

Semantics, action and perception - an overview of TTR

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`https:
//sites.google.com/site/typetheorywithrecords/slides`

Outline

Type theory and perception

TTR: Type theory with records

String theory of events

Inference from partial observation of events

Summary and bibliography

Outline

Type theory and perception

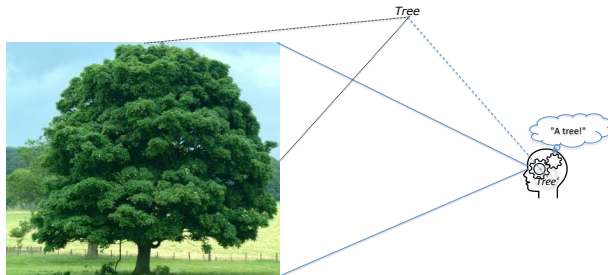
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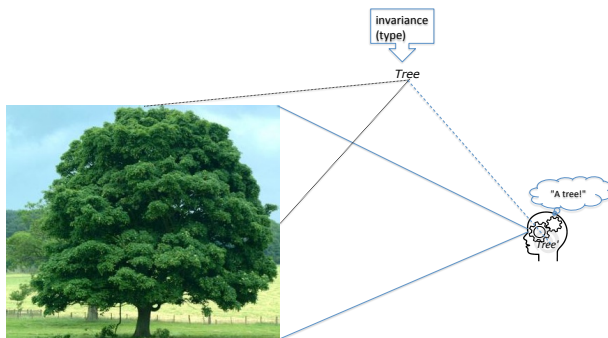
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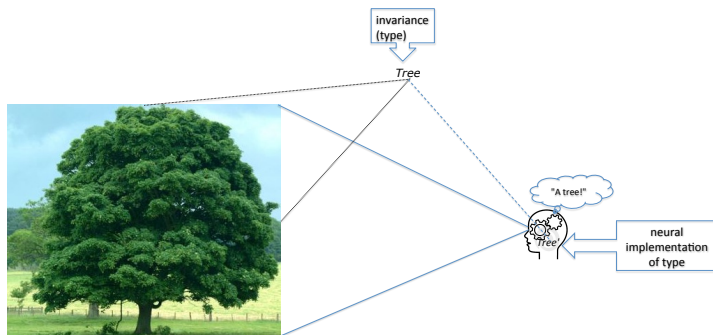
Seeing a tree (a simulation view)



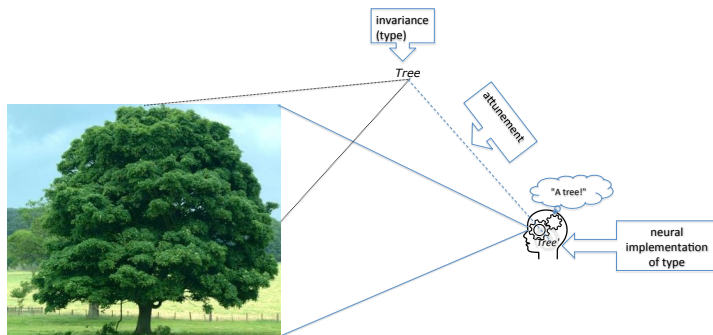
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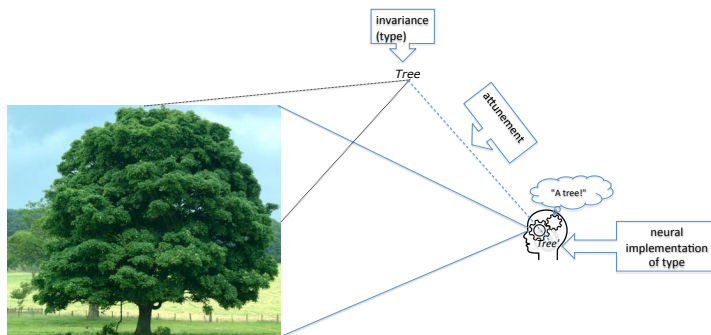
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Gibson (1986); Barwise and Perry (1983)

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TTR: Type theory with records I

- ▶ The most recent published reference for the details is Cooper (2012)
- ▶ an overview with some details Cooper and Ginzburg (2015), see also
<https://sites.google.com/site/semtrgbg/schedule> for lectures on youtube based on this material
- ▶ Also Cooper (2005a) for an earlier detailed treatment, Cooper (2005b) for relation to various semantic theories and Cooper (2017) for some linguistic motivation.
- ▶ <https://sites.google.com/site/typetheorywithrecords/drafts> for a book manuscript in (slow) progress, daily dump on <https://github.com/robincooper/ttl/blob/master/ttl.pdf>

TTR: Type theory with records II

- ▶ In general TTR references can be found at <https://sites.google.com/site/typetheorywithrecords/publications>
- ▶ implementation PyTTR on <https://github.com/GU-CLASP/pyttr>

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- ▶ two fundamental questions when characterizing a type theory:
 - ▶ what types are there?
 - ▶ for any type, what are the objects of that type?

Judgement

- ▶ (An agent judges that) object a is of type T .
- ▶ $a : T$
- ▶ in `pyttr`

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Witness conditions for types

- ▶ witness conditions for types can be external to type theory, for example, classifiers
- ▶ Arild Matsson's MLT thesis
(<https://github.com/arildm/imagettr-thesis>)
- ▶ in pyttr

Intensionality

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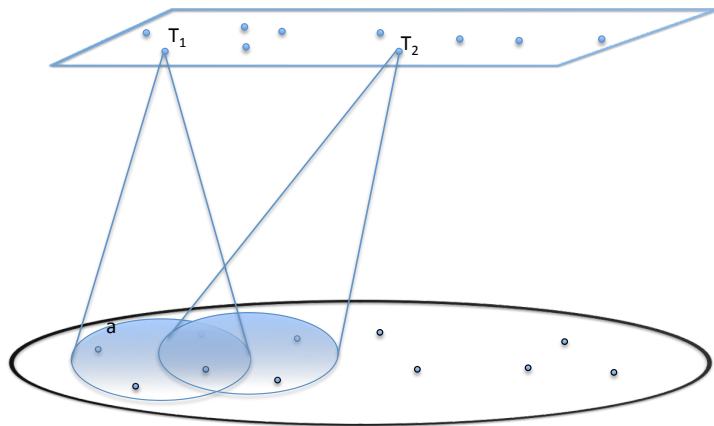
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$a : T_1$



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- ▶ another kind of complex type is *record type*, types which consist of a collection of types indexed by labels

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- ▶ allows us to find parts within a whole (e.g. in clarification)
- ▶ allows us to modify by adding or removing a part (e.g. in learning new meanings or coordinating meaning with your dialogue partner)

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- ▶ We might also want to include time intervals and locations as part of the arities of these predicates

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Witness conditions associated with ptypes

- ▶ in any situation, a is to the left of b iff b is to the right of a
- ▶ $s : \text{left}(a, b) \Leftrightarrow s : \text{right}(b, a)$
- ▶ in `pyttr`

Are ptypes the only types of situations?

- ▶ suppose b is Bill, a boy and d is Dinah, a dog
- ▶ we have allowed ourselves the ptype $\text{hug}(b,d)$, the type of situation where Bill hugs Dinah
- ▶ but we have not allowed ourselves the type of “boy hugs dog” situations corresponding to *a boy hugs a dog*
- ▶ there are a number of ways to construct such types in rich type theories – we use *record types*

A boy hugs a dog

Record type – “a collection of labelled types”

$$\left[\begin{array}{ll} x & : \text{Ind} \\ c_{\text{boy}} & : \text{boy}(x) \\ y & : \text{Ind} \\ c_{\text{dog}} & : \text{dog}(y) \\ e & : \text{hug}(x,y) \end{array} \right]$$

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Record type – “a collection of labelled types”
... not quite because of dependencies

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The official notation

$$\left[\begin{array}{ll} x & : \quad Ind \\ c_{\text{boy}} & : \quad \langle \lambda v : Ind(\text{boy}(v)), \langle x \rangle \rangle, \\ y & : \quad Ind \\ c_{\text{dog}} & : \quad \langle \lambda v : Ind(\text{dog}(v)), \langle y \rangle \rangle \\ e & : \quad \langle \lambda v_1 : Ind(\lambda v_2 : Ind(\text{hug}(v_1, v_2))), \\ & \quad \langle x, y \rangle \rangle \end{array} \right]$$

A record of type *a boy hugs a dog*

$$\left[\begin{array}{lcl} x & = & a \\ c_{\text{boy}} & = & s_1 \\ y & = & b \\ c_{\text{dog}} & = & s_2 \\ e & = & s_3 \end{array} \right]$$

where: $a : \text{Ind}$
 $s_1 : \text{boy}(a)$
 $b : \text{Ind}$
 $s_2 : \text{dog}(b)$
 $s_3 : \text{hug}(a,b)$

Two important facts about records

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- ▶ You can construct a record of a given type just in case there are objects of the types required by its fields – i.e. the labelling is arbitrary
- ▶ A record of a given type may contain more fields than required by the type – this record also belongs to a subtype of the type where the extra fields are added

Why are record types interesting for linguists?

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- ▶ frames (as in frame semantics and FrameNet)

in `pyttr`

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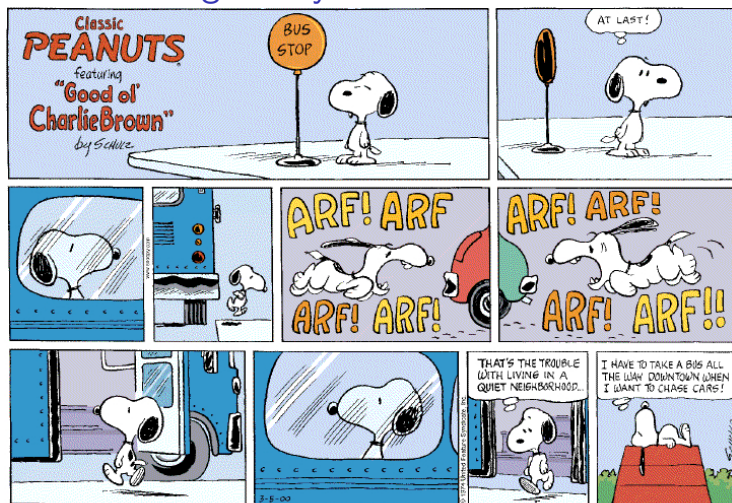
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Fernando's string theory



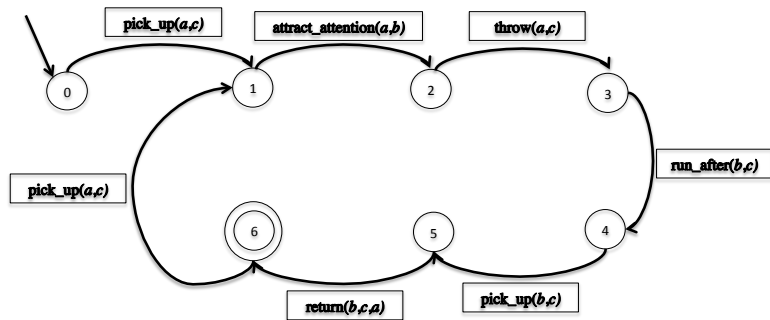
Some references to Fernando's work

Fernando (2004, 2006, 2008, 2009, 2015)

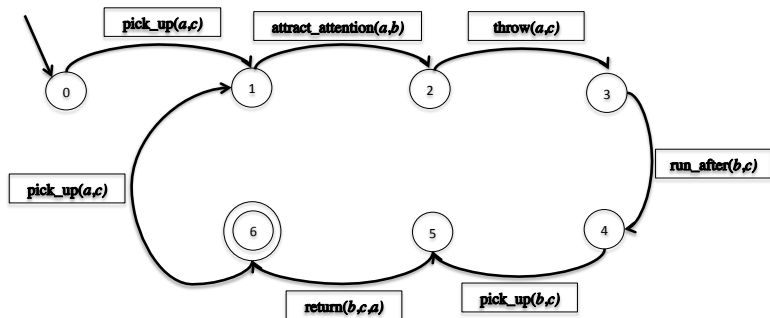
Regular types

1. if $T_1, T_2 \in \mathbf{Type}$, then $T_1 \frown T_2 \in \mathbf{Type}$
 $a : T_1 \frown T_2$ iff $a = x \frown y$, $x : T_1$ and $y : T_2$
2. if $T \in \mathbf{Type}$ then $T^+ \in \mathbf{Type}$.
 $a : T^+$ iff $a = x_1 \frown \dots \frown x_n$, $n > 0$ and for i , $1 \leq i \leq n$, $x_i : T$
...

A game of fetch



A game of fetch



$$(pick_up(a,c) \frown attract_attention(a,b) \frown throw(a,c) \frown run_after(b,c) \frown pick_up(b,c) \frown return(b,c,a))^+$$

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Partiality of event perception

- ▶ Do not need to observe all the frames in an event
- ▶ Suffices to observe enough to uniquely identify event types agent has in its resources

Inferring an event type from a partial observation

$$\lambda r: \left[\begin{array}{l} x:Ind \\ c_{human}:human(x) \\ y:Ind \\ c_{dog}:dog(y) \\ z:Ind \\ c_{stick}:stick(z) \\ e:pick_up(x,z) \frown attract_attention(x,y) \end{array} \right] ([e:play_fetch(r.x,r.y)])$$

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Three views of this inference

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- ▶ a *dependent type*
- ▶ perceiving something and inferring the type of something not (yet) perceived from that perception
- ▶ we will see a number of other uses of dependent types, for example as the interpretation of verb phrases

in pyttr

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- ▶ Type theory as a formal theory related to perception
- ▶ A basic introduction to TTR:
 - ▶ basic types (e.g. *Ind*)
 - ▶ ptypes (e.g. `hug(Sam,Dinah)`)
 - ▶ models which supply objects of basic types and ptypes
 - ▶ record types
 - ▶ mentioned some of their linguistic applications
 - ▶ string types
 - ▶ strings of events rather than strings of symbols

Bibliography I

References to work on TTR are available on
<https://sites.google.com/site/typetheorywithrecords>

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