# Lexical Categories and Clarification: What Do We Clarify And Why?

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#### Clarification Requests

Ann: I saw John yesterday.

Bob: John??

Ann: Yes, John.

Dr Smith.

The one with the pipe & monocle.

Him.

<points>



#### **British National Corpus**

#### Purver, Ginzburg, Healey (SIGDIAL 2001):

Unknown: What are you making? Anon 1: Erm, it's a do- it's a log.

Unknown: A log?

Anon 1: Yeah a book, log book.

Richard: No I'll commute every day

Anon 6: Every day?

Richard: as if, er Saturday and Sunday

Anon 6: And all holidays?

Richard: Yeah

A: You see this thing did you buy this separately or did it come in the Walkman?

B: We were lent them.

A: Lent them?

B: Yeah.





#### **Communicator Corpus**

#### Rieser & Moore (ACL 2005):

Cust: I'll be returning on Thursday the fifth.

Agent: The fifth of February?

Agent: Okay I have two options ...with Hertz ...if not they do have

a lower rate with Budget and that is fifty one dollars.

Cust: Per day?

Agent: Per day um mm.

Agent: You need a visa.

Cust: I do need one?

Agent: Yes you do.



# Studying Meaning via Clarification

- Helpful for studies of meaning: how are CRs answered?
  - And HCI: how should they be answered?
- Multiple possible reasons, including acoustics:

Peter: But he couldn't work out why I was in school?

Muhammad: <unclear>

Peter: What?

Ambiguity of meaning:

George: you always had er er say every foot he had with

a piece of spunyarn in the wire

Anon 1: Spunyarn?

George: Spunyarn, yes

Anon 1: What's spunyarn?

George: Well that's like er tarred rope





#### Sources of Clarification

- What kind of words do we clarify (or not)?
  - What drives (mis)communication?
- Excluding whole sentences, unclear etc:

	DNC	Communicator
NP/Pro/PN/CN	76%	78%
Adj/Adv/Mod	12%	13%
VPs	4%	5%
Verhs	10/	0%
Det (numbers)	∠/0	1%
Det (other)	2%	0%
Prep/Conj	<0.5%	0%





#### **Content vs Function Words**

- Function word clarification very rare
  - (relative to content word clarification)
  - Content/function ratio ≈ 11
    - (comparing only single-word sources otherwise higher; determiners only higher)
- Seems intuitively plausible but why?
  - Less frequent?
  - More familiar?
  - Less contentful?
  - Hard to actually do?





### Content/Function: Frequency

- Effect of overall (token) frequency?
  - C/F source ratio ≈ 11
  - C/F frequency ratio ≈ 2 (corpus-dependent)
  - No.  $(\chi^2_{(1)} p < 0.002)$
- Familiarity? type-token ratio
  - Number of tokens (occurrences) per word (type)
  - Average rarity = type count / token count
  - C/F source ratio ≈ 11
  - C/F TTR ratio ≈ 11
  - Maybe!  $(\chi^2_{(1)}$  no significant differences)



#### Content/Function: Information

- Effect of lower information content?
- Method 1: cross-document frequency variance
  - Higher variance = more domain-dependence
  - (Francis & Kučera, 1982; Biber, 1995)
  - C/F source ratio ≈ 11
  - C/F variance ratio ≈ 0.9
  - No. (wrong direction!)



#### Content/Function: Information

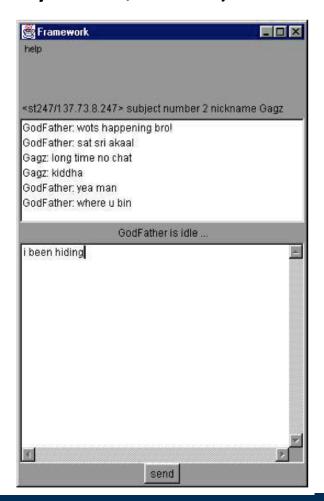
- Method 2: language model probability estimates
  - (Shannon, 1948)
    - Processing difficulty in parsing, reading (e.g. Roark 2009, Hale 2003)
  - Surprisal  $-log_2(p)$  (= unexpectedness/unpredictability)
    - C/F ratio ≈ 1.4
    - Maybe!
  - Entropy change  $\Delta H$  (= change in uncertainty)
    - Positive  $\Delta H$  = increased uncertainty
    - Negative  $\Delta H$  = increased information provided
    - C/F = negative/positive
    - Maybe! (but clarification <-> information, not uncertainty?)



## Content/Function: Answerability

DiET experiment toolkit (Healey et al, 2003)









### Content/Function: Answerability

- Healey et al (SIGDIAL, CogSci 2003)
- Insert fake "clarifications":
  - Repeat words from previous turns
  - Wait for response
- Content words: 45% responded to
  - The vast majority as direct CRs (92%)
- Function words: only 15% response  $(\chi^2_{(1)} p < 0.0004)$ 
  - And none of those as direct CRs with function word source

Laura: Can I have some toast please?

Jan: Some? Laura: Toast



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```
A: I have limited experience with balloons but... worth a try "B": a?

A: no, b

"B": oh ok

B: i'm not in the baloon
```



#### CR Sources: Some Hypotheses

- The C/F split suggests some hypotheses about what might drive clarification behaviour:
  - Higher type-token ratio (rarity)
  - Higher surprisal (unpredictability)
  - Higher entropy reduction (information content)
  - Difficulty of interpretation of CRs
- Logistic regression model, by utterance:
  - Coefficients: mean f -, mean h +, mean/max  $\Delta H$  -
  - (and variance coefficients near-zero)
  - (But: max h -, max H +)



#### **But What About Verbs?**

	RNC	Communicator
NP/Pro/PN/CN	76%	78%
Adj/Adv/Mod	12%	13%
VPs	4%	5%
Verbs	1%	0%
Det (numbers)	۷/0	1%
Det (other)	2%	0%
Prep/Conj	<0.5%	0%





#### **But What About Verbs?**

- CRs with V/VP sources can certainly happen:
  - A: You see this thing did you buy this separately or did it come in the Walkman?
  - B: We were lent them.
  - A: Lent them?
  - B: Yeah.
- But they are as rare as function-word sources!
  - If not more so:
  - Rodriguez & Schlangen (2004), Rieser & Moore (2005)
    - 0 examples found for *action-reference* class
    - 51% of examples were *NP* or *deictic reference*



# Noun/Verb: Frequency

- Effect of overall (token) frequency?
  - N/V source ratio ≈ 15 (for CN/CV; 40 for all)
  - N/V frequency ratio  $\approx 0.8 1.5$
  - No.  $(\chi^2_{(1)} p < 0.0001)$
- Familiarity? Expect type-token ratio N>V
  - N/V source ratio ≈ 15
  - N/V TTR ratio ≈ 1.8 3.4
  - Hmm, possibly I suppose ...
    - Expected direction, but much weaker than C/F
    - $\chi^2_{(1)}$  p < 0.05 in almost all cases this time



#### Noun/Verb: Information

- Surprisal –log<sub>2</sub>(p) (expect unexpectedness/ unpredictability N>V)
  - N/V ratio ≈ 0.9
  - No. (wrong direction)
    - (including auxiliaries etc changes this, but weak: 1.05)
- Entropy change  $\Delta H$  (= change in uncertainty)
  - Negative  $\Delta H$  = increased information provided
  - N, V both negative, with N<V (N/V ≈ 1.5)
  - Hmm, possibly I suppose ...
    - Expected direction, but much weaker than C/F
    - Verbs show entropy decrease too, but less so than nouns



### Noun/Verb: Answerability

- DiET with fake "clarifications"
- No significant difference in response rates:
  - Nouns: 52% responded to
  - Verbs: 41% responded to
  - No significant difference  $(\chi^2_{(1)} p > 0.17)$
- But perhaps different responses:
  - Nouns: only 4% "gap"/non-CR interpretations
  - Verbs: 18% "gap"/non-CR interpretations
  - Possibly significant difference ( $\chi^2_{(1)}$  p = 0.05; Fisher p > 0.085)
- Hmm, not really ...
  - No expected effect
  - (although maybe there's something going on)



### CR Sources: More Hypotheses?

- With the N/V split, our hypotheses aren't very helpful:
  - Higher type-token ratio (rarity): WEAK
  - Higher surprisal (unpredictability): NO
  - Higher entropy reduction (information): WEAK
  - Difficulty of interpretation of CRs: NO

So what's going on?



#### Perhaps Verbs are Not Nouns

- Differences suggest N/V categories are distinct
  - (helpful for typology? cross-linguistic studies?)
- Different semantic (cognitive?) status?
  - Conventionally both e>t:
- $\lambda x.snore(x)$   $\lambda x.woman(x)$
- But e.g. frame semantics: SELL[ buyer, seller, goods, money, ... ]
  - Perhaps verbs are structured around arguments
  - ... which are mostly NPs ... and they get clarified?
- Difference in referentiality?
  - Not simple: CRs not rare for common nouns, abstract NPs ...
  - Perhaps nouns project more "parameters"?
    - Discourse referents? Presuppositions?
- Differences in acquisition does that help?
  - N before V in some languages, opposite in others ...
  - CHILDES corpus suggests verb CRs more common in child speech!

