# Incrementality, Alignment and Shared Utterances – Revisited

Matthew Purver with Ruth Kempson, Pat Healey, Eleni Gregoromichelaki, Christine Howes, Wilfried Meyer-Viol, Graham White

The Dynamics of Conversational Dialogue (DynDial) ESRC-RES-062-23-0962 www.kcl.ac.uk/research/groups/ds

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### Outline

- 1 Dialogue and Incrementality
- 2 Dynamic Syntax
  - A Quick Introduction to DS
  - DS and Dialogue Modelling
- Empirical Investigations
  - Split Utterances Corpus Study
  - Split Utterances Experiments
  - Priming Corpus Study
- 4 Dynamic Syntax & Type Theory with Records
  - A Quick Introduction to TTR
  - Adding TTR to DS
  - Fragments & Split Utterances in DS/TTR

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### Dialogue and Incrementality

- Plenty of interest in dialogue
  - Formal models of dialogue moves, IS update, fragments
- Plenty of interest in incrementality
  - Incremental processing in psycholinguistics
  - Incremental parsing and generation in computational linguistics
- Increasing interest in incrementality in dialogue
  - e.g. [Schlangen and Skantze, 2009, Schuler et al., 2009]
  - Speeding up dialogue systems
  - Processing human-human dialogue
  - People do it this way . . .

# The Dynamics of Conversational Dialogue

- An ESRC project, joint between QMUL and KCL
  - formal/computational linguists, logicians, experimental psychologists
- Linguistic modelling using Dynamic Syntax [Kempson et al., 2001]
- Empirical studies using corpora and experiments

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- Linguistic modelling using Dynamic Syntax [Kempson et al., 2001]
- Empirical studies using corpora and experiments
- Non-sentential utterances
- Clarification requests
- Split utterances
- Priming/alignment

### Non-Sentential Utterances

- "Fragments" utterances without an explicit verbal predicate
- Common in dialogue (> 10% of turns)
- Established formal treatments
  - [Ginzburg, prep, Fernández, 2006, Asher and Lascarides, 2003, Schlangen, 2003]

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- Question-Under-Discussion analysis:

"Who left?" 
$$\rightarrow \lambda x.leave(x) \rightarrow QUD = \lambda x.leave(x)$$
 "John"  $\rightarrow QUD(john) \rightarrow leave(john)$ 

SDRT analysis:

"Who left?" 
$$\rightarrow \quad \alpha = \lambda x. leave(x)$$
"John"  $\rightarrow \quad \beta = P(john) \quad \rightsquigarrow QAP(\alpha, \beta), \beta = leave(john)$ 

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### Clarification Requests

- Requesting clarification or confirmation of a previous utterance
  - Most commonly in the form of NSUs
- Common in dialogue (3-5% of turns)
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  - [Ginzburg and Cooper, 2004, Schlangen, 2004, Purver, 2004]

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```
"John left" \rightarrow leave(john) \rightsquigarrow QUD = \lambda x.?assert(leave(x)) "John?" \rightarrow QUD(john) \rightarrow ?assert(leave(john))
```

SDRT analysis:

```
"John left" \rightarrow \alpha = leave(john)
"John?" \rightarrow \beta = P(john)
\rightsquigarrow QElab(\alpha, \beta), \beta = clarify(leave(john))
```

- Utterances containing a change in speaker
  - $\bullet\,\dots$  and therefore a change in hearer

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- B: Which is superb. ("expansion")

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- A: The profit for the group is 190,000.
- B: Which is superb. ("expansion")
- A: Before that then if they were ill
- G: They get nothing. ("completion")
  - Fundamental requirement for incremental processing
    - A good test for syntactic and semantic dependencies
    - A good test of NSU & CR processing
  - Treatment for one particular kind [Rieser and Poesio, prep]
    - LTAG grammar and conversational-event-based plan recognition

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Particularly interesting from an incrementality point of view

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- (1) Hugh: Ruth visited

Alex: Trecastle,

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  - B: any of your chapters? Not yet.

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  - Splits can occur before proposition-intention fixable:
- (3) A. They X-rayed me, and took a urine sample, took a blood sample. Er, the doctor
  - B: Chorlton?
  - A: Chorlton, mhm, he examined me, erm, he, he said now they were on about a slide [unclear] on my heart.

# Priming and/or Alignment

- Tendency to repeat previously used material
  - words

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- syntactic structures
- multi-word expressions
- ways of referring
- Both self- and other- effects
- Incremental through a dialogue but also through an utterance
- How should this affect our model of processing?
  - ...especially in the case of split utterances

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# Dynamic Syntax

- An inherently incremental grammatical framework
- Word-by-word incremental construction of semantic interpretation:
  - no autonomous level of syntax
  - "syntax" defined via constraints on incremental semantic structure-building
  - "grammar" is a set of procedures for incremental parsing
  - "trees" are semantic representations defined using LoFT [Blackburn and Meyer-Viol, 1994]
- Monotonic growth with underspecification-plus-enrichment
- Procedural definitions: constraints on how interpretations are built

# DS Trees as semantic representations

- End product of parsing is a semantic tree
- Nodes decorated with Ty() type and Fo() formula labels
   "John likes Mary":

$$Ty(t),$$

$$Fo(like(john, mary))$$

$$Ty(e),$$

$$Fo(john)$$

$$Ty(e) \rightarrow t),$$

$$Fo(\lambda x.like(x, mary))$$

$$Ty(e),$$

$$Ty(e) \rightarrow (e \rightarrow t),$$

$$Fo(mary)$$

$$Fo(\lambda y \lambda x.like(x, y))$$

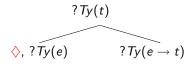
- Daughter order does not reflect sentence order!
- ullet Nodes interpretable as terms in the  $\lambda$ -calculus
- NPs map onto terms of type e using the  $\epsilon$ -calculus.

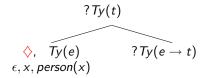
### Actions as tree-building procedures

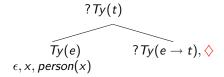
Words induce sets of actions to be carried out: "want"

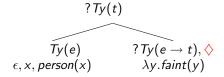
 General computational actions are also available e.g. requirement fulfillment, beta-reduction

?
$$Ty(t)$$
,  $\diamondsuit$ 









$$faint(\epsilon, x, person(x))$$

$$faint(\epsilon, x, person(x))$$

$$Ty(t), \diamondsuit$$

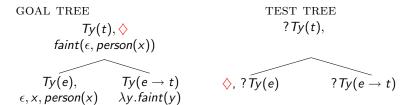
$$Ty(e) \qquad Ty(e \to t)$$

$$\epsilon, x, person(x) \qquad \lambda y. faint(y)$$

- Speakers go through the same tree-growth actions, except they also have a somewhat richer goal tree.
- Each word licensed must update partial tree towards the goal tree via subsumption constraint
- \* Generating Someone fainted

GOAL TREE 
$$Ty(t), \diamondsuit$$
 ?  $Ty(t), \diamondsuit$  ?  $Ty(t), \diamondsuit$   $Ty(e), Ty(e \rightarrow t)$   $\epsilon, x, person(x) \lambda y.faint(y)$ 

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GOAL TREE TEST TREE 
$$Ty(t), \diamondsuit \qquad ?Ty(t),$$
 
$$faint(\epsilon, person(x))$$
 
$$Ty(e), \qquad Ty(e \to t) \qquad \diamondsuit, \qquad Ty(e) \qquad ?Ty(e \to t)$$
 
$$\epsilon, x, person(x) \qquad \lambda y. faint(y) \qquad \epsilon, x, person(x)$$

Gen: "Someone

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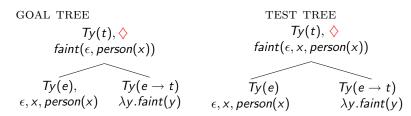
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GOAL TREE 
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 ?  $Ty(t), \Leftrightarrow$  ?  $Ty(t), \Leftrightarrow$   $Ty(e), \Rightarrow$   $Ty(e),$ 

Gen: "Someone fainted"

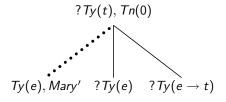
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Gen: "Someone fainted"

## Underspecification: structural

• "Unfixed" nodes - building underspecified tree relations



Left-dislocation "Mary, John likes"

## Underspecification: content

- Pronouns project META-VARIABLES (U)
- Substituted by item from context during construction

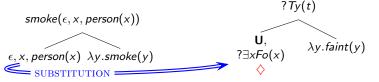
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TREE AS CONTEXT: TREE UNDER CONSTRUCTION:



Auxiliaries also project META-VARIABLES (V)
 Substituted by item from context in the same way

- ullet Auxiliaries also project META-VARIABLES ( $oldsymbol{V}$ ) Substituted by item from context in the same way
- (1) John smoked Bill did too.

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Tree as Context: Tree under Construction:



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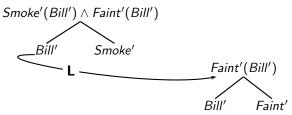
Tree as Context: Tree under Construction:



- Alternatively can use actions from context (sloppy readings)
- Simple model of context containing previous (partial) trees and action sequences

## Context-dependence: LINKed tree-pairs

- Relative clauses: pairs of LINKed trees evaluated as conjunction
  - e.g. Bill, who fainted, smokes.

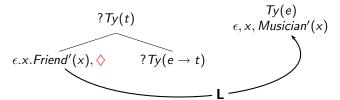


## Appositions as LINKed trees

e.g. A friend, a musician, smokes.

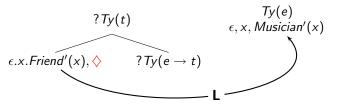
### Appositions as LINKed trees

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  - Partial tree as context with term enriched by LINKed tree of same type
  - Parsing A friend, a musician



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Evaluation of LINKed nodes both of type e yields composite term:

$$\epsilon, x, Friend'(x) \land Musician'(x)$$

Final formula: 
$$Smoke'(\epsilon, x, Friend'(x) \land Musician'(x))$$

## DS and Split Utterances

- DS seems well suited for split utterances
- Inherent word-by-word incrementality in parsing and generation
- Use of semantic constraints rather than "syntax"
- Use of same actions and partial structures in parsing and generation

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- DS seems well suited for split utterances
- Inherent word-by-word incrementality in parsing and generation
- Use of semantic constraints rather than "syntax"
- Use of same actions and partial structures in parsing and generation
- Is it too general (what are the real constraints)?
- Is it too simplistic (what do split utterances mean)?

### DS and Non-Sentential Utterances

- DS seems well suited for non-sentential utterances.
- LINK mechanism for apposition allows general fragment processing
- Semantics very underspecified
- Advantages & disadvantages

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• Is it too simplistic (what do NSUs mean)?

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# DS and Priming/Alignment

- DS seems well suited to explain priming/alignment phenomena
- Use of actions at all levels of processing
- Availability of recent action (sequences) for re-use
  - Lexical choice and disambiguation
  - Syntactic phenomena (e.g. DO/PO alternation [Branigan et al., 2000])
  - Semantic/pragmatic phenomena (e.g. routines [Garrod and Anderson, 1987], ellipsis construal [Hardt, 2008])

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  - Semantic/pragmatic phenomena (e.g. routines [Garrod and Anderson, 1987], ellipsis construal [Hardt, 2008])
- Does this really explain general (non-lexical) effects?
- Re-use of specific lexical action sequences should lead to priming
- What about re-use of computational action sequences?

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# **Empirical Investigations**

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- What do these phenomena really look like?
- Do split utterances really behave the way we think?
  - How common are they?
  - Where does the split happen?
  - What do they mean?
- What's the deal with lexical and syntactic priming?
  - Do we see them in ordinary dialogue?
  - Can we tell which effect is greater?

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# BNC Corpus Study

- Take a portion of the BNC (as annotated by [Fernández, 2006])
- Find all the split utterances
  - not just other-person cases [Skuplik, 1999, Szczepek, 2000]
  - or particular CA phenomena [Lerner, 2004, Rühlemann, 2007]
- See how often they occur, for same- and other-person cases
- See how variable the split point is
  - Completeness/constituency of the two halves completion/expansion
  - Dependencies across the split
- See what happens in between . . .

A1: I'll definitely use that

A1: I'll definitely use that ← END-COMPLETE=Y —

A1: I'll definitely use that

A1: in getting to know

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A1: I'll definitely use that

#### **CONTINUES**

• A1: in getting to know —

A1: I'll definitely use that

• A1: in getting to know — END-COMPLETE=N —

START-COMPLETE=N

• A1: I'll definitely use that

• A1: in getting to know

A1: new year seven

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A1: I'll definitely use that

• A1: in getting to know 👡

**CONTINUES** 

A1: new year seven

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- A1: new year seven END-COMPLETE=Y —
  START-COMPLETE=N

A1: I'll definitely use that

• UX: [reading] Get a headache?

A1: in getting to know

A1: new year seven

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- A1: I'll definitely use that
- UX: [reading] Get a headache?
- A1: [in getting to know]
- A2: [Year seven]
- A1: new year seven

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- A1: I'll definitely use that
- UX: [reading] Get a headache?
- A1: [in getting to know]
- A2: [Year seven]
- A1: new [year seven]
- A2: [Oh yeah] for year seven

- They're common: 19% of all contributions continue something
- 85% of these are same-person cases
- 15% are other-person cases

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• this is about 3% of all dialogue contributions (i.e. about as common as clarification)

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- They're common: 19% of all contributions continue something
- 85% of these are same-person cases
- 15% are other-person cases
  - this is about 3% of all dialogue contributions (i.e. about as common as clarification)
- Many are within-turn (although these are still interesting!)
- Some may be artefacts of the BNC transcription protocol
  - overlapping speech forces a split into two contributions
- But even without all these, 10% of contributions are SUs

- They're not always adjacent:
  - Same-person: 35% separated by a backchannel, 20% by 1 or more other turns
  - Other-person: 5% separated by a backchannel, 5% by 1 or more other turns
- Intervening material is often a clarification:
  - (1) J: If you press N
    - S: N?
    - J: N for name, it'll let you type in the docu- document name.
- The antecedent for clarification is often incomplete . . .

- The first part is often (but not always) incomplete: 26-28% of cases
- Some neat "syntactic" categories exist, as expected
- But these only cover 50-60% of cases
- Splits can apparently happen at any syntactic point, including inside NPs/PPs:
  - (2) F: We are going to call you theU: Wallering
  - (3) A: And they went over just to be fitted with theG: just fitted with the brass
- Note the presence of repair: only 5% of cases

#### Corpus Study: Observations

- Continuations often don't perform the same function as the antecedent:
  - (4) G: Had their own men
    - A: unload the boats?
    - G: unload the boats, yes.
  - (5) J: How does it generate?
    - M: It's generated with a handle and
    - J: Wound round?

. . .

- M: Yes, wind them round
- Very often a clarification request, but others possible e.g. confirmation, reformulation
- Not quite as simple as just completing a semantic structure

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# Corpus Study: Conclusions

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- Some conclusions play right into DS's hands . . .
  - Splits across syntactic & semantic constraints
  - Not always collaborative as per [Rieser and Poesio, prep]
  - Intervening turns use incomplete antecedents (partial trees)

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# Corpus Study: Conclusions

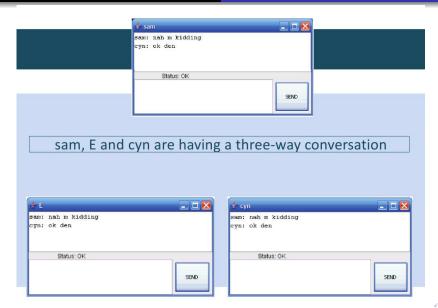
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  - Intervening turns use incomplete antecedents (partial trees)
- ...but some don't:
  - Repair
  - Clarifications

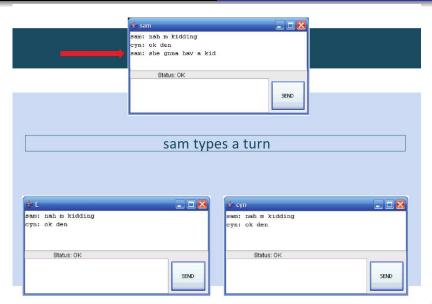
#### Experimental Study: the DiET chattool

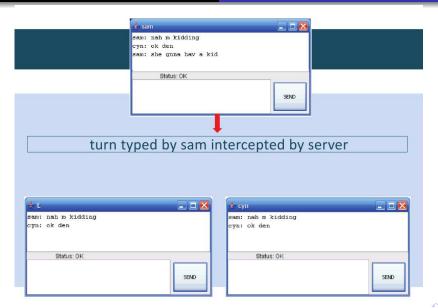
- Corpora tell us nothing about processing questions
- DiET: a toolbox for experimenting with dialogue [Healey et al., 2003]
- Basic setup: a multi-way chat tool, a bit like MSN Messenger
- Communication is mediated by a server, allowing controlled manipulations
  - transform real turns
  - introduce "fake" turns
- Use this to introduce split utterances, and observe the effects

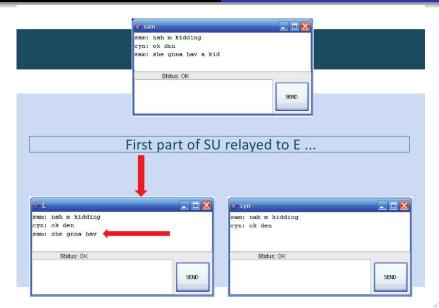
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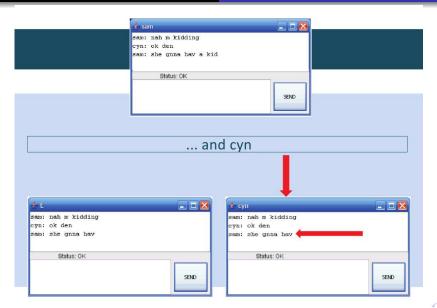
Split Utterances - Corpus Study Split Utterances - Experiments Priming - Corpus Study



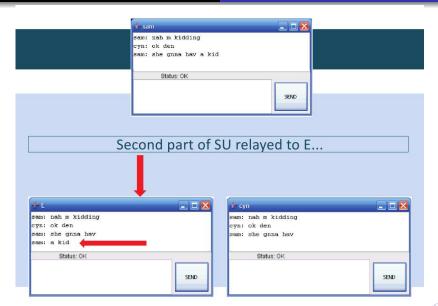


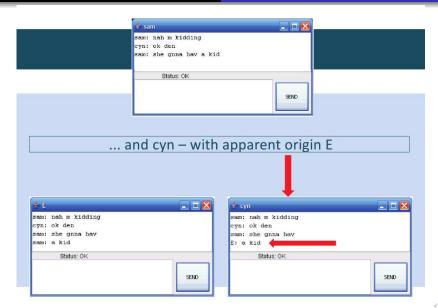






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## Experimental Study: An example

• 'Bancil' types:

the only loss here is a pilot and a father which is kinda bad but someones gotta go

'Aryan' sees (AA):

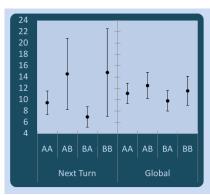
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'efparxng' sees (AB):

Bancil: the only loss here is a pilot and a father Aryan: which is kinda bad but someones gotta go

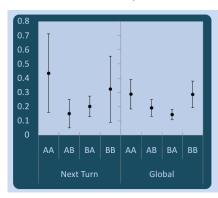
- We can observe: typing time of turn, number of 'deletes' used
  - next turn effects: the next participant to type
  - global effects: all participants turns until next intervention
- We can compare: speaker switch (AA/BB vs. AB/BA)
- We can compare: floor change (AA/BA vs. BB/AB)
- We can compare: first/second part coherence (Y/N)

Main effect of floor change on typing time of turn



If the second part of the SU is misattributed (AB & BB cases), people take **longer** constructing responses.

• Main effect of speaker switch on number of 'deletes'

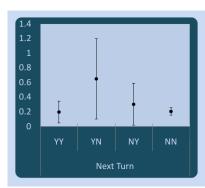


If the SU appears to be a cross-person one (AB & BA cases), people use **fewer** deletes in their responses.

Next turns:  

$$(F(3,249) = 6.26, p < 0.05)$$
  
Globally:  
 $(F(3,486) = 9.23, p < 0.05)$ 

• Interaction effect of 1st- x 2nd-part coherence on 'deletes'



If BOTH parts of the split could standalone (YY), or if NEITHER part could (NN), then participants use **fewer** deletes in their first response.

$$F(249) = 4.05, p < 0.05$$

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#### **Experimental Study: Conclusions**

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- Lack of speaker-switch effect on typing time suggests ease of processing
- Effect on deletes may be due to apparent party formation?
- Effect of floor change may be due to interference in turn-taking organisation
- Effect of 1st/2nd-part coherence suggests "garden-path"-style revision
- We're worried about the robustness of the setup . . .
  - ...a character-by-character version is almost complete

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## Priming: Designing a corpus experiment

- DS seems to predict lexical(-syntactic) effects more than general syntactic effects
- Previous dialogue experiments (e.g. [Reitter et al., 2006]) suggest that:
  - general syntactic effects are stronger in task-specific dialogue than in general conversation
  - general syntactic effects are stronger within-person than cross-person
- But no direct control condition:
  - what about dialogue structure effects?
  - how similar would recent turns be by chance?
  - Switchboard corpus is strange

Split Utterances - Corpus Stud Split Utterances - Experiments Priming - Corpus Study

### Corpus experiment: Method

- DCPSE corpus, all 2-person dialogues from 3 largest genre samples:
  - face-to-face formal (60 dialogues, 90,000 words)
  - face-to-face informal (91 dialogues, 403,000 words)
  - telephone conversations (89 dialogues, 77,000 words)
- For each dialogue *D*, create a "fake" control dialogue:
  - keep all turns from first speaker  $S1_D$
  - choose a different dialogue D', matching by length and within genre
  - interleave the turns from  $S1_D$  with those from  $S2_{D'}$
- Compare average turn similarity between real and control dialogues

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## Corpus experiment: Method

A: Hello

B: Hi

A: How are you?

B: Fine - you?

A: Yeah fine thanks

B: Uh-huh

A': Hi

B': Hello

A': What's up?

B': Not much A': Me neither

B': Uh-huh

Split Utterances - Corpus Study Split Utterances - Experiments Priming - Corpus Study

## Corpus experiment: Method

A: Hello

A: How are you?

A: Yeah fine thanks

B': Hello

B': Not much

B': Uh-huh

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Split Utterances - Corpus Study Split Utterances - Experiments Priming - Corpus Study

# Corpus experiment: Method

A: Hello

B': Hello

A: How are you?

B': Not much

A: Yeah fine thanks

B': Uh-huh

### Corpus experiment: Lexical results

- Lexical similarity expressed via word pair kernel:
  - ullet number of matching word pairs between turns A and  $B=N_{AB}$

• similarity 
$$S_{lex} = \frac{N_{AB}}{\sqrt{N_{AA} \cdot N_{BB}}}$$

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  - ullet number of matching word pairs between turns A and  $B= extbf{N}_{AB}$
  - similarity  $S_{lex} = \frac{N_{AB}}{\sqrt{N_{AA}.N_{BB}}}$
- ANOVA for real vs. control shows a reliable difference:

$$F_{(1,253)} = 106.55, \ p = 0.00$$

Real dialogues mean other-person similarity

$$S_{lex} = 0.094 (SD = 0.04)$$

Control dialogues mean other-person similarity

$$S_{lex} = 0.059 \ (SD = 0.03)$$

### Corpus experiment: Syntactic results

- Syntactic similarity via tree kernel (variant of [Moschitti, 2006]):
  - number of matching non-terminal syntactic rule pairs between turns A and  $B = N_{AB}$
  - similarity  $S_{syn} = \frac{N_{AB}}{\sqrt{N_{AA}.N_{BB}}}$

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  - number of matching non-terminal syntactic rule pairs between turns A and  $B = N_{AB}$
  - similarity  $S_{syn} = \frac{N_{AB}}{\sqrt{N_{AA} \cdot N_{BB}}}$
- ANOVA for real vs. control shows *no* reliable difference  $F_{(1.253)} = 1.32, p = 0.25$
- Real dialogues mean other-person similarity  $S_{syn} = 0.19 \ (SD = 0.06)$
- Control dialogues mean other-person similarity  $S_{syn} = 0.18 \ (SD = 0.06)$

Split Utterances - Corpus Stud Split Utterances - Experiments Priming - Corpus Study

### Corpus experiment: Syntactic results

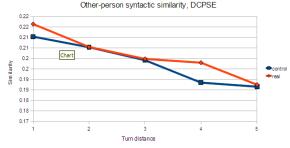
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- Real dialogues mean other-person similarity  $S_{syn} = 0.19 \ (SD = 0.06)$
- Control dialogues mean other-person similarity  $S_{svn} = 0.18 \ (SD = 0.06)$
- But: a reliable effect of genre  $(F_{(2,237)} = 20.13, p = 0.00)$ :

	formal	informal	telephone
real	0.21	0.19	0.17
control	0.21	0.18	0.16

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# Corpus experiment: Results over distance

- Following [Reitter et al., 2006], we can examine average similarity to recent turns
- Syntactic self-similarity shows a significant linear trend (p = 0.00)
- Syntactic other-similarity not reliable (p = 0.15)
- Plotting real and control dialogues is interesting though



• Are we just seeing the effect of dialogue structure?

Split Utterances - Corpus Stud Split Utterances - Experiments Priming - Corpus Study

#### Corpus experiment: Conclusions

- We can measure the effect of lexical priming
- We can't measure the effect of syntactic priming
  - We don't have enough statistical power here to say there's no effect
  - But it must be quite small (relative to the lexical effect)
- We can measure the effect of genre on syntactic similarity
  - This seems to agree with (some of) [Reitter et al., 2006]'s results
- We'd like more (parsed) data working on the BNC now . . .

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#### Outline

- 1 Dialogue and Incrementality
- 2 Dynamic Syntax
  - A Quick Introduction to DS
  - DS and Dialogue Modelling
- 3 Empirical Investigations
  - Split Utterances Corpus Study
  - Split Utterances Experiments
  - Priming Corpus Study
- Oynamic Syntax & Type Theory with Records
  - A Quick Introduction to TTR
  - Adding TTR to DS
  - Fragments & Split Utterances in DS/TTR

#### DS and TTR: Motivation

- So far, we're happy that we're going in roughly the right direction:
  - Split utterances seem to fit the DS approach
  - Priming results fit with prediction (so far as we can tell)

#### DS and TTR: Motivation

- So far, we're happy that we're going in roughly the right direction:
  - Split utterances seem to fit the DS approach
  - Priming results fit with prediction (so far as we can tell)
- For a proper treatment of NSUs and SUs, DS needs more structured representations
  - Responsibility for a (sub-)utterance (speaker, hearer?)
  - Utterance function (speech acts?)
- Want to avoid forcing this into all representations . . .
  - What should really be in the grammar?

## Type Theory With Records

- See [Betarte and Tasistro, 1998], following Martin-Löf
- Records are sequences of label/value pairs:

$$\begin{bmatrix} I_1 &= v_1 \\ I_2 &= v_2 \\ I_3 &= v_3 \end{bmatrix}$$

Record types are sequences of label/type pairs:

$$\left[\begin{array}{ccc} I_1 : T_1 \\ I_2 : T_2 \\ I_3 : T_3 \end{array}\right]$$

- Record types are true iff they are inhabited/witnessed
  - there exists at least one record of that type
  - successful type judgements for each label/value pair:

$$v_1: T_1, v_2: T_2, v_3: T_3$$

# Type Theory With Records

• Types can be *dependent* on earlier (higher-up) types:

$$\begin{bmatrix} l_1 : T_1 \\ l_2 : T_2(l_1) \\ l_3 : T_3(l_1, l_2) \end{bmatrix}$$

• We can have nested records and record types:

$$\begin{bmatrix} I_1 : T_1 \\ I_2 : \begin{bmatrix} I'_1 : T'_1 \\ I'_2 : T'_2 \end{bmatrix} \\ I_3 : T_3(I_1, I_2.I'_1, I_2.I'_2) \end{bmatrix}$$

## Type Theory With Records

• We can have functional record types:

$$\lambda r : \begin{bmatrix} l_1 : T_1 \\ l_2 : T_2 \end{bmatrix} (\begin{bmatrix} l_3 : T_3 \\ l_4 : T_4(r.l_1, r.l_2) \end{bmatrix})$$

$$\bullet \text{ Given a record } r = \left[ \begin{array}{cc} \mathit{I}_1 &= \ \mathit{v}_1 \\ \mathit{I}_2 &= \ \mathit{v}_2 \end{array} \right] \text{ of type } \left[ \begin{array}{cc} \mathit{I}_1 &: \ \mathit{T}_1 \\ \mathit{I}_2 &: \ \mathit{T}_2 \end{array} \right],$$

# Type Theory With Records

- Used for sentential semantics, e.g. [Cooper, 2005, Ginzburg, 2005]
- "A man left":

$$\begin{bmatrix} x : man \\ p : leave(x) \end{bmatrix}$$

- for truth: x must be a man, p a proof that x left
- Similarities to DRT representation:

$$\begin{array}{|c|c|}\hline x\\ man(x)\\ leave(x)\\ \end{array}$$

"Every man left":

$$\lambda r : [x : man]([p : leave(r.x)])$$

# Type Theory With Records

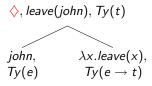
- Used for dialogue modelling in the information-state-based tradition
  - [Cooper and Ginzburg, 2002, Ranta and Cooper, 2004, Fernández, 2006, Ginzburg, prep]

#### The best of both worlds?

- TTR gives us a type-theoretic framework, applicable to dialogue phenomena
- DS gives us an incremental framework using type theory as an underlying mechanism
- Can we combine the two?

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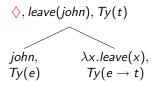
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#### The best of both worlds?

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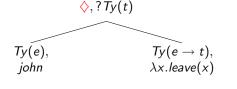


$$\Diamond, \left[\begin{array}{c} x : john \\ e : leave(x) \end{array}\right]$$

$$\left[\begin{array}{c} x : john \end{array}\right] \lambda \left[x\right] . \left[\begin{array}{c} p : leave(x) \end{array}\right]$$

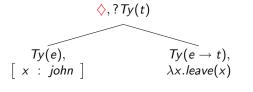
• Replace Fo() epsilon-calculus labels with TTR record types

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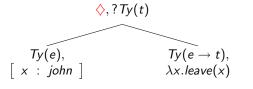
 $\begin{array}{ll} \mathsf{IF} & ?\mathit{Ty}(e) \\ \mathsf{THEN} & \mathsf{put}(\mathit{Ty}(e)) \\ & \mathsf{put}(\mathit{Fo}(\mathit{john})) \\ \mathsf{ELSE} & \mathsf{abort} \end{array}$ 

• Replace Fo() epsilon-calculus labels with TTR record types



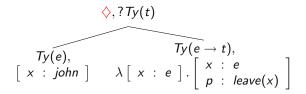
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- Replace Fo() epsilon-calculus labels with TTR record types
- Interpret Ty() simple type labels as referring to final TTR field type



IF ?Ty(e)THEN put(Ty(e))put([ x : john]ELSE abort

- Replace Fo() epsilon-calculus labels with TTR record types
- Interpret Ty() simple type labels as referring to final TTR field type



- Replace Fo() epsilon-calculus labels with TTR record types
- Interpret Ty() simple type labels as referring to final TTR field type
- Function application as before for DS elimination process

# Adding in LINK relations

For LINKed trees, we need conjunction

"Bill, who fainted, smokes."  $smoke(bill) \land faint(bill)$   $bill \quad \lambda x.smoke(x)$ L faint(bill)  $bill \quad \lambda x.faint(x)$ 

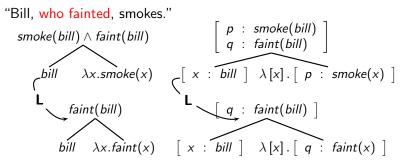
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- For LINKed trees, we need conjunction
- Use extension:  $\oplus$   $r_1 \oplus r_2$  adds  $r_2$  to the end of  $r_1$ 
  - only for distinct labels

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## Adding in LINK relations

- For LINKed trees, we need conjunction
- Use extension:  $\oplus$   $r_1 \oplus r_2$  adds  $r_2$  to the end of  $r_1$ 
  - only for distinct labels



#### Can we do better?

- From an implementational point of view, this is OK
- But we're in danger of losing something
  - DS trees as they stand have a direct correspondence with semantics
  - Nodes are terms in the lambda-calculus
  - (Unreduced terms at daughter nodes)
  - What exactly are they now?
- Would prefer tree definitions via TTR(-compatible) logic
  - Type dependencies rather than abstraction (via [Kopylov, 2003] dependent intersection)
  - Initial versions for basic framework; LINK more complicated
  - (Meyer-Viol/White, forthcoming)

- Add utterance-event information
- Add speaker (or rather "responsible party") information

"John left"

$$\langle \rangle, Ty(t), \begin{bmatrix} x & : \ john \\ p & : \ leave(x) \end{bmatrix}$$
 $Ty(e), \qquad Ty(e \to t), [x : \ john \ ] \qquad \lambda[x]. [p : \ leave(x)]$ 

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- Add utterance-event information
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"John left"

$$\diamondsuit, \mathit{Ty}(t), \left[ \begin{array}{ccc} u_0 & : & \mathit{utt} - \mathit{event} \\ a & : & \mathit{spkr}(u_0) \\ x & : & \mathit{john} \\ p & : & \mathit{leave}(x) \end{array} \right]$$

$$Ty(e), \qquad Ty(e \to t),$$

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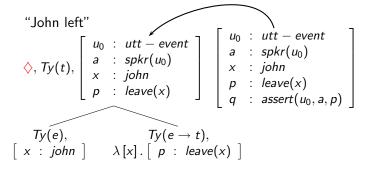
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$$Ty(e), \qquad Ty(e \to t),$$

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Allow optional inferences about speech acts

- Add utterance-event information
- Add speaker (or rather "responsible party") information



Allow optional inferences about speech acts

Speech act inferences conditional on syntax/semantics

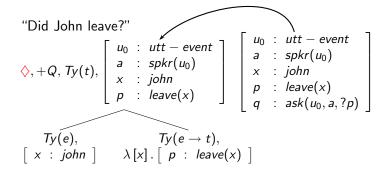
"Did John leave?"

$$\diamondsuit, +Q, \mathit{Ty}(t), \begin{bmatrix} u_0 : \mathit{utt} - \mathit{event} \\ a : \mathit{spkr}(u_0) \\ x : \mathit{john} \\ p : \mathit{leave}(x) \end{bmatrix}$$

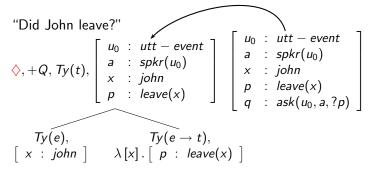
$$Ty(e), \qquad Ty(e \to t),$$

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Speech act inferences conditional on syntax/semantics



Speech act inferences conditional on syntax/semantics



Similarities with [Ginzburg et al., 2003]

#### A: "Did John leave?"

$$+Q, \begin{bmatrix} u_0 : utt - event \\ a : spkr(u_0) \\ x : john \\ p : leave(x) \end{bmatrix}$$

$$[x : \widehat{john}] \quad \lambda[x].[p : leave(x)]$$

```
A: "Did John leave?"
+Q, \begin{bmatrix} u_0 : utt - event \\ a : spkr(u_0) \\ x : john \\ p : leave(x) \end{bmatrix} \begin{bmatrix} u_0 : utt - event \\ a : spkr(u_0) \\ x : john \\ p : leave(x) \\ q_0 : ask(u_0, a, ?p) \end{bmatrix}
\begin{bmatrix} x : john \end{bmatrix} \quad \lambda[x]. [p : leave(x)]
```

```
A: "Did John leave?"
                            d John leave?"
+Q, \begin{bmatrix} u_0 : utt - event \\ a : spkr(u_0) \\ x : john \\ p : leave(x) \end{bmatrix} \begin{bmatrix} u_0 : utt - event \\ a : spkr(u_0) \\ x : john \\ p : leave(x) \\ q_0 : ask(u_0, a, ?p) \end{bmatrix}
 \begin{bmatrix} x : john \end{bmatrix} \quad \lambda[x]. \begin{bmatrix} p : leave(x) \end{bmatrix} 
 B: "John?" 
 \begin{bmatrix} u_1 : utt - event \\ b : spkr(u_1) \\ x : john \end{bmatrix}
```

```
John leave?"
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\begin{bmatrix} u_1 : utt - event \\ b : spkr(u_1) \\ x : john \end{bmatrix}
                                                                                                     \begin{bmatrix} u_0 & : & utt - event \\ \dots & : & \dots \\ u_1 & : & utt - event \\ b & : & spkr(u_1) \\ q_1 & : & ask(u_1, b, ?ask(u_0, a, ?p)) \end{bmatrix}
```

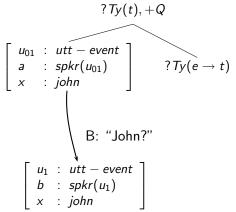
# An example: a "constituent" clarification request

Add [Poesio and Traum, 1997]'s micro-conversational events
 A: "Did John . . . "
 ?Ty(t), +Q

$$\left[\begin{array}{ccc} u_{01} & : & utt-event \\ a & : & spkr(u_{01}) \\ x & : & john \end{array}\right] ? Ty(e \rightarrow t)$$

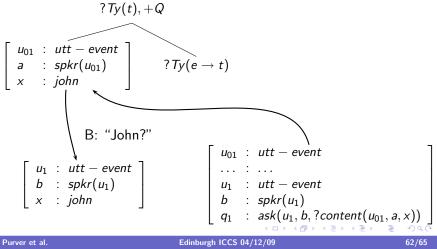
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# An example: a "constituent" clarification request

 Add [Poesio and Traum, 1997]'s micro-conversational events A: "Did John ..."



A: "John ..."
$$+Q, \begin{bmatrix} u_0 : utt - event \\ a : spkr(u_0) \\ x : john \\ \mathbf{P} : META(x) \end{bmatrix}$$

$$[x : \widehat{john}] \qquad ?Ty(e \rightarrow t)$$

A: "John ..."
$$+Q, \begin{bmatrix} u_0 : utt - event \\ a : spkr(u_0) \\ x : john \\ \mathbf{P} : META(x) \end{bmatrix} \begin{bmatrix} u_0 : utt - event \\ a : spkr(u_0) \\ x : john \\ \mathbf{P} : META(x) \end{bmatrix}$$

$$\begin{bmatrix} x : john \end{bmatrix} ?Ty(e \rightarrow t)$$

A: "John ..." B: "left?"
$$+Q, \begin{bmatrix} u_0 : utt - event \\ a : spkr(u_0) \\ x : john \\ \mathbf{P} : META(x) \end{bmatrix} \begin{bmatrix} u_0 : utt - event \\ a : spkr(u_0) \\ x : john \\ \mathbf{P} : META(x) \end{bmatrix}$$

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A: "John ..." B: "left?"
+Q, \begin{bmatrix} u_0 : utt - event \\ a : spkr(u_0) \\ x : john \\ p : leave(x) \end{bmatrix} \begin{bmatrix} u_0 : utt - event \\ a : spkr(u_0) \\ x : john \\ p : leave(x) \\ q_0 : ask(u_0, a, ?p) \end{bmatrix}
\begin{bmatrix} x : john \end{bmatrix} \quad \lambda[x]. \begin{bmatrix} p : leave(x) \end{bmatrix}
```

```
A: "John ..." B: "left?"
           [x : \widehat{john}] \quad \lambda[x].[p : leave(x)]
                                                    \begin{bmatrix} u_0 & : & utt - event \\ ... & : & ... \\ u_1 & : & utt - event \\ b & : & spkr(u_1) \\ q_1 & : & ask(u_1, b, ?ask(u_0, a, p)) \end{bmatrix}
```

# (Eventual) Conclusions

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- Incrementality of DS with the flexibility of TTR
- Core grammar essentially as before
- Optional enrichment processes for speech act information
  - similarities to [Ginzburg and Cooper, 2004] et al.
  - similarities to [Asher and Lascarides, 2003] et al.
- A proper treatment of split utterances . . . ?
  - capturing insights of [Rieser and Poesio, prep]
  - more fundamentally incremental

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Andrew Gargett in Saarbrücken, Yo Sato in Herts

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