# **Toward perceptually grounded formal semantics** *Simon Dobnik, Staffan Larsson, Robin Cooper*

Department of Philosophy, Linguistics and Theory of Science University of Gothenburg, Sweden



GÖTEBORGS UNIVERSITET

# Aims

Computational models of dynamic meaning in dialogue

**Computational models of symbolic and perceptual meaning** 

### **Traditional formal semantics**

X	•	Ind
c <sub>a-shape</sub>	•	apple-shape(x)
$c_{a-colour}$	•	apple-colour(x)
$c_{a-taste}$	•	apple-taste(x)
C <sub>a-smell</sub>	•	apple-smell(x)

Proofs objects of record types are **records** which include sensor readings (verification).

	•	Ind
)	•	Ind
a	•	loc(a)
Ь	•	loc(b)
T	•	ClassifierKnowledge
rel	•	$f(l_a, l_b, \pi) = \begin{cases} \text{left}(a, b) \end{cases}$

Model-theoretic semantics does not deal with perception and dynamic meaning.

#### **#1: What is the norm for set membership?**

This is a green ball.

True if in a given model the referent  $a_{37}$  is a member of a set containing green objects  $F(\text{green}) = \{\dots, a_{37}, \dots\}$ .

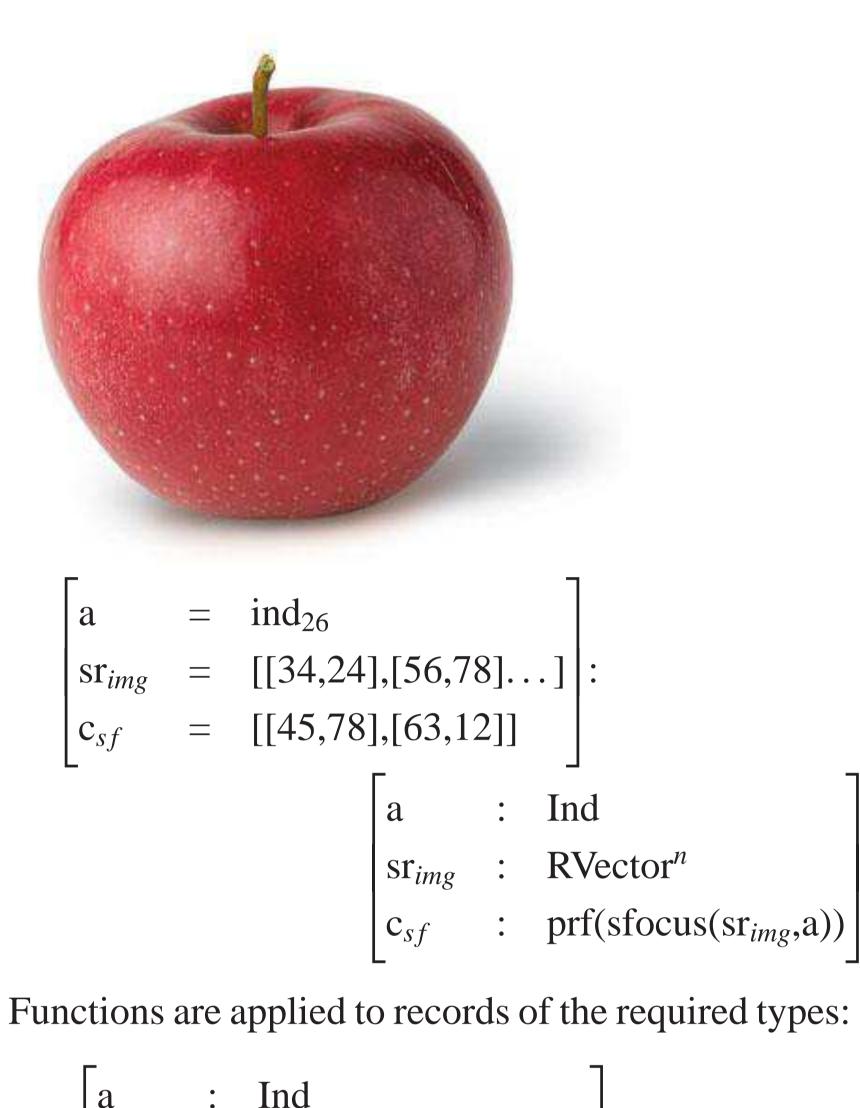
#2: Norm affected by perception (geometry) *The chair is to the left of the table.* True if in a given model the referents  $a_{56}$  and  $b_{61}$  can be found in the set of pairs defined by  $F(\text{left}) = \{..., \langle a_{56}, b_{61} \rangle, ... \}$ .

**#3: Competition of norms: geometry vs. function** *The umbrella is over a man.* 

#### **#4: Dynamic norm**

A: I like bears.

A: *That's a nice bear.*B: *Yes, it's a nice* panda.



The corrective feedback from a human is used to update the relation type:

 $\pi' = \text{retrain\_classifier}(\pi, l_a, l_b, \text{behind})$ 

 $f(\mathbf{l}_a, \mathbf{l}_b, \pi) = \begin{cases} \text{left}(a, b) \lor \\ \text{behind}(a, b) \end{cases}$ 

### **Coordinating symbolic knowledge**

The robot does not know about tables yet and the perceptional knowledge alone may not be enough to distinguish between tables and chairs.

a:Ind $c_{ch}$ :chair(a) $c_{ot}$ :class(a,furniture) $c_{osh}$ :chair-shape(a)

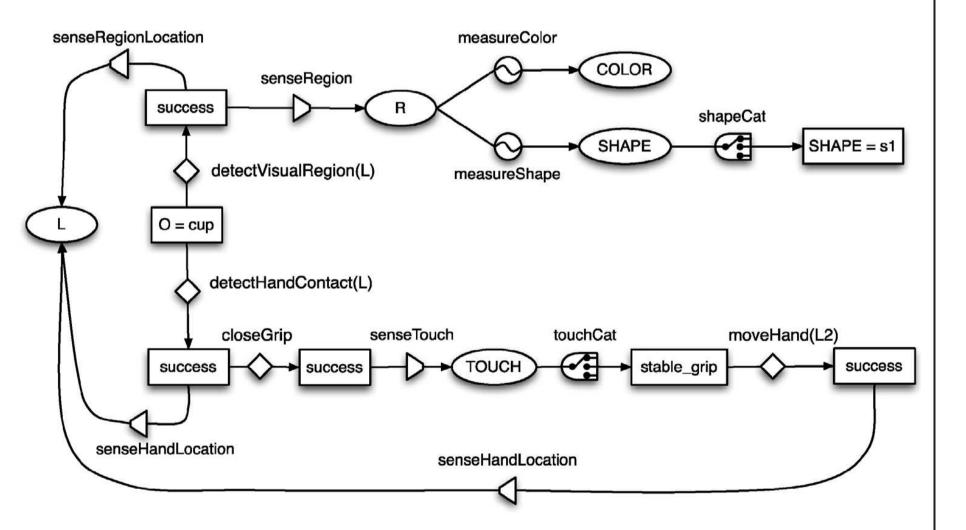
R: This is a chair.
H: No, it's a table.
R: A table.
H: One sits on a chair but one keeps food on a table.
R: Aha.

The object shape classifier is updated so that it also evaluates to table-shape(a) ( $\pi'$  = retrain\_classifier( $\pi$ , RVector<sup>*n*</sup>,table)) and a new record type for tables is created. New categorical type constraints are also added.

A: Panda.

# **Grounding language in vision**

Conceptual categories (*a cup*) are defined by action and perception (Roy 2005, p.190).



No account of how distributional and categorical meaning is:

- composed;
- reasoned about;
- compared;
- modified: refined or generalised.

$$\begin{bmatrix} c_{sf} & : & prf(sfocus(sr_{img},a)) \\ \pi & : & ClassifierKnowledge \end{bmatrix}$$

$$\left( \begin{bmatrix} c_{a-shape} = \begin{bmatrix} a & = & r.a \\ sr_{img} & = & r.sr_{img} \\ c_{sf} & = & r.c_{sf} \\ \pi & = & r.\pi \end{bmatrix} : f(r.sr_{img}, r.\pi, r.a)$$

**Classification** is a mapping from sensory readings to types:

 $f(\mathbf{r.sr}_{img}, \mathbf{r.}\boldsymbol{\pi}, \mathbf{r.a}) = \begin{cases} \text{apple-shape}(\mathbf{r.a}) \lor \\ \neg \text{ apple-shape}(\mathbf{r.a}) \end{cases}$ 

RVector<sup>n</sup>

 $\lambda r$ :

If something is apple-shaped, it might be an apple (cf. enthymemes).

$$\lambda r: \begin{bmatrix} a & : & \text{Ind} \\ c_{a-shape} & : & \text{apple-shape(a)} \end{bmatrix} \dots$$
$$(\begin{bmatrix} c_{apple} & : & \text{apple(r.a)} \end{bmatrix})$$

The more constraints can be verified/grounded, the higher the certainty that an individual is an apple.

## **TTR and dynamic meaning**

a	•	Ind
b	•	Ind
$c_{ch}$	•	chair(a)
C <sub>ot</sub>	•	class(a,furniture)
C <sub>ot</sub>	•	class(b,human)
C <sub>S</sub>	•	provides_support(a,b)
C <sub>osh</sub>	•	chair-shape(a)
-		_
	•	Ind

a	•	Ind
b	•	Ind
c <sub>tb</sub>	•	table(a)
C <sub>ot</sub>	•	class(a,furniture)
C <sub>ot</sub>	•	class(b,food)
C <sub>S</sub>	•	provides_support(a,b)
C <sub>osh</sub>	•	table-shape(a)

Categorical world knowledge is useful for directing

# **Type Theory with Records (TTR)**

Types are intensional categories. Perception is assignment to types. Agents may have different type systems.

*a* : Apple Proof objects : Type

Types may have a more complex structure: **record types**.

The meaning in TTR can be updated as agents interact in dialogue. Each agent has its own **take on a situation**. Agents coordinate meaning.

### **Coordinating perceptual knowledge**

R: The chair is to the left of the table.H: The chair is behind the table.R: OK.

Initially, the robot classifies every relation as "to the left of".

#### visual search and modelling object affordances.

### References

Roy, Deb. 2005. Semiotic schemas: a framework for grounding language in action and perception. *Artificial Intelligence* 167:170–205.

Cooper, Robin. 2005. Austinian truth, attitudes and type theory. *Research on Language and Computation* 3:333–362.

Larsson, Staffan. 2011. The TTR perceptron: Dynamic perceptual meanings and semantic coordination. *Proceedings of the 15th Workshop on the Semantics and Pragmatics of Dialogue* (*SemDial 2011 - Los Angelogue*). September 21–23, 2011 Los Angeles, California. 140–148.