

Two facets of Computer Science: A Personal Experience with the Compute Cycle

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- Horsman et al. (2013) suggested a Compute Cycle
 - 1 First view of the cycle establishes what Computer Programmers do in fixing a program for studying a problem.
 - 2 Second view of the cycle assumes that first cycle is possible, and turns to nature to explore natural problems, keeping in mind what makes first cycle physically possible.
- This has been the implicit understanding of Computer Science for many, for example Turing (1950); Simon (1969); Newell (1973); Marr (1977); Knuth (1996); McDermott (2001); Cockshott et al. (2012)
- In Bozşahin (2016, 2018), I gave it a try in language and planning, implicitly using both cycles.

- Language syntax and human planning abilities seem disparate from an external view.
- Their internal mechanisms appear to be same at some level of abstraction.
- That abstraction, **automaton**, seems to be relevant to explain planning in humans and chimpanzees, in addition to constraints on language.
- Is recursion the key distinction within species *Homo*? probably not
- More objections: Lobina (2011, 2014); Lobina and García-Albea (2009), among others.

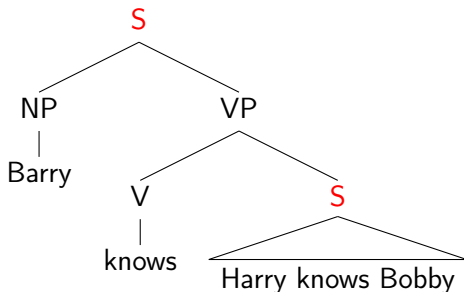
What is at stake in studying recursion and mind?

- Hauser et al. (2002); Fitch et al. (2005); Fitch (2014)
“[Dendrophilia hypothesis](#)”
Syntactic recursion is the most unique human capacity.
- A one-time cogsci conference was dedicated to recursion in humans:
Speas and Roeper (2009)
- TAG, CCG, LFG, HPSG all use some conception of recursion in theorizing
- Generativists conceive it as operation of the mind.
- Recursion in the lexicon: limits to be explained.

- TAG: factorization of adjunction and substitution.
- CCG: closure of combinations (no fixpoint combinators).
- HPSG: re-entrant unification.
- LFG: Modelling recursion at the functional level.
- MP: move/merge as mind functions?

An argument I will not follow

- Lobina and García-Albea (2009): merge is closure.
Only internal merge (move) is recursive.
- CCG-TAG-G/HPSG: Combinatory capacity does not need movement.
- MP has other things to worry about besides recursion (Kobele and Michaelis, 2009; Stabler, 2010).
- Epstein et al. (1998): move can be eliminated from MP.
- Therefore recursion is probably not necessary.
- Suggestion: what kind of recursion in data can rise from a narrow mechanism?



Barry knows Harry knows Jerry knows Bobby.

What can CS concepts say about the Natural World?

Recursion in linguistics

Syntactic recursion is semantic

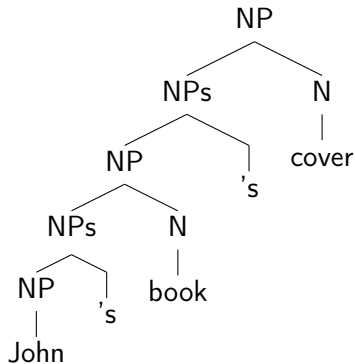
Not recursion by name

Computer Science: recursion by name

Planning: recursion not species-specific

Human recursion not syntax-specific

References



- All these examples are **recursion by value**
- **Another** instance of a predicate is taken as a value.
- **know, think** as lexical items do not refer back to their own structure,
but to another structure which they take as argument.
- Recursive lexical elements would not be finitely typeable.

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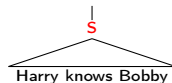
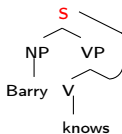
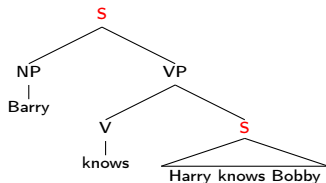
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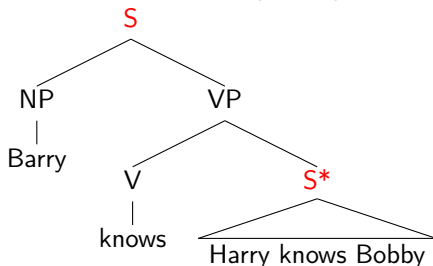
One predication of know on the right,

rather than two, as in recursion by value.

Barry knows Barry knows Barry knows Harry knows Bobby.

Not the native speakers' understanding of knowers and knowees.

Some theories take care of the empirical problem with a single tree:



Two distinct S nodes. (LTAG; Joshi and Schabes, 1992)

Two distinct combination: substitution and adjunction.

The problem is not trees, but not making the distinction.

Some definitions with or without recursion by name.

- Tree: (i) a node called *root* is a **tree**, denoted as $T(\text{root})$.
(ii) The subtrees of a tree T , $T(T_1, T_2, \dots T_m)$, are partitioned into $T_1, T_2, \dots T_m$, where each T_i is a **tree**.
- Tree: Any **tree** is a collection of *nested sets*. A collection of non-empty sets is nested if, given any pair X, Y of the sets, either $X \subseteq Y$ or $X \supseteq Y$ or X and Y are disjoint.
Knuth (1968: 314)

- $Y \stackrel{\text{def}}{=} \lambda h. (\lambda x. h(x\ x)) (\lambda x. h(x\ x))$

Curry and Feys (1958)

- $U \stackrel{\text{def}}{=} (\lambda x \lambda y. y(xxy)) (\lambda x \lambda y. y(xxy))$

Turing (1937)

- $Yh = h(Yh) = h(h(Yh)) = \dots$

- $Uh = h(Uh) = h(h(Uh)) = \dots$

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- CCG never employed fixpoint combinators.
- **BST**-system is undecidable if left unconstrained.
- Steedman's principles and constraints (e.g. morpholexical type-raising) provide a near-context-free system.
- Recursion is not constitutive in CCG (unlike TAG).

- $$fib(n) = fib(n-1) + fib(n-2) \qquad fib(0) = 0, fib(1) = 1$$

- Let

$$fib = \lambda n. \text{if } (n == 0) \ 0 \text{ else if } (n == 1) \ 1 \text{ else } fib(n-1) + fib(n-2)$$

- Let $h = \lambda f. \lambda n. \text{if } (n == 0) \ 0 \text{ else if } (n == 1) \ 1 \text{ else } f(n-1) + f(n-2)$

Then $fib = h \ fib$ because $fib \ n = h \ fib \ n, \forall n \geq 0$

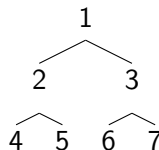
And $fib = \mathbf{Y}h$ because $fib \ n = \mathbf{Y}h \ n, \forall n$, and $\mathbf{Y}x = x(\mathbf{Y}x), \forall x$

Remember how we can eliminate named recursion from non tail-recursive programs:

First eliminate tail recursion

Pre-order Tree Traversal:

1-2-4-5-3-6-7



```
procedure traverse(t:link)
  begin
    if t <> nil then begin
      visit(t);
      traverse(t↑.l);
      traverse(t↑.r)
    end
  end
```

```
procedure traverse(t:link)
  label 0,1;
  begin
    0:if t = nil then goto 1;
    visit(t);
    traverse(t↑.l);
    t:=t↑.r; goto 0
  end
  1:end
```


Then add a stack for t and address:

```
procedure traverse(t:link)
  label 0,1;
  begin
    0:if t = nil then goto 1;
    visit(t);
    traverse(t↑.l);
    t:=t↑.r; goto 0
  1:end
```

```
procedure traverse(t:link)
  label 0,1,2,3;
  begin
    0:if t = nil then goto 1;
    visit(t);
    push(t); push(3:);
    t:=t↑.l; goto 0;
    3: t:=t↑.r; goto 0
    1: if stackempty then
      goto 2;
    lbl:= pop(); t:= pop();
    goto lbl;
  2:end
```

Without a stack we cannot do this.

Now we have no recursion, but, the STACK gives you representation of arbitrary complexity at EXECUTION TIME.

- Why unnatural? It is not **finitely typeable**
 - 1 read: not finitely representable.
 - 2 means: It has to be specified in the form of a program
 - 3 Curry (1934) suggested **axiom schemata**, not axioms themselves.
- 1-3 led to Curry-Howard isomorphism between programs, proofs, types and axiom schemata
 - All human knowledge we can think of is finitely representable.
 - Human words are finitely representable even if they take same argument types. (by value)
Bozşahin (2012) suggests some impossible lexical structures.
 - Human plans are finitely representable too.

Interim summary:

- Syntactic recursion **in language** is not recursion by name.
- Syntactic recursion **in programming** is can be recursion by name.
- Recursion not always constitutive in theoretical linguistics.
- Everett (2005, 2009): Is he really claiming Pirahã people cannot entertain recursive thoughts?
- Recursion by value is limited in humans.
- Recursion by value is attested in non-humans.
- Recursion by value is attested in domains other than language.

- Reactive planning (finite-state)
- Instrumental planning (push-down store of plans, PDA)
- Collaborative planning (embedded push-down store, EPDA)

Lochbaum (1998); Bratman (1992); Petrick and Bacchus (2002); Steedman and Petrick (2007);
Grosz and Kraus (1993); Grosz et al. (1999)

- I-intentions (PDA)
- We-intentions (Searle, 1990) (embedded PDA)
- Can multi-agent planning be sum of plans of single agents?
or **payoff matrices** of agents and conventions? Lewis (1969)

- Searle's (1990) **scurrying from rain in the park** and **corps de ballet in the rain**.
- The embedded push-downs of counter-attack in football as common goal
 - A: I chase the ball
 - B: I chase the ball
 - C: I keep close to chasers to join forces
 - D: I keep a watch behind my back
 - E: I keep a watch behind D's back
- No one **singly** "executes" counter-attack!
- It makes a difference to have a simple stack or stack of stacks (cooperation)

- Finite-state plans: whatever can be afforded by finite history and non-embedded behavior.
- We cannot capture a case where separate actions of an agent match step by step,
- or plans that wait for other plans.
ex: picking up flowers on the return path of laying them on the floor, ensuring same amount has been picked.

- Instrumental plans: limited context dependency
In animals and humans
- Julian Jaynes (1976): hapless chimpanzee in captivity.
- Plans that contain other plans and other agents.
- Tomasello et al. (2003): Chimpanzees might have a mind but cannot embed minds within minds (no recursion?)
- Formalizing the dependencies in terms of grammars and automata.

- Plans within plans?

Jaynes (1976: 219)

S	→	FillWater LureKeeper Spit
LureKeeper	→	Coax Hail
Coax	→	Stalk Coax AskBanana

- Spit depends on keeper,
- Coax might fail (spit no more part of **this** plan)

- External view: finite-state dependencies
- Internal view (planner): contextualized dependencies
- Truly context-free recursion in animals? Probably not (Van Heijningen et al., 2009)
- equiv. to having same dependencies in external and internal view.

- Hauser et al. (2002); Fitch et al. (2005) do not deny non-syntactic recursion in humans
(((the hole) in the tree) in the glade) by the stream)
- A closer look at non-syntactic recursion shows striking similarity to language.
- 'Syntax is most unique human capacity' argument weakens.
- A certain kind of recursion seems uniquely human.
- Steedman (2014) goes even further, to a narrower class of pushdown machines.

(Scurry-in-rain grammar)

$$S_i \rightarrow \alpha_i \mid A_i$$
$$A_1 \rightarrow \text{run, and do } S_1\text{'s work}$$
$$\vdots$$
$$A_n \rightarrow \text{run, and do } S_n\text{'s work}$$

where α_i is a plan with a base case A_i

(Dance-in-rain grammar)

$$\begin{array}{ll}
 S_i & \rightarrow S'_i[\pi(S_1, \dots, S_n)] \quad \pi(x): \text{a permutation of } x \\
 S'_i[S_j \dots] & \rightarrow \alpha_j S'_i[\dots] \beta_j \\
 \vdots & \\
 S'_i[S_i] & \rightarrow \text{run} \\
 & \text{and do } S_i\text{'s work } A_i
 \end{array}$$

right-hand sides: plans and intentions.

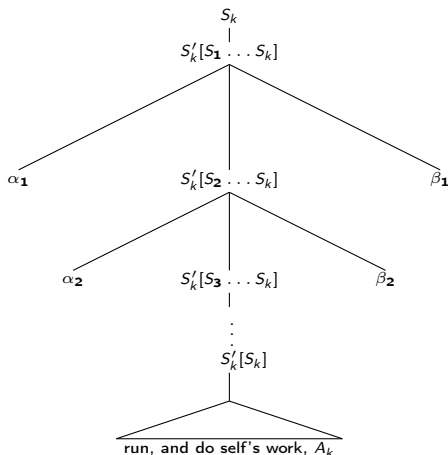
actions and knowledge states are members of RHSs.

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I-intentions
We-intentions
 Cross-serial dependencies
 Psychology

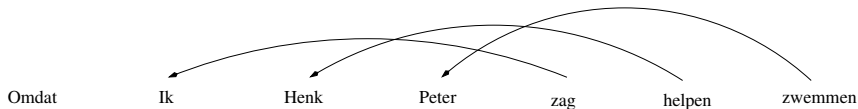
Participant k 's grammar for collaborative dancing in the rain.



personal grammar: ' $S'_i[S_i]$ ' rules.
 overall collaboration: top rule common to everyone.

α, β contextualize knowledge states and actions (not actions of k)

- Such grammars are linear-indexed. (LIG)
- They can handle certain kinds of crossing dependencies.
- And correspond to a **stack of stacks** as **automaton**.
- Embedded Push-down Automata Vijay-Shanker (1987); Joshi (1990)



‘because I saw Henk help Peter swim ...’

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Dutch and Swiss German style dependencies formalized:

$$\begin{aligned} S_{[\dots]} &\rightarrow n_i S_{[i\dots]} \\ S_{[\dots]} &\rightarrow S'_{[\dots]} \\ S'_{[i\dots]} &\rightarrow S'_{[\dots]} v_i \\ S'_{[\]} &\rightarrow \epsilon \end{aligned}$$

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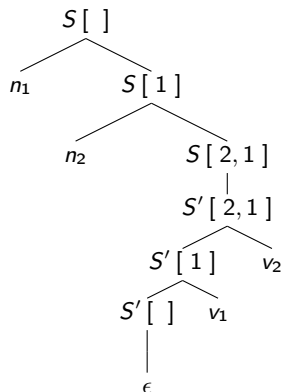
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$n_1 n_2 v_1 v_2$

- This automata has predictive power:
- $\{a^n b^n c^n \mid n \geq 0\}$ is strictly not context-free but LIG
- no such grammars for $\{www \mid w \in \{a, b, c\}^*\}$,
or for $\{w \mid w \in \{a, b, c\}^* \text{ and } |w|_a = |w|_b = |w|_c\}$
Kanazawa and Salvati (2012),
 $\{a^n b^n c^n d^n e^n \mid n \geq 0\}$ (not a linear metric)
- Instrumental plans and i-intentions: PDA
- Collaborative plans and we-intentions: EPDA ?
- Syntactic capacity in the limit: EPDA (actually linear, LEPDA)

Temporal integration is not found exclusively in language; the coordination of leg movements in insects, the song of birds, the control of trotting and pacing in a gaited horse, the rat running the maze, the architect designing a house, and the carpenter sawing a board present a problem of sequences of action which cannot be explained in terms of successions of external stimuli. Lashley (1951: 113)

- Some **internal** mechanism seems to be at work for planning and language.
- Linear-indexed grammar and associated automata (EPDA) has been the most explicit proposal for what that mechanism might be.
- Not reasoning by analogy: we want to understand limits of **natural computation by the mind** by explicit proposals for its mechanism from CS.
- Understanding what added explanation can be brought in by a class of automata.
- Such mechanisms seem only depend on recursion by value (**natural recursion?**)

Conclusion

- Humans appear to be uniquely capable of recursion by value, of the kind that can be afforded by a stack of stacks.
- Various predictions about syntax and other cognitive processes follow from a Computer Science way of thinking about them.
- CS seems to make one more fundamental natural question explicit:
What evidence do we have that language (or syntax) was there first in the exploits of a potentially common computational substrate?

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