



#### Towards a Pragmatical Grounding of Large Language Models Wolfgang Eppler, Reinhard Heil



# **1 Grounding Problem of Al**



Harnad 1990 "The Symbol Grounding Problem" of symbolic AI systems

Bender et al. 2021 "Stochastic Parrots"Bender and Koller 2020 "... Meaning, Form, and Understanding in the Age of Data"

- Grounding problem persists on non-symbolic AI systems
- Meaning is a relation between
  - form and communicative intent
  - form and something external to language
- $\rightarrow$  LLMs have no meaning, only form
- $\rightarrow$  LLMs miss reference on actual world





### 2 Mental States

Rees (2022) stated an ontological error

Line of argument like this:

- Understanding, meaning, intentions are mental states.
- So far, mental states have been ascribed exclusively to humans.
- LLMs don't have mental states because they are not human.
- Therefore, the output of LLMs has no meaning.

 $\rightarrow$  No use of mental concepts as basic concepts, no communicative intent

Hypothesis:

"LLMs are not grounded in our actual world."

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# **3 Philosophers on Empiricism**



Quine 1951 "Two Dogmas of Empiricism"

- Analytic-synthetic distinction is wrong.
- Reductionism is wrong.

Davidson 1973 "On the Very Idea of a Conceptual Scheme" - third dogma of empiricism

- Dualism of scheme (form, language) and content (world, objects) is wrong.

 $\rightarrow$  Empiricism is false.

Reference and truth are problematic.

- $\rightarrow$  No reference from linguistic terms to immediate experience
- $\rightarrow$  No relation to something external to language

 $\rightarrow$  No grounding of language?



# **4 Grounding by Practices**



Grounding

- not by reference or relation

Grounding

- by handling objects
- by experiential learning during practical action

Brandom, Habermas as two representatives of pragmatism



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### **5 Brandom: Parrot and Observer**



Brandom: Difference between parrot and observer
Parrot responds with "That's red" seeing a red thing.
Observer understands the concept of "red"
Understand a concept:

- Know material inferences of a concept
- i.e. know premises and conclusions of concept "If I get a red-wrapped present, it must be my birthday."
- → Inferential Semantics (Sellars 1953 "Inference and Meaning")
- Do LLMs have inferential semantics?Do LLMs have concepts?

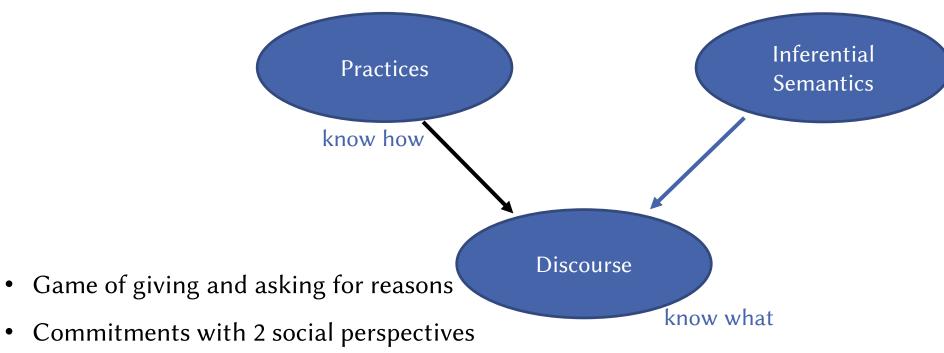


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# 5 Brandom in "Making it Explicit" 1996





• undertaken by Speaker

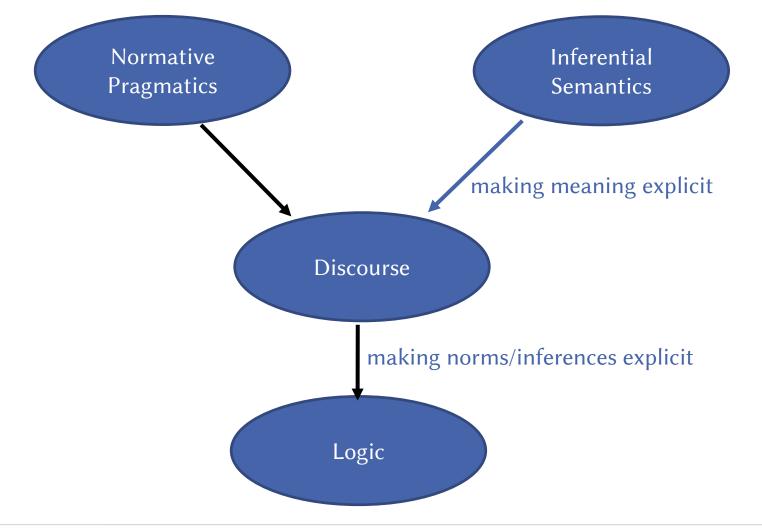
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- attributed by Hearer to Speaker •
- Keep score of commitments  $\rightarrow$  memorize and update them David Lewis 1978 "Scorekeeping in a Language Game"



## 5 Brandom in "Making it Explicit" 1996







## **5 Brandom: Two Social Perspectives**



#### Example

- A makes an assertion to S: "Kamala Harris is currently vice president of the United States."
- A undertakes commitment to this assertion.
- S attributes to A commitment to this assertion.
- S, but not A, knows: "Kamala Harris was a former attorney general in California."
- Is A committed to substitution "A former attorney general is currently vice president"?

#### De re $\rightarrow$ representational perspective

- "A claims of the former attorney general that she is currently vice president."
- S undertakes commitment and responsibility for the substitution.
- S doesn't attribute it to A.

#### **De dicto** → propositional perspective

- "A claims that the former attorney general is currently vice president."
- A never claimed that.
- S must not attribute commitment and responsibility for the substitution to A.





### 6 Habermas (Theorie des kommunikativen Handelns 1981)

Criticizes functionalist reason

• distinction of life-world and system

Life-world

- individuals interact and communicate
- engage with an objective world
- share understandings, cultural traditions, and social norms

System

- refers to the structured, organized aspects of society
- operates through formal mechanisms and instrumental rationality
- communication and social integration of life-world is disrupted





# 6 Habermas (Wahrheit und Rechtfertigung 1999)

Life-world

- Transition from action to discourse
  - If "practices damage and contradictions emerge in life-world" then subjective certainties evolve to "claimed truths"
- Discourse: justification by exchange of arguments
  - Participants adopt a reflexive attitude with two different perspectives
  - Participants argue about the truth of statements



## 6 Habermas – Learning Process



Learning processes

- with actions in life-world
- with discourse in life-world
- With systems





# 7 What about Large Language Models (LLM)?

Hypothesis: "LLMs are not grounded in our actual world."

Brandom:

• There is no scorekeeping, no memorization of commitments

Habermas:

• There is no discourse on true arguments, no learning process in the life-world

Due to batch processing of pre-training and fine-tuning:

- No incremental, no continuous learning
- No learning by individual experience

- No parameter update during dialog
- No practice in world



### **8 Possible Objection**



Context window of LLM memorizes dialog (and personal history)

Brandom 2008: " ... the updating process is highly sensitive to collateral commitments or beliefs"  $\rightarrow$  Update of all parameters would help

 $\rightarrow$  But: no parameter update with in-context learning

Change of meaning of one concept changes meaning of other concepts.

 $\rightarrow$  But: no adjustment of interrelated internal structure elements





# Thank you!

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# 5 Brandom in "Making it Explicit"



