#### Our special friend, language

Seminar week #1: Non-information-density approaches to online processing, Winter 2015/2016

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### Today's agenda

- Introduction to the "concept" / purpose of this seminar.
- Getting to know each other.
- Preliminary organizational details.

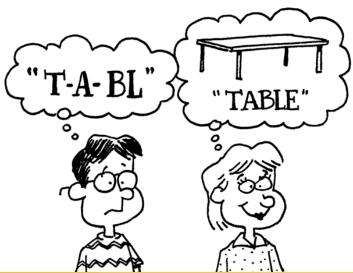
So. . .

## I have some questions for the audience. (Uh oh)

### What is language?



### No, seriously, what is language?



### Actually, I don't have a serious answer.

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Really?

### The real question I want to ask is...

### ... what makes language "linguistic"?

## Seriously, there are other ways to communicate complex thoughts.



# But language has particular characteristics that go beyond communication.

Hey, more Wikipedia, why not?

- "Mental faculty, organ, or instinct."
- "Formal symbolic system."
- "Tool for communication."

So where in these does the "linguistic" part of language exist?

## Theoretical linguistics focused on the "mental organ" part.

Generative linguistics: Chomsky and beyond.

- Divide language into (roughly speaking):
  - "Competence": the abstract knowledge of linguistic structure and the processes required to assemble it.
  - "Performance": the articulatory and perceptual vicissitudes involved in "producing" and "consuming" language.

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• Computation/logic/formalism: Constrains the representation of...competence?

## This requires an implicit methodology of research.

Performance isn't the point: it's the grimy mirror through which we see the mental organ of language.

- We have no "direct" access to competence, so there is a "necessary evil" of making use of what we have access to.
- Formalism: allows us to write down generalizations.



### So what about online processing?

What sort of relationship can we have between a "competence" theory and the observations of linguistic behaviour?

- We need a "linking theory".
- For a competence theory, the real question:
  - Words arrive in a sequence.
  - But the rules that define possible utterances (via formal representations) are not necessarily sequential.
  - Can we make a minimal inference between these facts?

### Yes: exploit the derivation.

1960s and 1970s: the Derivational Theory of Complexity (DTC).

- Reliant on now-outdated notions of "deep structure" (DS) and "surface structure." (SS)
- ullet Difficulty in processing pprox derivational distance between DS and SS.

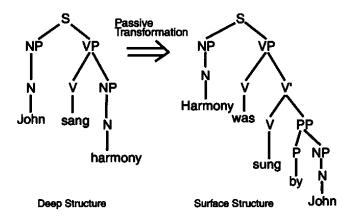
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- Alleged to have failed.
  - Some derivations at the time didn't correlate well to processing measures.
  - (We'll touch on this in the next session.)

### (Just to give a flavour of the DTC.)

A thing that probably worked: passive constructions.



## But performance is where communication happens!

People *use* language for a *purpose* beyond their abstract knowledge of language.

- Are these purposes part of the "grimy mirror"?
- Do they belong to some other area of cognition?
- How far must we extract away from them, before we can dig down to "the linguistic", narrowly construed?

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Is that so?

The implication/presupposition: language structure is not (fully? mostly?) conditioned on use!

### But not everyone is happy with this.

#### What would the world look like...

- ...if "folk" beliefs about language-as-communication were true?
- ...if "world-relevant" content of the language were what language is for?
- ...if the supposed structural details of "competence" were actually artifacts of function-driven behaviour?

### Who would be happy if that were true?

Linguistics also contains a variety of functional approaches:

- Examples include the Prague School, Systemic Functional Grammar, etc.
- Often driven by a demand to analyze language in sociological or literary terms.
- Varying degrees of formalism not really concerned with The Steps To Generate An Utterance.
- ... but ALL focused on the idea of language as a communicative tool, and any putative "mental organ" as itself a servant of that tool.

### But if structure is not the overriding theme...

... for traditional functionalist approaches, then how do we account for observed structure.

- Functionalist approaches account for the presence of "linguistic functions".
- Focus on how structures are *used*, not how they are *learnable* or even *possible*.
- (Obligatory mention of "poverty of the stimulus", etc.)

So we're *still* left with the question of where structure comes from.

### ...EXCEPT ...

### People have come up with theories that DO cover this.

The advent of statistical NLP changed things.

- Can now come up with large-scale statistical models of linguistic behaviour.
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And so a new approach was born.

#### So how do we use statistics...

... to come up with a theory of function?

A popular answer these days: surprisal: a measure of (un)predictability.

Unattended Children will be given an espresso and a free puppy.

#### Surprisal (Hale 2001)

$$-\log P(w_i|w_{1...i-1})$$

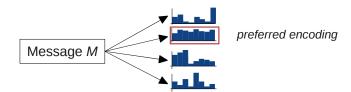
w words, can generalize to other linguistic events.

### Can surprisal explain linguistic structure?

According to some, it can!

#### Uniform information density (UID) hypothesis:

• Speakers tend to maintain a constant rate of information transfer.



### We can measure information transfer as surprisal.

Then we can condition the fine-grained structure of language on attempting to maintain a "flat" surprisal!

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Some "low-level" results:

- n-gram surprisal affects lexical/syntactic choices:
  - UID account can explain use of reduced forms in English. Levy and Jaeger (2007), Frank and Jaeger (2008) (e.g. "cannot" vs. "can't")

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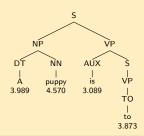
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     Levy and Jaeger (2007), Frank and Jaeger (2008) (e.g. "cannot" vs. "can't")
- n-gram surprisal vs. orthographic length:
  - surprisal from Google trigrams predicts word length. *Piantadosi et al. (2011)*

### But it works at even higher levels.

Syntactic surprisal example, from Roark parser (Roark 2001, Roark et al. 2009):

#### Top-ranked partial parse.

Sentence: A puppy is to || a dog what a kitten is to a cat.

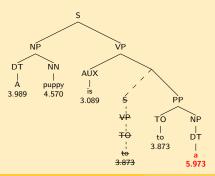


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#### How far can we go with this?

- Encroaches on DTC territory with information density!
- We even recently managed semantics (crudely: Sayeed, Fischer, and Demberg 2015).

### It's a matter of ambition.

I divide UID approaches into two categories (my names for them):

- Strong UID hypothesis
  - Information density governs most if not all linguistic structure.
  - Radical focus on communicative efficiency: language is structured around ensuring optimal communication, everything is performance.
- Weak UID hypothesis (← my preference, obviously)
  - Information density governs part of linguistic performance.
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(Obviously these are strawmen/extremes.)

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How much of linguistic behaviour is "left over" for explanation in structural terms?

Because there's lots of reasons to think UID is not the last word!

- Statistical approaches that are **not** yet fully connected to information theory e.g. distributional semantics.
- Structural approaches still not dead (!), often related to memory-limit approaches.

And I would like to remind everyone, myself included, about what's there.

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—particularly given SFB1102, which is about information density.

#### Goals of the seminar

- To gain a broad understanding of the aspects of sentence processing not focused on communicative function — particularly not direct information-transfer concerns.
- To explore recent work in theory, experiment, computation focused on linguistic structure and mental organization.
- To remind the local community of on-going activity in non-ID research.
- To give students further practice in reading, presenting, and understanding a diverse range of research papers.

#### Ideally: a discussion group atmosphere.

### Who should take this seminar?

I want to avoid this seminar being too specialized.

- Sentence processing can be dealt with a very technical way, want to minimize the requirement to know a lot of formalism.
- Unfortunately, technical details are unavoidable, I'm hoping this is all we'll need:
  - Basic introductory understanding of syntax and semantics.
  - A little exposure to psycholinguistics/psych experimental methodology.
- Presenters: should assess their audience well.

## In this seminar, I want to focus on BREADTH, not DEPTH.

#### And the details...

 Meeting: Wednesday 12-2 (ct) – can we change this to later on Wednesday?

• First meeting: Today.

Location: C7.2 2.11.

• And there may be the occasional doge.



## And yet more details...

- Please read the web page: http://www.coli.uni-saarland.de/courses/nondensity15/
- Must sign up for the mailing list (on the web page).
- The schedule will unfold "dynamically" I will list readings on the mailing list as well as on the web site.
- I have listed some suggested papers for presentation on the web site with links, but the list is not exhaustive!

"Getting to know you" pause.

## Yes, we have requirements.

I'm not 100% sure how all of this stuff works, but I know:

- For any credit at all, all of you HAVE to do a presentation.
  - And I expect most of you to attend the presentations, most of the time.
- Some of you will want/need additional credit: write a term paper, requirements to be discussed based on how challenging your topic is.
- Yes, I do oral exams for those who need the credit for that.

## How will presentations be evaluated?

I want to formalize this a little bit:

- Demonstrated understanding of the topic: 40%.
- Ability to impart the material to other students: 30%.
- Quality of presentation materials: 15%.
- Discussion leadership/participation: 15%.

The "quality" part is a bit dangerous: see later.

# What can you present/write a term paper about?

Possible (non-exhaustive) types of topics:

- A specific paper in the literature, including but not limited to what I
  put up on the web page. (NB: some of the longer papers can be
  presented by two people.
- A survey of opinions on a particular phenomenon, theory, controversy, etc.
- A survey of a particular (claimed) principle.
- Your own original idea.
- . . .

Length of presentation: depends on participation.

### How should you present it?

#### Possible presentation style:

- Good old slideshow safest, I suppose.
- Detailed handout (traditional for syntax papers in particular).
- Even a well-presented whiteboard discussion is OK.

You will also *lead discussion* of the idea/paper/etc.

For evaluation: super-duper use of technology is nice but won't necessarily get you a better grade.

## The (rough/tentative) schedule

- Week 1 (today): this intro stuff.
- Week 2: I will talk about recent controversies in the context of a paper by Philips and Lewis (2012).
- Remaining weeks: student presentations.

The Wednesday right after New Year's may have to be rescheduled.

## Some things to consider

We are only trying to skim the highest levels: breadth more than depth!

- I don't expect you to understand deeply everything you read for the course.
- Theory changes over time and the "intro material" can become outdated, other than the basic axioms of logic.
- I want you to instead learn to "appreciate" the material at an abstract level and be able to pursue the "useful" threads.

### USEFUL?!?!!

