Embodied Semantics

Towards a cognitive grounding of formal semantics

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A starting point

- Acceptance of robotic assistance crucially depends on the possibility of natural interaction between man and machine.
- 'Natural':
 - Multimodal, Realtime, Goal-directed,...
 - In general: Aspects of spatiotemporal embodiedness of both cognitive *and* bodily abilities.
- ⇒ Grounding of higher mental functions connects Computational Linguistics (CL) and Robotics.

State of the art, roughly

CL and Robotics figuratively approach each other:

- CL: Top-Down to the model theory of formal NL-semantics (e.g. CandC Tools: CCG+DRT).
- Robotics: Bottom-Up to behaviour-based pragmatics (e.g. BDI-based planning).

State of the art, figuratively



Objective: Connect CL and Robotics

- → Extend the sensomotoric capabilities of a robot with the ability to construct, maintain and manipulate complex symbolic representations and corresponding models
- Ground complex symbolic representations and corresponding models in the sensomotoric embodiedness of a robot
- \Rightarrow How to achieve this?

Events

- The proper processing of events constitutes the core mechanism of natural human-machine interaction
- E.g., events carry the pragmatic force of speech acts by means of their semantic structure
- A proper account to events must consider both semantics and pragmatics of events
- ⇒ Does the traditional approach to events in CL fulfill these requirements?

Events

- Davidson [1967]: Introduce a new ontological class of entities besides individuals: events.
- E.g. 'x build a house':

 $\exists e. \exists x. \exists y. agent(x) \land house(y) \land build(e, x, y)$

Vendler Classes

- Vendler [1957]: different verbs can have very different 'temporal profiles' in that they are used to describe very different *event complexes*:
- E.g. 'build a house' refers to a process of construction that brings about a house
- E.g. 'reach the top' refers to a punctual event

Event Nucleus

- Moens and Steedman [1988] capture Vendler's observation by the introduction of a subatomic structure of events:
- Event Nucleus:= preparatory state, culmination, consequent state
- E.g. 'build a house':= process of construction, topping-out ceremony, existence of the house

Simple-minded DRT

In Discourse Representation Theory (Kamp et al. [2007])

x, y, e e : build(x, y)house(y)

Meaning Postulate 1:

$$\begin{bmatrix} x, y, e \\ e : build(x, y) \\ house(y) \end{bmatrix} \Rightarrow \begin{bmatrix} s^{res} \\ e : build(x, y) \\ e)(s^{res} \\ s^{res} : house(y) \end{bmatrix}$$

Meaning Postulate 2:

$ \begin{array}{c} x,y,e\\ e:build(x,y)\\ house(y) \end{array} \Rightarrow$	$s^{prep} \\ e : build(x, y) \\ s^{prep} \subseteq e \\ s^{prep} : \neg house(y)$
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Model theory: Evaluation of DRS event conditions

Given a set of events and states EV structured by <, a universe of individuals U and an interpretation function I,

• $g \vDash_M e : R(x_1, \ldots, x_n)$ iff $\langle g(e), g(x_1), \ldots, g(x_n) \rangle \in I(R)$

where g is an assignment that maps *e* onto an element of *EV* and x_1, \ldots, x_n onto elements of *U*.

For 'x build a house': Events described by occurrences of 'build a house' are events that stand in some 'build'-relation to the one who is doing the building (or the ones who are doing the building) and the thing that is built.

Some consequent Problems

- This semantics does not *identify* (Searle [1969]) the building of a house as an action but as a relation ⇒ No pragmatic dimension of meaning.
- Where do U, I, EV, g come from? ⇒ Requires cognitive grounding, vs. the purely structural nature of Tarski-Models
- How can a robot draw any information from such a semantics about an appropriate understanding of what it means to build a house?
- ⇒ 'Blind alley' with respect to the desiderata of natural human-robot interaction.

Improve on the model theory



⇒ Provide the robot with mechanisms to construct and maintain U, I, EV, g

How do humans do that?

Given a perception of unsegmented temporal variation:

- Psychology: Humans structure a perceived temporal variation along the lines of plan-goal relationships and causal structures Zacks et al. [2001], Zacks and Swallow [2007]
- Philosophy: Causal, behavioural and intentional explanation of temporal variation. (E.g.Dretske [1988], Dennett [1989], Hartmann and Janich [1991])
- E.g. 'x is building a house': ascription of an underlying intention to x to predict x's behaviour.
- \Rightarrow Conservative transfer of these insights to a DRT-like setup.

Grounding

- Sensomotoric grounding: Output of a perpetual flow of snapshots from the object recognition.
- Behavioural grounding: Output from a BDI-based multi-agent planner.
- Combined grounding results in a branching time model, where the past and present is anchored by sensomotoric grounding and the future is anchored in behavioural grounding.

Grounded branching-time Models



Dynamic online models

- Combined grounding can be formalized with a modal Kripke semantics/CTL.
- But: the model must incorporate a notion of dynamics resulting from the permanent temporal move of the present and consequent revisions of the future (vs. the timelessness and offline construction of Tarski-Models).
- \Rightarrow Dynamic 'online' model of an agent x at time t: M(x)(t)
 - How must the semantic representations of events look like to match such dynamic models?
- \Rightarrow Dovetail semantic representations and model structures.

Event anchoring

- Semantic specification of the event ⇒ Event anchoring (Extend [Asher, 1986, Kamp, 1990] to temporal anchors).
 - Involved agents
 - The explanation type that identifies/constructs the event
 - Causes/Goals/Intented states of affairs
 - Tense
- Pragmatic specification of the event ⇒ Course of action corresponding to the event
 - Causal Chains, Plans, Intentions, other action-related information
 - Specifies a partial structure of the model (!)

Dummy example for event anchoring

E.g. 'x is building a house':



PRG t_0 – get-materials – t_1 – lay-bricks – t_2 – make-roof – t_3

Embodied semantics of events

Embodied event semantics comprises both the semantic and pragmatic dimension of events by means of anchoring.

- Semantic: truth-conditional structure embedding (word-to-world fit).
- Pragmatic: model manipulations via the adoption of new goals, beliefs or the execution of actions (world-to-word fit) specified by the semantic structure of the representation.
- \Rightarrow Reciprocal influence of semantics and pragmatics.
- \Rightarrow Computation of event meaning via incremental anchor resolution.
- \Rightarrow Leads to a notion of dynamic realtime interpretation

The connection between CL and Robotics



⇒ Grounding of higher mental functions connects Computational Linguistics (CL) and Robotics.

Thank you for your attention.

- Discussion
- Questions

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