Connective-based Local Coherence Analysis

A Lexicon for Recognizing Causal Relationships

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Overview

- Text parsing + Local coherence analysis
- Complex connectives in German
- A lexicon of (causal) connectives
- Toward automatic local coherence analysis

Text parsing: A simple case

Because well-formed XML does not permit raw less-than signs and ampersands, if you use a character reference such as < or the entity reference &It; to insert the < character, the formatter will output &It; or perhaps <.

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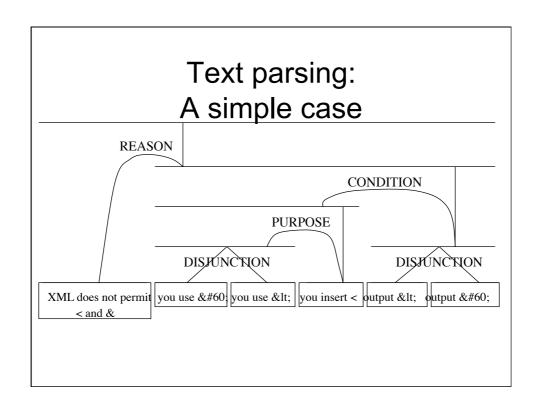
Because A, if B or C to D, E or F.

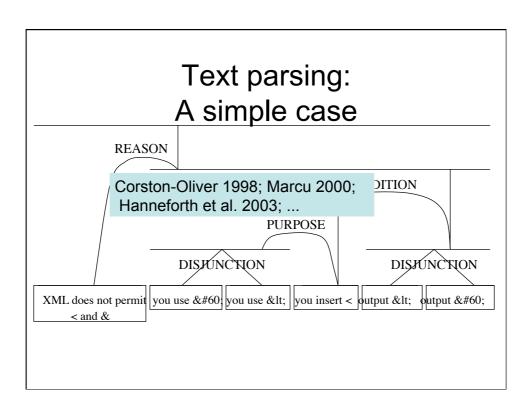
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Because A, if B or C to D, E or F.

(Because A, (if (B or C) to D)), (E or F))).





Connectives: Complications

- · Segment embedding
 - We will, because time is short, discuss only one project.
- Long-distance antecedents
 - Meine Firma ist verschuldet. Ich fliege nach Rom, weil ich deswegen Urlaub habe.

My company is in debt. I'm flying to Rome, because due to that I'm on holiday.

- Within/-out scope of focus particle or negation
 - Ich fahre mit dem Auto, weil ich auf Reisen gern rauche.
 I go by car, because I like to smoke on my trips.
 - Ich fahre nur mit dem Auto, weil ich auf Reisen gern rauche.
 I only go by car, because I like to smoke on my trips.

Connectives: Complications

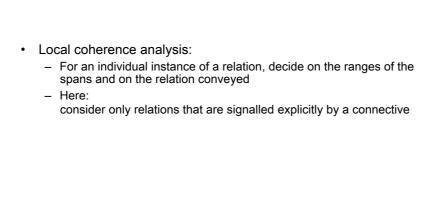
- · Ambiguity 1: connective or no connective?
 - Wir sollten zu Abend essen, denn es wird spät.
 We should have dinner, for it's getting late.
 - Was ist denn das für ein Abendessen? What sort of dinner is that?
 - Da es spät wird, sollten wir jetzt Abendessen.
 Since it's getting late, we should have dinner now.
 - Ich kenne ein gutes Restaurant. Da sollten wir abendessen.
 I know a good restaurant. There we should have dinner.
- · Ambiguity 2: which coherence relation?
 - If Tom brings the food, then I'll bring the wine.
 - At eight, Tom will bring the food. Then I'll bring the wine.

Connectives: Complications

- Absence: Only 30% of relations signalled by a connective (Schauer/Hahn 1998)
- Syntax as replacement: tense, aspect, mood, modality; constructions
 Had I not forgotten the car keys, we would be in London by now.
- · The slippery slope to assorted open-class lexical items
 - The car didn't start. Thus we took the train.
 - Consequently, we took the train.
 - As a consequence, we took the train.
 - As a dreadful consequence, we took the train.
 - The consequence was that we took the train.
 - This prompted us to take the train.
- Multiple connectives
 - John noticed that she lied, but then he married her anyway.

Connectives: Complications

- · Complex connectives
 - Either we take the car, or I won't join you on the trip.
 - Ich fahre nur mit dem Auto, weil ich auf Reisen nämlich gern rauche.
 I only go by car, because I like to smoke on my trips.
 (note: with nämlich, the nur is likely to have narrow scope)
 - Ich würde ihn nicht heiraten, wenn er auch reich ist.
 I wouldn't marry him, even though he's rich.
 - Er ist dadurch zu seinem Geld gekommen, dass er täglich die Börsenkurse studiert.
 He made his money for that reason that he monitors the stock exchange on a daily
 hasis
 - Sie hat ihn deshalb geheiratet, weil er soviel Geld hat.
 She therefore₁ married him, because₁ he has so much money.



- · Local coherence analysis:
 - For an individual instance of a relation, decide on the ranges of the spans and on the relation conveyed
 - Here: consider only relations that are signalled explicitly by a connective
- Text parsing:
 - construct a relation-based tree for the complete text
 - for longish text: structural decisions very difficult for human annotators
 - for longish text: cognitively plausible?
 - construct application-dependent structures?

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Connectives

- · Definition (cf. Pasch et al. 2003)
 - closed-class words
 - non-inflectable
 - semantics: two-place relation
 - join two eventualities that could be expressed as full clauses
- Syntactic categories:
 - conjunctions, coordinating and subordinating
 - certain adverbials
 - certain prepositions: despite, due to, ...
- NO: phrasemes like for this reason
- NO: affixes like -wise / -halber, -wegen
 - Moneywise, the new job made no sense for Tom.
 - Ihretwegen kann ich nicht zur Party kommen. Because of her I cannot come to the party.

Complex connectives

- 1 word since, although, especially, ...
- >1 continuous words due to, in particular, for example, ...
- >1 discontinuous words if .. then, but .. anyway, ...

Group W: Components within a clause

- W1: circumpositions
 - Kannst Du mir um unserer Freundschaft willen einen Gefallen tun?
 Can you do me a favour for our friendship's sake?
 - Auf ihren Rat hin habe ich mir einen Mac gekauft.
 On her advice I bought a Mac.

Group W: Components within a clause

- W2: conjunction + adverbial form a signal noncompositionally
 - Ich nehme diesen Mac, wenn er auch ziemlich teuer ist.
 - ,I take this Mac if it is also quite expensive.
 - ,I take this Mac, even though it's quite expensive.

Group W: Components within a clause

- W3: {adverbial | conjunction} + adverbial signal a single relation (+ additional facet)
 - Das Wetter war schlecht, aber ich bin trotzdem in den See gesprungen.
 - ,The weather was bad, but I jumped into the lake anyway.
 - Ich fliege nach Berlin, weil dort nämlich ein Bruder von mir wohnt.
 "I'm flying to Berlin because a brother of mine is living there."
 - Ich bin dann anschließend noch nach Berlin geflogen.
 I then subsequently flew to Berlin.

Group W: Components within a clause

- W3: {adverbial | conjunction} + adverbial signal a single relation (+ additional facet)
 - (a) Meine Firma ist verschuldet. (b) Ich fliege nach Rom, weil (c) ich nämlich Urlaub habe.
 - (a) My company is in debt. (b) I'm flying to Rome, (c) because I'm on holiday.
 - (a) Meine Firma ist verschuldet. (b) Ich fliege nach Rom, (c) weil ich deswegen Urlaub habe.
 - ,(a) My company is in debt. (b) I'm flying to Rome, (c) because due to that I'm on holiday.

Group A: Components across clauses

- A1: ,split' connectives
 - entweder .. oder (,either .. or')
 wenn .. dann (,if .. then')
 einerseits .. andererseits (,on the one hand ..')
- Complications:
 - One part can be optional, and the other a ,simple' connective in its own right
 - Some of these connectives offer variants:wenn .. dann = wenn .. so
- ¬ .. sondern (,¬ .. but') / ¬ .. noch (,¬ .. nor')
 - Er hat den Aufsatz nicht selbst erdacht, sondern geklaut.
 He did not invent the essay himself but stole it.

Group A: Components across clauses

- A2: adverbial + minor clause
- Dadurch, dass mein Auto kaputt ist, kann ich heute nicht zum Treffen kommen.
 - ,Due to my car being broken I can't come to the meeting today.
- Er ist insofern kein Experte, als er das Fach nie studiert hat. ,He is no expert insofar as he never studied the subject.
- Sie hatte so lange gewartet, dass ihr die Füße weh taten. ,She had waited so long that her feet hurt.

Group A: Components across clauses

- · A2: adverbial + minor clause
- Wir haben uns auf einer Party getroffen. Ich habe ihn dadurch kennengelernt.
 We ran into each other at a party. I got to know him through
 - ,vve ran into each other at a party. I got to know him through
- Wir haben uns auf einer Party getroffen. Ich habe ihn dadurch kennengelernt, dass wir auf der Tanzfläche übereinander gestolpert sind.
 - ,We ran into each other at a party. I got to know him through the fact that we stumbled over each other on the dancefloor.

Group A: Components across clauses

- A3: "redundant" cataphoric adv + conjunction
- Ich bin deswegen nach Hause gefahren, weil es geregnet hat.

 "I went home for the reason that it rained"
- (a) Es wurde sehr kalt. (b) Ich bin deswegen schnell nach Hause gefahren, (c) weil ich ja auch keinen Pullover hatte.
 ,(a) It got very cold. (b) I thus drove home quickly, also because I didn't have a sweater.

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- Version 1: 135 German connectives (Stede 03)
- Basic technical approach:
 - "Theory-neutral" rich source lexicon in XML mapped via XSLT to specific application resources
 - Language generation in "Polibox" (LISP) (Stede 02)
 - Rhetorical parsing prototype (Prolog) (Hanneforth et al. 03)
 - Various HTML views for the human user

DiMLex Discourse Marker Lexicon

- · Version 2: currently built in joint project with IDS Mannheim
- Focus on 45 causal connectives (in the widest sense) (Klein 1981)
 - Event causation: The vase broke because it fell to the floor
 - Explanation: For many people, German is difficult as a second language because of the case system
 - Argument: We should nominate Obama by acclamation, because it will send a strong signal of unity
- Causal coherence relations used in our system
 - Volitional-Cause
 - Nonvolitional-Cause
 - Purpose
 - Pragmatic-Claim

- Orthography and syntax
- Disambiguation info: non-/connective
- Semantics/Pragmatics
 - Coherence relation(s)
 - Disambiguation info
 - Role linking
 - Idiosyncratic features

DiMLex Discourse Marker Lexicon

Orthography and syntax

• Disambiguation info: non-/connective

Semantics/Pragmatics

Coherence relation(s)

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aufgrund

<otype="simple" ctype="cont" onr="k2-1">
 aufgrund

<otype="complex" ctype="cont" onr="k2-2">
 auf Grund

<otype="simple" ctype="cont" onr="k2-3"> Aufgrund

<otype="complex" ctype="cont" onr="k2-4">
Auf Grund

- Orthography and syntax
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syntactic category:

coord-conj, subord-conj

preposition

prepadv, pronadv

•••

order of spans (w/ corpus frequency):

int-ext ext-int ext-int-ext

average length of spans (from corpus)

with focus particle: yes/no

can be correlate: yes/no

can have correlate: yes/no

DiMLex Discourse Marker Lexicon

Orthography and syntax

Disambiguation info:

non-/connective

Semantics/Pragmatics

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dadurch

prepadv vorfeld:1

mittelfeld:1

nacherst:0

nachfeld:1

nullstelle:0

nachnachfeld:0

satzklammer:0

Dadurch ist es geschehen. Es ist dadurch geschehen. Es ist geschehen dadurch.

so dass

- Orthography and syntax
- · Disambiguation info: non-/connective
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```
(#avp:[cat="AVP"] > [lemma="so"])
((#avp > #s:[cat="S"])
((#avp > #cs:[cat="CS"]) &
 (#cs > #s:[cat="S"]))
(#s > [lemma=("dass")])
```

DiMLex Discourse Marker Lexicon

- Orthography and syntax
 Dipper/Stede 06:
- Disambiguation info: non-/connective
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- - 42/130 words in DiMLex have a non-connective reading
 - · discourse particle
 - · locative/temporal adverbial
 - Disambiguation based on PoS context:
 - F-measure 80% / 94%

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- Disambiguation info: non-/connective
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daher

<con value="99" ref="k5v1 k5v2">
\$\$/PROAV \$, {'dass'}/KOUS

<con value="95" ref="k5v2">
\$. \$\$/PROAV .* {'kommen' 'ruehren'} .+ \$,
{'dass'}/KOUS

<con value="99" ref="k5v1">
\$\$/PROAV \$.

DiMLex Discourse Marker Lexicon

- Orthography and syntax
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schließlich

Pragmatic-Claim ext=effect; int=cause

- PRO
 - Tense=present & Aktionsart=state - 99
 - Parallel sentence structure - 80
 - Preceding segment: illocution=claim - 90
- CON
 - Verb elided 99
 - Position=Vorfeld, following PP or NP - 99
 - Collocation "und schließlich" 80

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schließlich

Temporal-Sequence ext=preceding; int=subsequent

- PRO
 - Position=in temporal minor clause - 99
 - LinOrder= minor clause, tense=pluperfect - main clause - 80
- CON
 - Mood=subjunctive 70
 - Tense=present 70
 - Modality="subjective" 70
 - Position=Mittelfeld 60

Complex connectives in DiMLex

- Basic idea: One component is *primary*, the other *secondary*
- Primary component is used to "anchor" the complex connective in the text
- In lexicon entry for primary component, specify a search procedure for the secondary component
- · Criteria for primaries
 - the component that is obligatory
 - the component that is structurally more prominent
 - the component that occurs less often in corpora

Complex connectives in DiMLex

- W1: circumpositions
 - primary: postposition (rare)
 - um der Gesundheit willen
 - Left:NP & Left:"um"
- W2/W3: conjunction + adverbial
 - primary: conjunction (structural prominence)
 - ..., weil ich nämlich Urlaub habe
 - Right2EndOfClause:non-anaporic-adv/CAUSE

Complex connectives in DiMLex

- A1: split connectives
 - primary: obligatory component
 - Wenn das Wetter gut ist, dann nehmen wir das Boot.
 If the weather is nice, then we take the boat.
 - Right:Clause* & Right:"dann"
- A2: adverbial dass/als clause
 - primary: adverbial (rare)
 - Er ist insofern kein Experte, als er das Fach nie studiert hat.
 He is no expert insofar as he never studied the subject.
 - Right:Clause & Right:"als"

Complex connectives in DiMLex

- A3: "redundant" cataphoric adv + conjunction
 - primary: conjunction (obligatory, structural prominence)
 - Ich bin deswegen nach Hause gefahren, weil es geregnet hat.

I went home for the reason that it rained.

- Left:Clause & Within:adv-anaphoric-CAUSE

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A corpus of (signalled) causes and reasons

- 200 hotel reviews from a website (doyoo.de)
- All potential causal connectives labelled automatically (using DiMLex), then filtered manually
- 1200 instances of causal connectives
- Annotation instructions: how to decide on the spans related by the connective

A corpus of (signalled) causes and reasons

 The beach was very nice. Because it was cleaned every morning, there was hardly any garbage. We went there basically every day.

A corpus of (signalled) causes and reasons

 The beach was very nice. Because it was cleaned every morning, there was hardly any garbage. We went there basically every day.

A corpus of (signalled) causes and reasons

The beach was very nice. Because [it was cleaned every morning,]_C [there was hardly any garbage.]_E We went there basically every day.

Complications

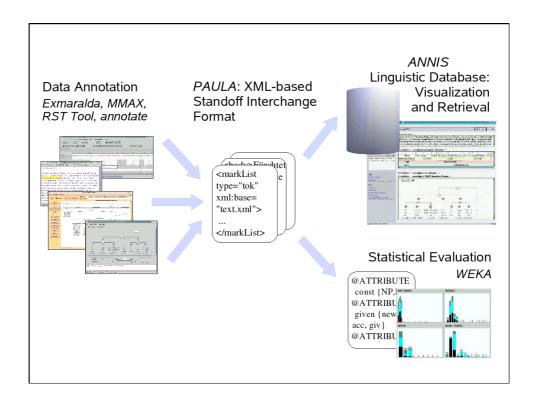
- <...> And also, the staff was quite friendly.]_C
 Thus [we altogether enjoyed our holidays.]_E
 Next time, we'll <...>
- [The beach was not very pleasant,]_E as [it was,]_{Ca} I just have to say this here, [utterly littered with remains of picnics.]_{Cb}
- [We reached the hotel late]_E due to [the flight's delay]_{C1} and also because_{Conn2} [it took so long to find a cab.]_{C2}

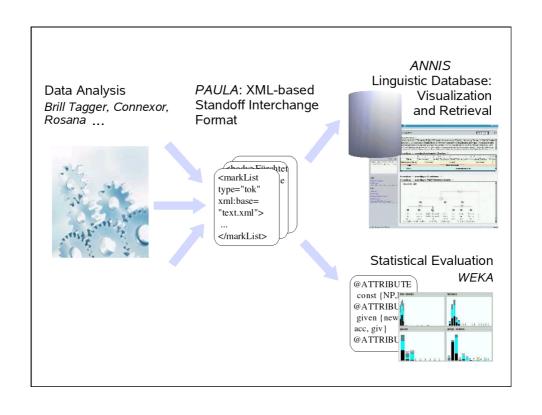
A corpus of (signalled) causes and reasons

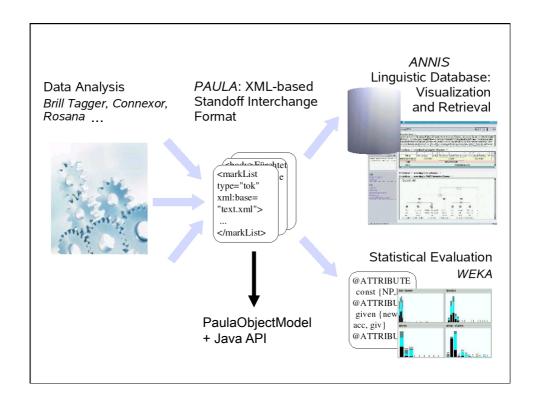
- Besides, annotators decided on the illocutions underlying the spans:
 - report: The beach was not far away
 - report-self: We went to the beach every day
 - ident: I felt sorry for the staff
 - ident-judge: We all were not keen on the pool
 - ident-assume: The staff probably was bored
 - commit: I'll come back next year
 - direct: Avoid the city center around lunchtime
 - hypothetic-situation: In order to be on time, go...

Exploiting the corpus

- Frequency counts for DiMLex:
 - order of spans
 - length of external spans
 - etc.
- Overall distribution of causal connectives (genre-specific?)
- Correlations between connective choice and illocutions?
- ...

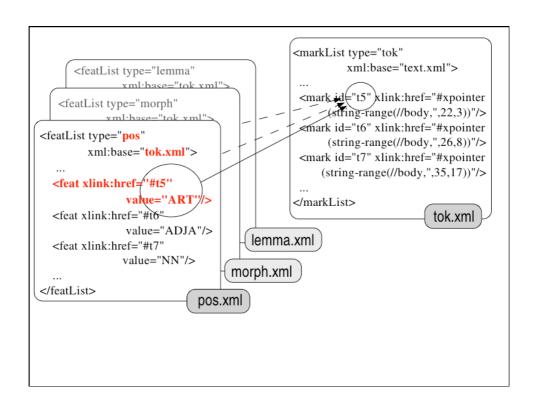






PAULA

- Potsdamer AUstauschformat für Linguistische Annotation
 Potsdam exchange format for linguistic annotation
- Generic standoff XML annotation format
- Compatible with LAF (Ide et al. 07)
- Distribute separate annotation layers to separate files
- Employ a general *merge* script to unify separate layers into a "standard" inline-XML file
- Various conversion scripts to/from PAULA available on our web site



```
<markList type="tok"
<structList type="syntax">
                                                        xml:base="text.xml">
<struct id="s2">
                                               <mark #d="t5" xlink:href="#xpointer
<rel id="r4"
                                                    (string-range(//body,",22,3))"/>
 xlink:href="#xpointer(tok.xm(#t5)
                                               <mark id="t6" xlink:href="#xpointer</pre>
<rel id="r5"
                                                    (string-range(//body,",26,8))"/>
 xlink:href="#xpointer(tok.xml#t6)"/>
                                               <mark id="t7" xlink:href="#xpointer</pre>
 <rel id="r6"
                                                   (string-range(//body,",35,17))"/>
 xlink:href="#xpointer(tok.xml#t7)"/>
</struct>
                                              </markList>
</structList>
                            syntax.xml
                                                                          tok.xml
```

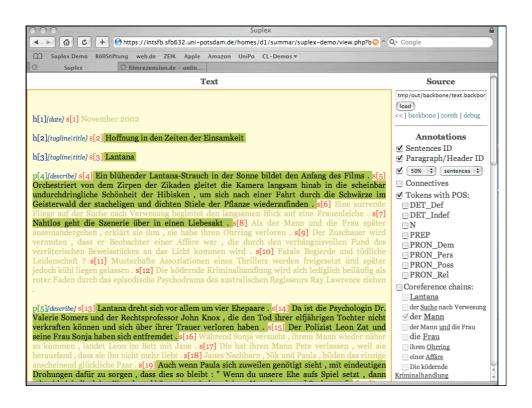
The LCA procedure

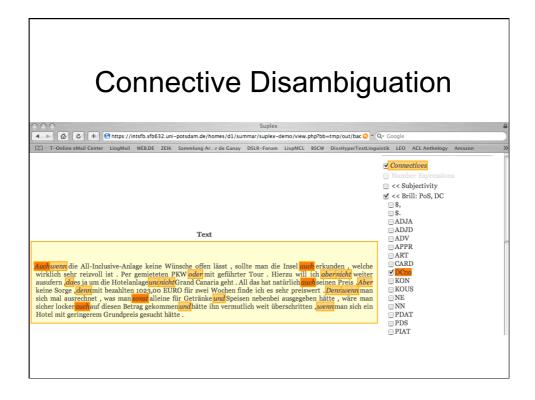
- 1. Identify connectives
- 2. Identify arguments of connectives (aka minimal discourse units)
- 3. Assign relations to connectives

The LCA procedure (1)

- · Identify connectives
 - Token matching between lexicon and text: attach labels to tokens in text
 - a) potential single connective
 - b) potential primary component of complex connectives
 - For (b), run the search procedure for secondary component
 - · If found, run disambiguation rules from lexicon entry
 - If positive, remove the "single connective" labels
 - Run disambiguation rules on single connectives







The LCA procedure (2)

- Identify minimal discourse units (for the time being, only where connectives have been found)
 - Based on dependency parsing layer, attribution layer, and connective layer
 - Prepositions/Circumpositions: mark associated NP as internal arg and embedding clause as external arg
 - Subordinating conjunctions: mark embedded clause as internal arg and matrix clause as external arg
 - Coordinating conjunctions: (similar)
 - Adverbials: mark host clause as internal arg; for external arg, pefer span length learned from corpus, but respecting logical document structure (do not cross paragraph breaks unless necessary)

The LCA procedure (3)

- Identify relations
 - For each relation stored with the connective in DiMLex, run disambiguation rules and accumulate weights
 - assign winning roles to internal and external arguments
- Marianne entschied sich für das New Beetle Cabrio.
 Sie wollte schließlich ein richtiges Sommerauto.
- Mary chose the New Beetle convertible. Finally/After all, she wanted a real summer car.
- Pragmatic-Claim: Effect / Cause
- Temporal sequence: Pre / Succ

Summary

- Local coherence analysis: a potentially difficult sub-problem of text parsing
- Classification of complex connectives (for German)
- Representing knowledge of connectives in a computational lexicon that holds both linguistic and corpus-statistical information
- Corpus annotated with causal relations
- (Sketch of) Procedure for automatic local coherence analysis

Credits

Heike Bieler (text analysis workbench), André Herzog (causality corpus), Kristin Irsig (DiMLex2), Uwe Küssner (connective analysis module), Andreas Peldszus (causality corpus, annotation guidelines)