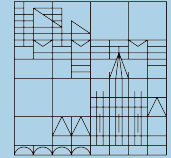


VisArgue

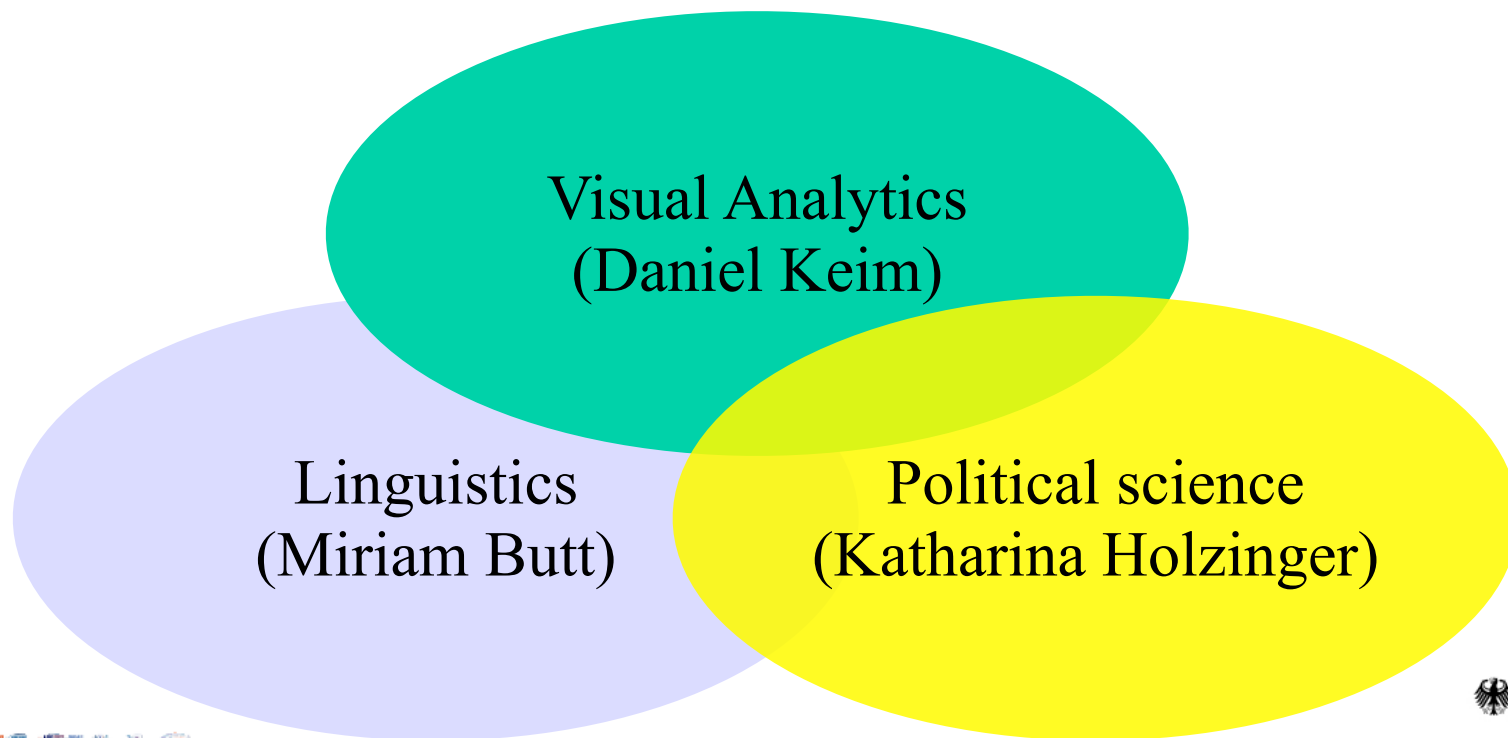
Visual Analysis of deliberative argumentation

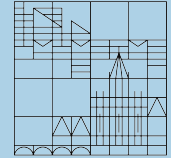




Project Background

Interdisciplinary Approach towards modelling deliberation in political communication (eHumanities)

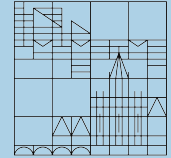




Motivation

- The realization of large-scale public projects is prone to creating conflicts between governments and the public sphere, particularly local residents.
- Recent example in Germany – *Stuttgart 21*
 - Proposal to revamp the Stuttgart train station
 - Public opposition made international headlines and ushered in a new Green state government.

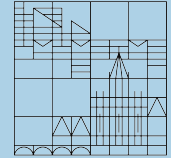




Motivation

- Stuttgart 21 is an example showing that the capacity of representative democracy is limited with respect to handling public policy conflicts
- Germany: participatory procedures have been adopted since the early 1990s:
 - formal procedures for citizens' participation
 - implementation of **deliberative** procedures to achieve consensus within a public discourse

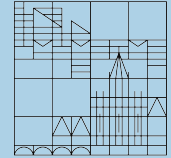




Theory of Deliberative Democracy

- A form of non-majoritarian democracy: collective decisions should be taken based on reason, rational argumentation and consensus via public discourse.
- Main protagonists:
Jürgen Habermas, John Dryzek, Robert Goodin.

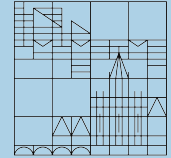




Theory of Deliberative Democracy

- Theoretical claims as to effects of deliberation:
 - can overcome interest positions,
 - enhances policy satisfaction and acceptance,
 - decisions taken represent the common good,
 - increases political knowledge of citizens, ...
- Empirical tests of these claims usually refer to the institutional setting of a process but rarely include the actual communication.

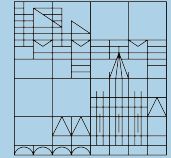




Deliberative Dialog/Discourse

- The most prominent exception is the Discourse Quality Index (DQI) proposed by Steenbergen et al. (2003) to measure the degree of deliberativity of a discourse.
- Problems:
 - Requires manual coding
 - Inter Annotator agreement not very high
 - No clear guidelines on what linguistic cues exactly indicate deliberativity

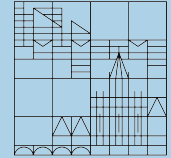




Deliberative Dialog/Discourse

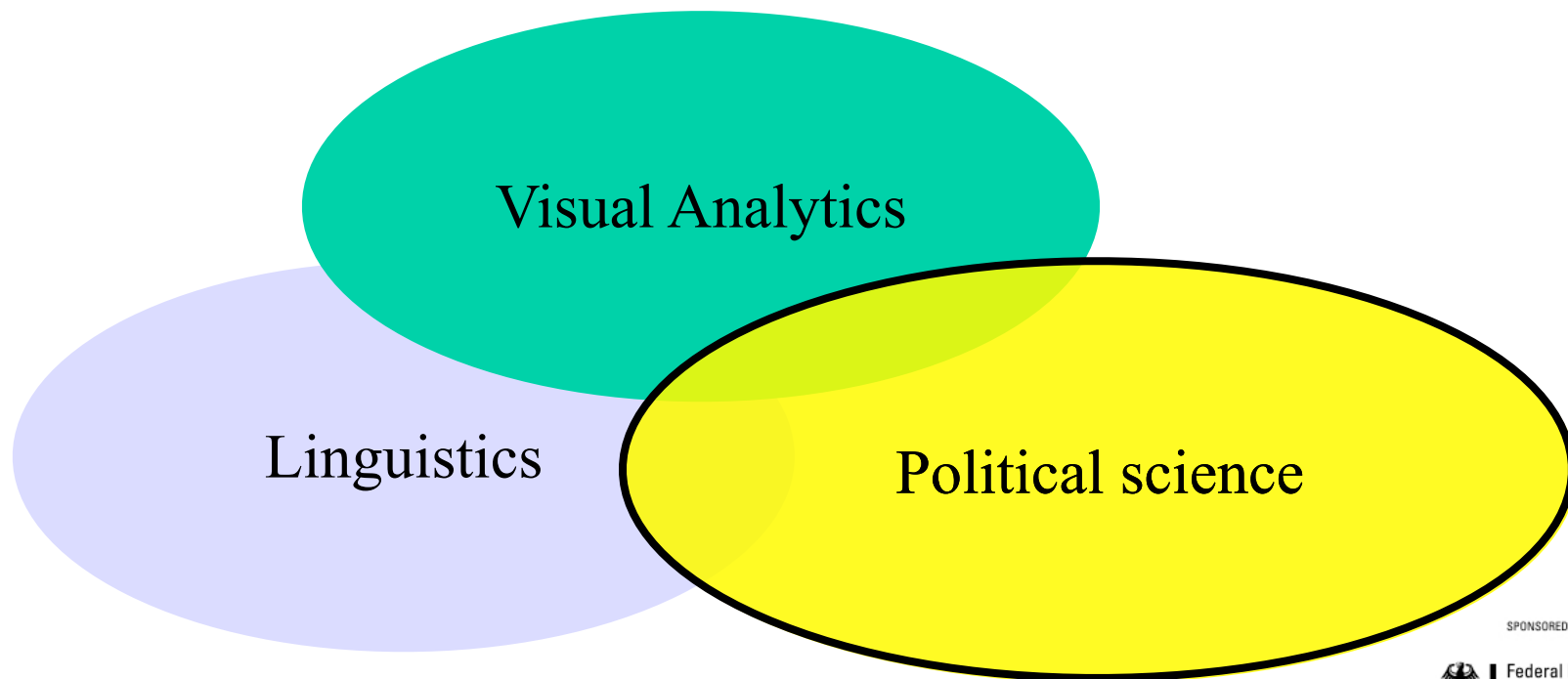
- To resolve the Stuttgart 21 conflict an arbitration process was conducted which ended in dissent.
- Questions:
 - Is the Stuttgart 21 arbitration an example of a deliberative discourse?
 - How can one tell?

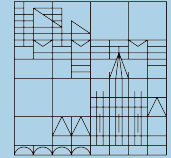




Our Approach:

- innovative interdisciplinary combination of methods

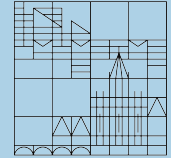




Political Science – Methodology

- Quantitative and experimental approach
- Design experiments (simulation-gaming) to test claims of the theory of deliberative democracy
- Employ automated methods to analyze the dialogs
- Include
 - shallow text mining techniques (computer science and computational linguistics)
 - deep linguistic knowledge (linguistics)
 - interactive visual analysis (computer science)

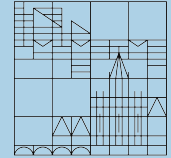




Political Science – Goals

- Development of an index for the quality of deliberative communication based on automated annotation
- Ability to automatically analyze participatory communicative processes like Stuttgart 21 with respect to their degree of deliberation





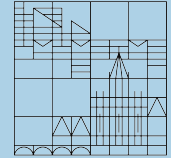
Political Science – Goals

Test claims of deliberative theory:

(RQ1) Is the degree of interest conflict in a particular decision-making process correlated with the level of deliberation?

(RQ2) Can arguments indeed overcome interests?
→ new follow-up project (Sept. 2013)





Political Science – Experiments RQ1

A group of subjects negotiates a public policy conflict
(e.g., fracking).

Experimental design:

- 3 factors: conflict over facts, over values, over interests

- => hypothesis: decreasing level of deliberation

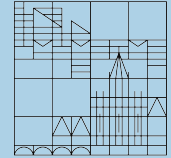
- 4 subjects (2 pro, 2 con)

- 120 repetitions

- 1 hour discussion time

- pre- and post discussion surveys

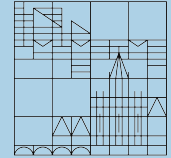




Analysis

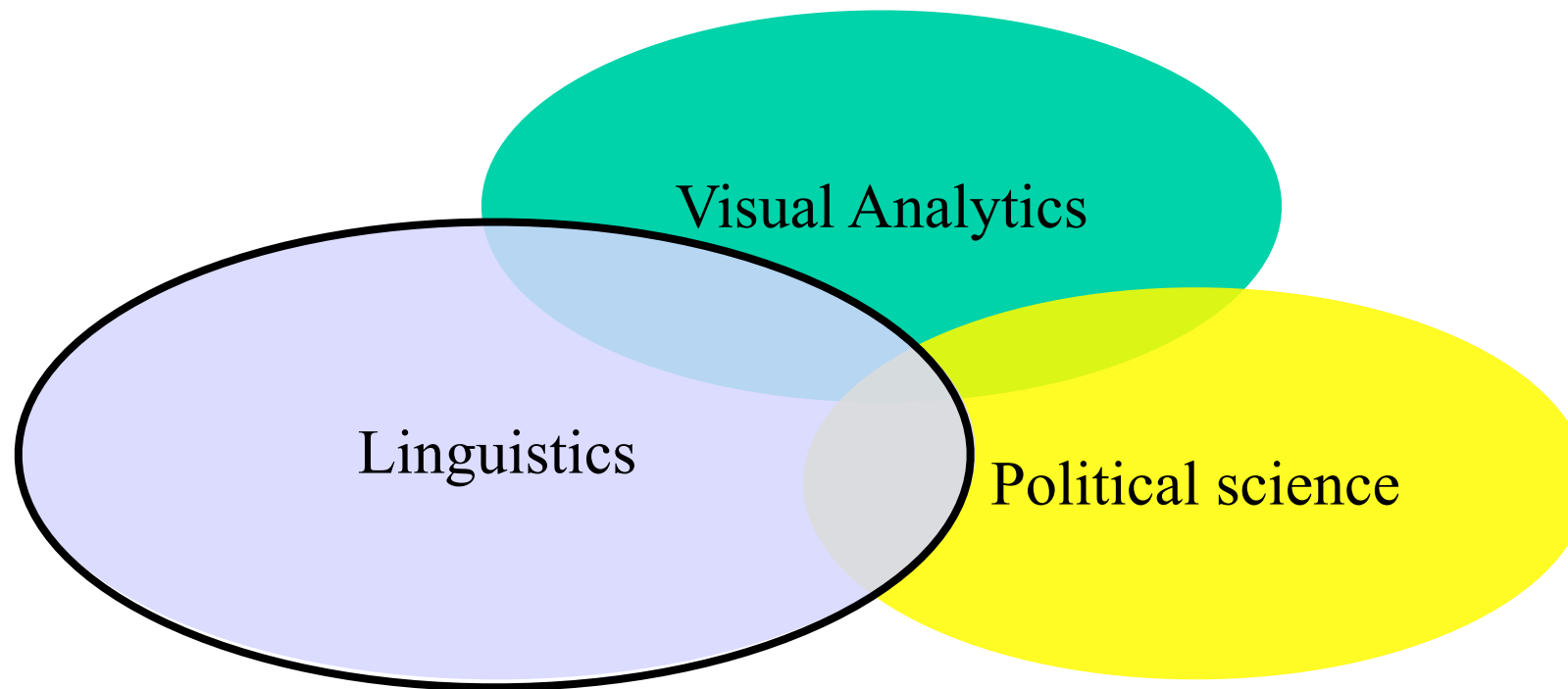
- The experiments result in large amounts of spoken (transcribed) material.
- How can this material be analyzed effectively?

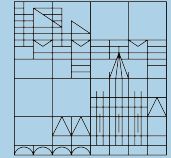




Our Approach:

- interdisciplinary combination of methods

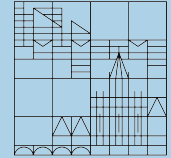




Tasks for (Computational) Linguistic Research

- Identify linguistic cues that indicate deliberative discourse.
- Identify candidates for automatic detection.
- Develop an annotation scheme to feed into the visual analysis.
- Take multiple annotation dimensions into account.
- Write inference rules for deliberative index.

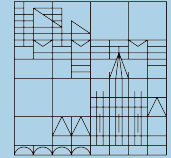




Challenges

- We cannot evaluate the content (**at-issue**) of the utterances.
- But we can analyze
 - the rhetorical structure of a discourse
 - key terms indicating reference to democratic or “greater good” principles (needs to be developed in close cooperation with political science)





Linguistic Cues and Deliberativity: key terms

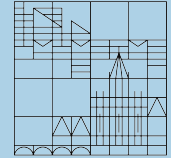
Research Question: Which terms are relevant?

Simulation gaming example:

Also ich bin prinzipiell eher für ein **Mehrheitswahlsystem**, weil **Wettbewerb** sehr wichtig ist für **Demokratie** und dadurch auch das **Allgemeinwohl** am besten vertreten werden kann.

So in principle I am more in favor of a **system of majority vote** because **competition** is very important for **democracy** and that way the **greater good** can also be represented in the best manner.

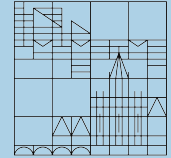




Rhetorical Structure

- we cannot evaluate which argument is “better”
(at-issue content)
 - but we can evaluate
 - the overall argumentative structure of a discourse
 - the rhetorical means employed
 - the **conventional implicatures (CI)**
- **Basically how the information is packaged.**

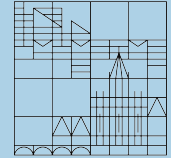




Relevant Dimensions

- rhetorical/discourse relations (e.g., *reason*, *concession*, *opposition*, *condition*)
- information structure (topic, focus, etc.)
- turn taking (length, structure, type)
- manifold further rhetorical devices

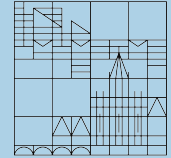




Rhetorical/discourse relations

- Can build on a long tradition
- Much work done for English and German
(cf. a.o. the Penn Discourse Bank: Joshi/Webber)
- Important for us:
 - not primarily interested in discourse coherence
(some of the turns are quite incoherent...)
 - but in the **speech act** (illocution) of the utterance
(cf. Stede&Pelzdus 2012)





Information Structure

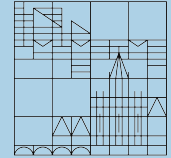
- Distribution of Topic and Focus is relatively complex in German (e.g. work by Buring)
- But: can look at **German Vorfeld**, which is topic-like

Simulation gaming example:

Die Geschwindigkeit der Entscheidungsfindung ist, scheint mir so ein bisschen, Ihr Totschlagsargument.

The speed of decision making is, it seems to me just a little, your killer argument.





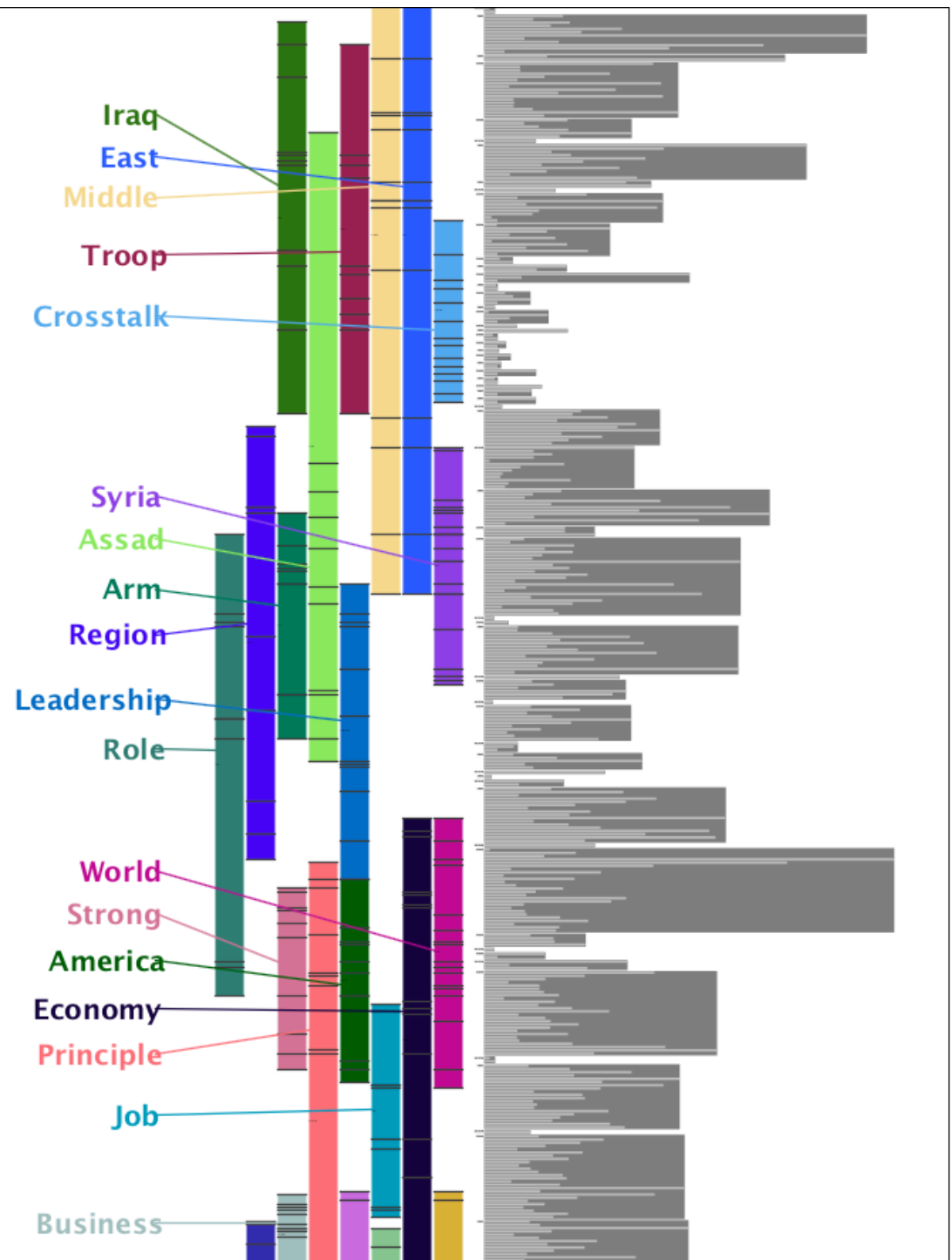
Related Effort: “Lexical Episodes”

- Visualization of what is under discussion in a stretch of dialog
 - Words that occur more often than expected in a given stretch of text.
 - The distance between instances of a word within an episode is smaller than the expected distance with respect to the entire corpus.
- Example: 3rd presidential debate between Barack Obama and Mitt Romney (Oct. 2012)



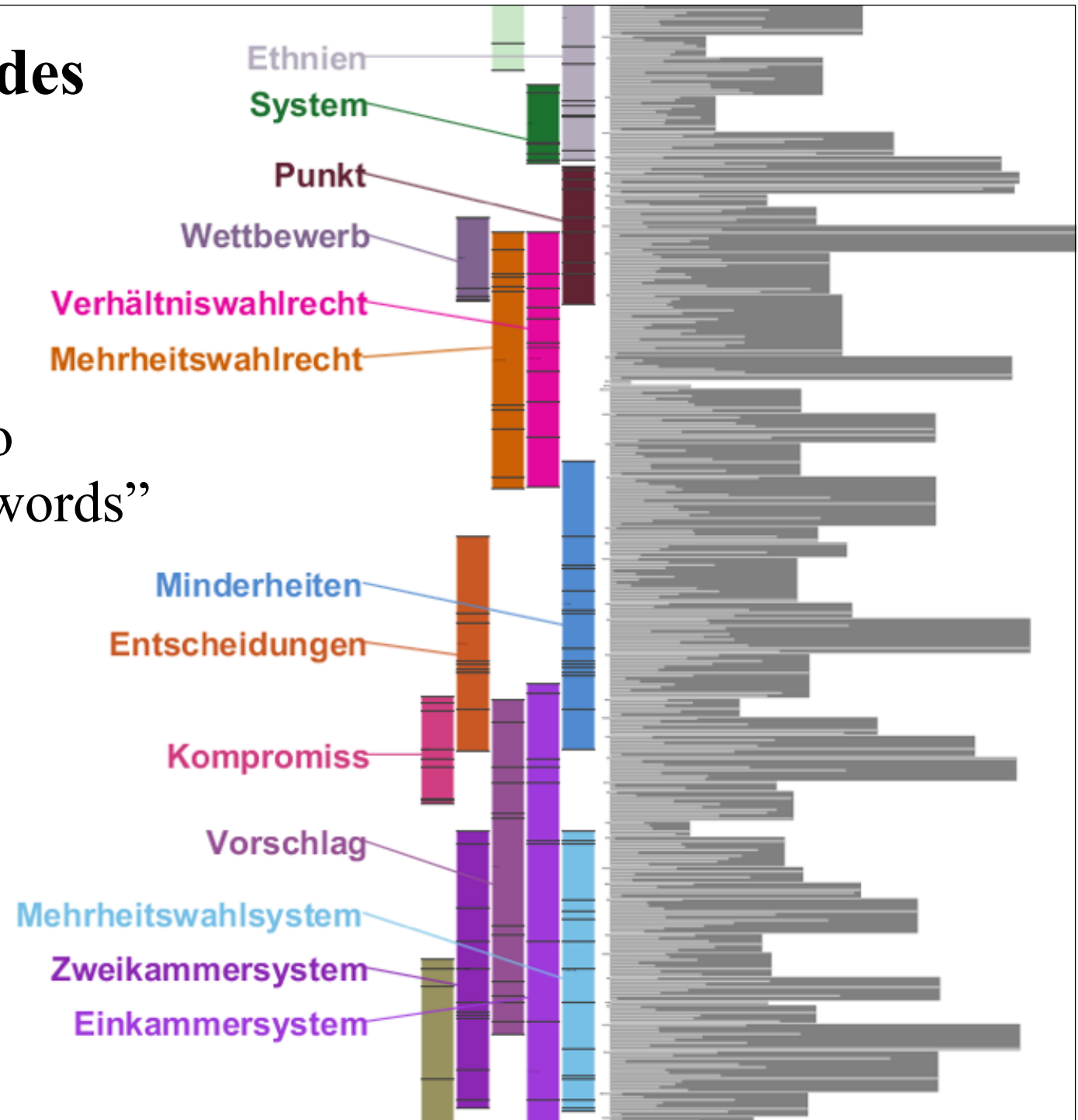
Lexical Episodes

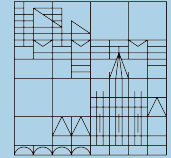
- Each grey box is a turn
- Each word has a color
- Interaction possible (mouse over, zooming)



Lexical Episodes

Could also use to
determine “key words”





Rhetorical Devices

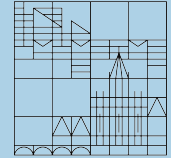
- The German example we just saw has a different interpretation if the parenthetical is removed.

Die Geschwindigkeit der Entscheidungsfindung ist Ihr Totschlagsargument.

The speed of decision making is your killer argument.

- How you **package** an utterance rhetorically is of extreme importance in argumentation.



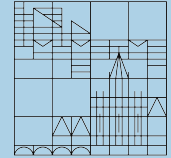


Rhetorical devices

- expression of speaker/hearer belief
- evidentiality
- establishment of common ground
- triggering of presuppositions
- expression of subjectivity vs. objectivity
- hedging, etc.

How do these play out in German? – Just some examples...





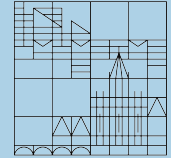
Modal Particles

- Spoken German makes extensive use of modal particles

From Stuttgart 21

und in München und Nürnberg wohnen **ja wohl doch**
doppelt so viele Leute wie in Stuttgart und Ulm zusammen
and **isn't it the case** that in Munich and Nürnberg twice as
many people live as in Stuttgart and Ulm taken together



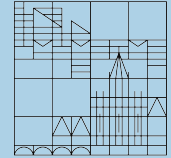


Modal/Discourse Particles

- Quite a bit of research on particles in German (Zimmerman 2011 provides an overview)
- Precise meaning contribution difficult to pin-point
- Particles are ambiguous – occur in different contexts with different meanings.
- But can build on some existing analyses, e.g.

ja, doch, wohl, halt, eben





Modal/Discourse Particles

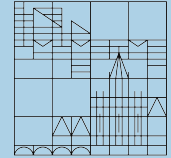
Zimmermann: discourse particles contribute to the CI (conventional implicature) meaning:

$[[ja]](p) = p$ is true and speaker believes p is uncontroversial

From Stuttgart 21:

weil **ja** Lokomotiven auch für eine längere Zeit eingekauft werden als für 10 Jahre.

because **(it's clear)** that train engines are bought for a longer time span than for 10 years



Modal/Discourse Particles

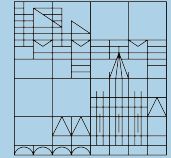
[[halt]](p) = resigned acceptance of p by speaker due to perceived unalterable state of affairs (based on Karagjsova)

From Stuttgart 21:

Dann rüste ich **halt** den Kopfbahnhof auf.

Then **(in that case)** I'll upgrade the railway terminal.





Modal/Discourse Particles

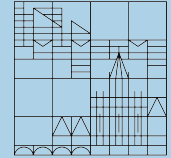
With a causal connector, *halt* takes on a meaning of justification via the invocation of an immutable constraint due to “this-is-the-way-the-world-is”.

From Stuttgart 21:

weil **halt** in dem Bereich auch die meisten Autos unterwegs sind.

because that area is also frequented by the most cars.





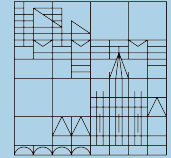
Causal Connectors

- But not all causal connectors are created equal.
- Differ on scale of “speaker involvement” (subjectivity)
(e.g., Pander Maat and Degand 2001)

*also > folglich > denn > infolgedessen > nämlich > so
> somit > schließlich > deshalb > daher > darum*

- our initial results do not quite confirm this scale





Causal Connectors: *weil* vs. *denn*

- *denn*: indirect assertion of causal relation, related to speaker knowledge (epistemic) (e.g., Scheffler 2005)
- *weil*: assertion of objective direct causal relation

Wir haben den Zug aber wieder eingestellt, **weil** die Nachfrage zu gering war.
We terminated that train **because** the demand was too low.

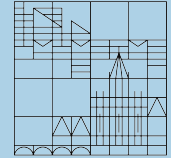
denn der normale Gedanke beim Güterverkehr ist ...

because the normal reasoning with respect to freight traffic is ...

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Other Relevant Linguistic Cues to Explore

Position of verb in embedded clauses of attitude verbs
(Scheffler 2009)

- V2 (second position in clause): expression of doubtfulness or uncertainty of outcome

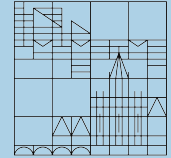
Ich hoffe, dass Peter heute noch **kommt**. (neutral expectation)

I hope that Peter is still coming today.

Ich hoffe, Peter **kommt** heute noch. (doubtful of event happening)

I hope, Peter is (really) still coming today.

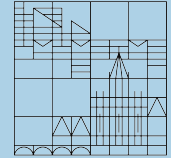




Other Relevant Linguistic Cues to Explore

- Level of politeness in discussion
(cf. Stanford politeness corpus)
- Level of tolerance in discussions
(Mukherjee et al. 2013)
- and more...

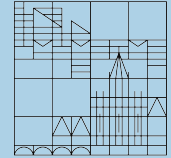




Annotation Scheme

- no existing annotation scheme that fits our purpose
- linguists tend to work on one of the relevant dimensions (particles or connectors or information structure), but very seldom on all dimensions that are relevant to us
 - annotation scheme has to be able to take at least the different factors just sketched into account

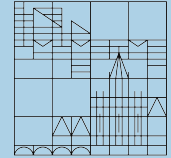




Annotation Scheme – Methodology

- build on state-of-the-art where possible
- work bottom-up using linguistic cues that can be identified reliably and automatically
- inference rules collect up relevant information and provide an analysis that goes beyond the individual cues

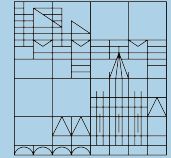




Inference Rule: Example

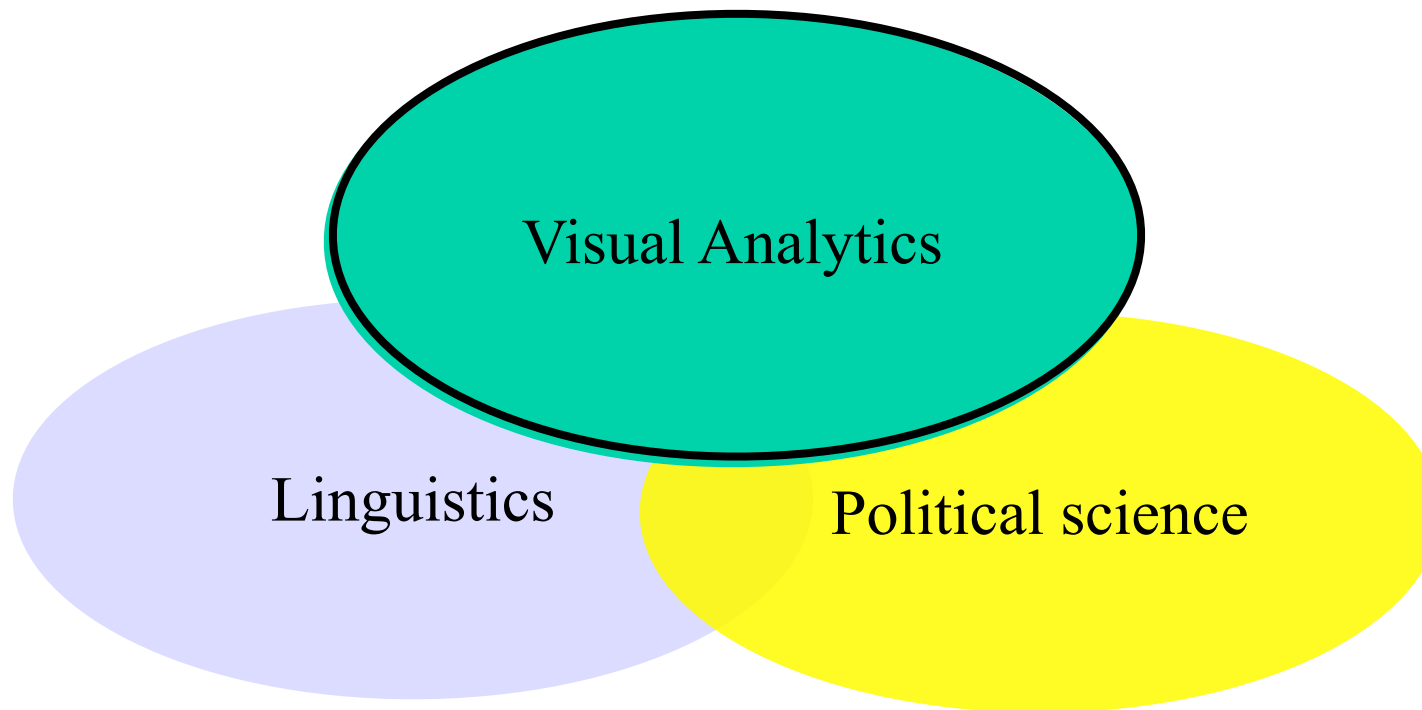
- if causal connector *weil* plus the modal particle *ja* → invocation of common ground as reason
- if causal connector *weil* plus the modal particle *halt/eben* → invocation of immutable constraint due to “this-is-the-way-the-world-is” as reason
- etc.

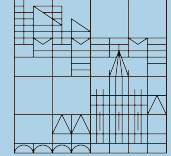




Our Approach:

- interdisciplinary combination of methods

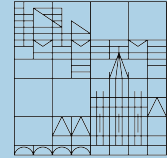




Tasks for Visual Analytics Research

- Support the development of an automated measure of deliberation
- Support the visual analysis of deliberative mediation processes
- Support the visual analysis of linguistic phenomena





Machine: Quantitative Measures (scalable, „objective“)

Text Features

- Average word length
- Frequency distribution of pronouns
- Branching factor of sentence
syntax parse tree
- Relative frequency of foreign words
- ...



Semantic Gap

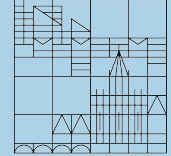
Human: Qualitative Judgements (not scalable, „subjective“)

Semantic Judgements

- Negotiation vs. Argumentation
- Degree of Deliberation
- Eloquence
- Persuasiveness
- Fairness
- Emotionality

Meta Features

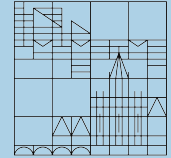
- Utterance frequency of persons
- Order of persons
- ...



Challenges for Computer Science Research

- System Architecture
- Design
- Algorithms
- Evaluation

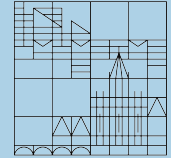




System Architecture

- Infrastructure for Visual Discourse Analysis
 - Modular
 - Understandable
 - Flexible
 - Extendible
- Flexible Workflows
- Open-source Release envisioned





Design

- Visualization
 - What information to show?
 - How to show it?
- Interaction
 - Which interactions to offer?
 - How to make them intuitive?

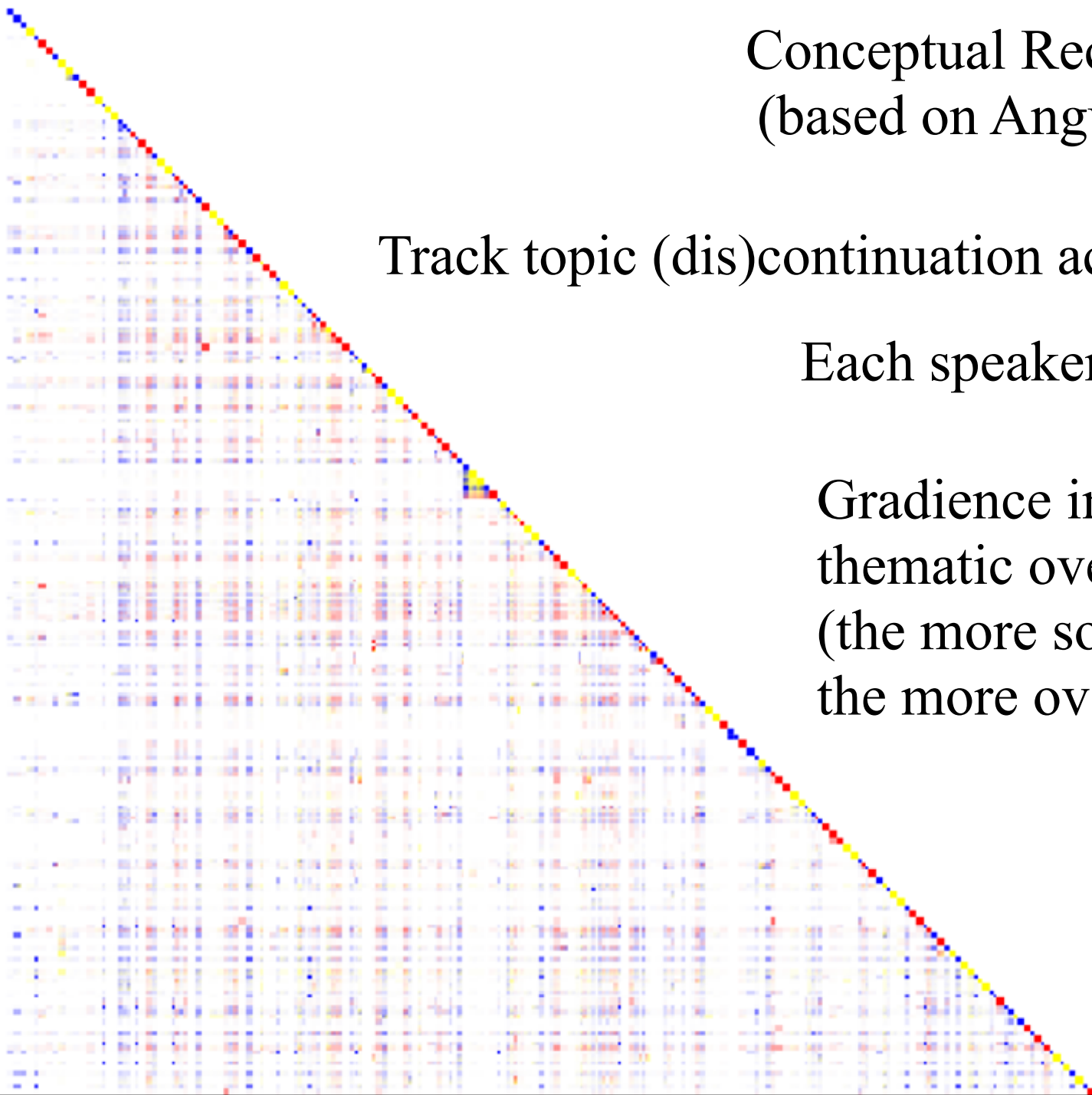


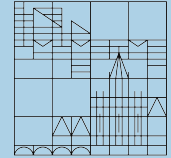
Conceptual Recurrence Plots (based on Angus et al. 2011)

Track topic (dis)continuation across speakers

Each speaker gets a color.

Gradience indicates
thematic overlap
(the more solid the color,
the more overlap).

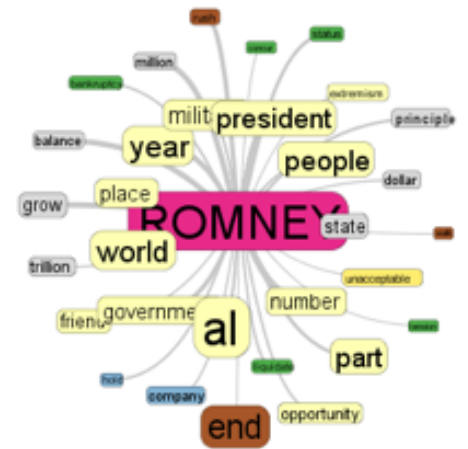
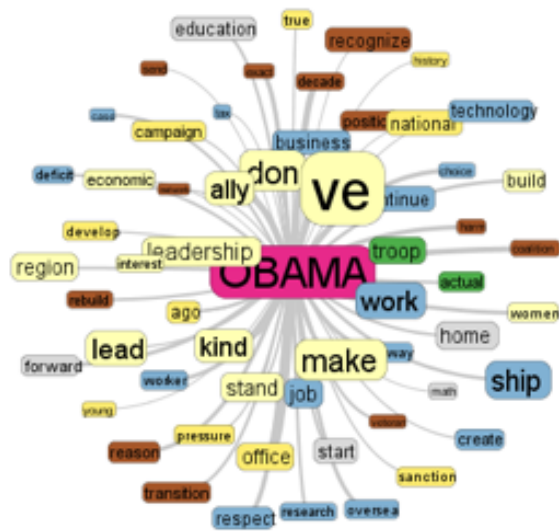
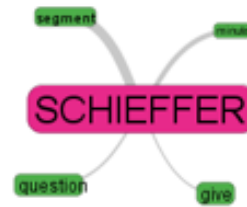


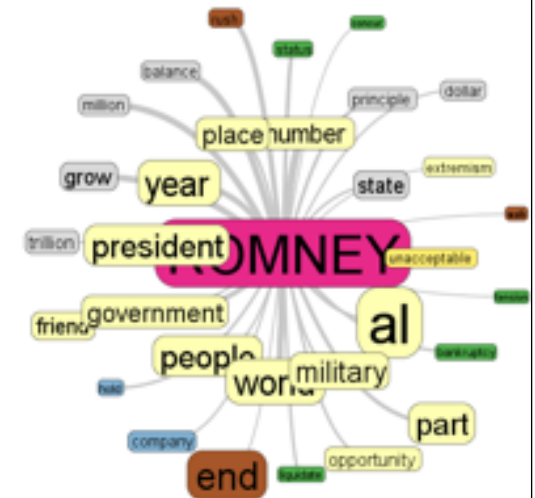


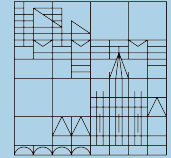
Algorithms

- Automated Processing/Analysis
 - What kind of information to extract from the data?
 - Where are novel methods required?
 - How to design efficient and effective solutions?
- Visualizations
 - How to achieve optimal layouts efficiently?
 - How to dynamically adapt layouts to interactions?





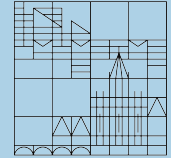




Evaluation

- Benchmark
 - How to create valid benchmarks for the evaluation of automated preprocessing/analysis methods?
- User Studies
 - How to design insightful studies on the usability of single visualizations and the overall system?

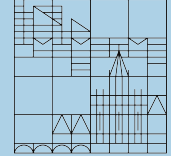




Summary

- Multi-faceted problem:
 - Understanding the connection between the degree of deliberativity of a dialog and actual argumentative strategies
 - Using linguistic cues to measure the degree of deliberativity of a dialog?
 - Using visual analytics to understand the structure of a deliberative dialog.





More details on the Powerwall tomorrow!
(C202)

