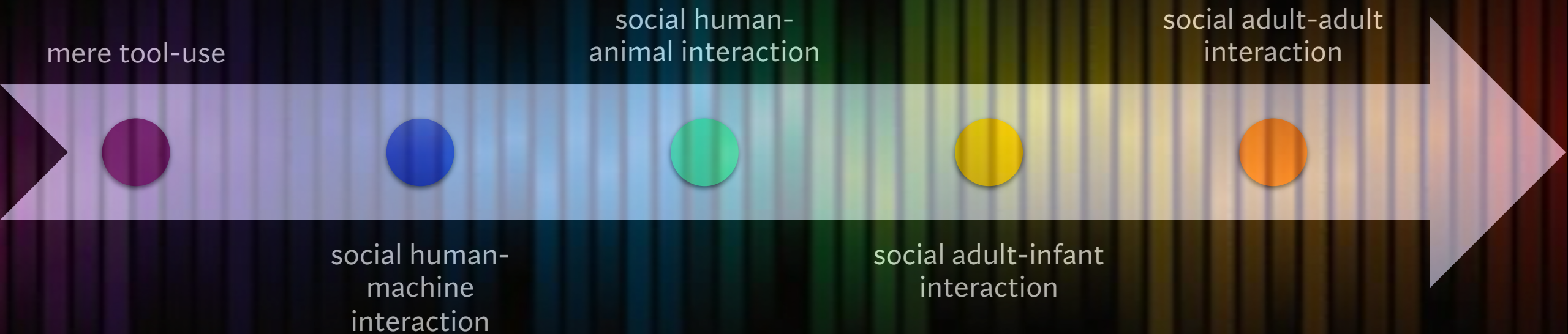
After all, we might be confronted with a new game.

- ❖ Before we can answer the question of **what we are doing when we interact with LLMs**, we have to conceptualize the INBETWEEN, because we cannot reduce our interactions with LLMs (and especially with future products of generative AI) to mere tool use.

THE MAIN AIM OF THIS TALK WAS TO PREPARE THE GROUNDS FOR QUESTIONING THE DICHOTOMY BETWEEN ANIMATE AND INANIMATE ENTITIES, AS THIS IS AN IMPORTANT PRESUPPOSITION FOR ANY DEVELOPMENT OF NEW NOTIONS THAT CAN CAPTURE PHENOMENA THAT LOCATE IN THE INBETWEEN.

IF WE ARE SUCCESSFUL WITH THIS, WE CAN ARGUE FOR A GRADUAL APPROACH.

A gradual approach



All this would not have been possible if I had not interacted with people & machines



Daniel
Dennett



Eric
Schwitzgebel



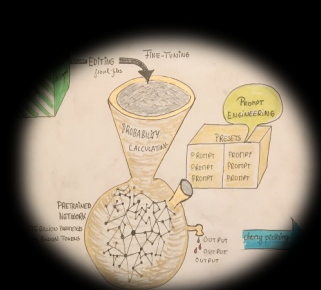
Mathew
Crosby



David
Schwitzgebel



Mike
Wilby



DigiDan

Thank you!



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