



# Statistical Natural Language Processing

Prof. Dr. Dietrich Klakow





#### Lecture

- Lecture:
  - Friday 8:30-10:00
  - Location: MS Teams
  - Contact:
    - D. Klakow: dietrich.klakow@lsv.uni-saarland.de







- Exercises:
  - First exercise sheet will be issued today
  - Three groups:
    - Vilém Zouhar
      - vzouhar@lsv.uni-saarland.de
      - Thursday 16:00-17:30
    - Awantee Deshpande
      - adeshpande@lsv.uni-saarland.de
      - Tuesday 14:15-15:45
    - Julius Steuer
      - jsteuer@coli.uni-saarland.de
      - Tuesday 12:15-13:45





### **Exercises**

# Submissions: Groups of 2 mandatory Requirements:

- Threshold 70% (out of mandatory assignments)
- 10pts per assignment (around ~10) + bonus exercises (~2pts)
- 1pt bonus for active participation (showing up and talking/contributing)
- 5pts bonus for presenting the solution for an entire exercise sheet (at most once).
   Fractions for presenting parts of a sheet.





### Exercises

#### Submissions:

- Distribution of assignments using notebooks
- Suggestions: import your implementations rather than put it in the cells.
- Theoretical solutions also in the notebook (you can write LaTeX in cells)





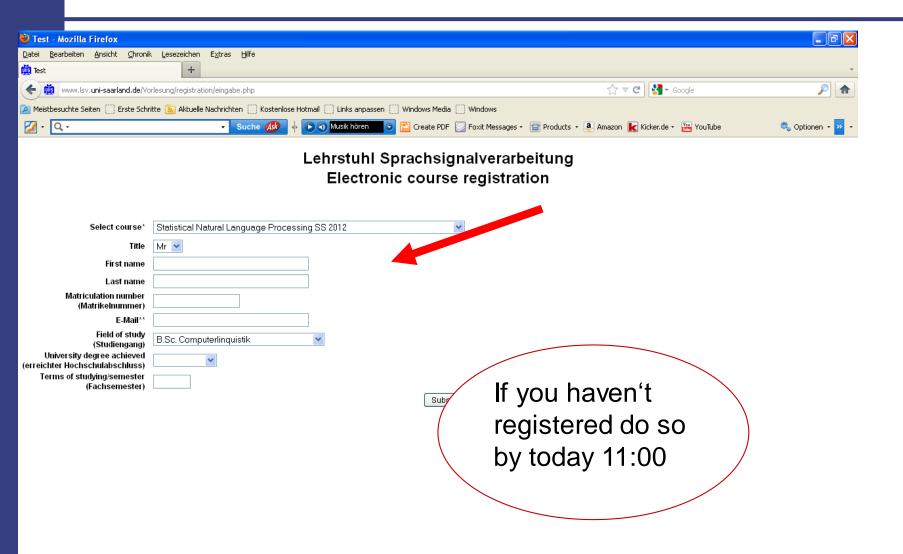
### Teams + Piazza

- Lectures and tutorials will be on MS Teams
- Forum: Piazza





### Mailing List









- Friday, July 23rd, 8:00-10:00.
- GHH E22, Foyer GHH and HS002 in E13.
- Assignment to locations will follow in the week before the exam once July corona rules are clear







## Foundations of Statistical Natural Language Processing

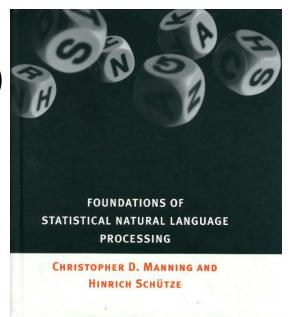
by <u>Christopher D. Manning</u>, <u>Hinrich</u> <u>Schütze</u>

Publisher: The MIT Press;

1st edition (June 18, 1999)

ISBN: 0262133601

**List Price:**\$77.00









- In case you don't understand something:
  - 1. Ask!!!
  - 2. Ask!!!
  - 3. Ask!!!



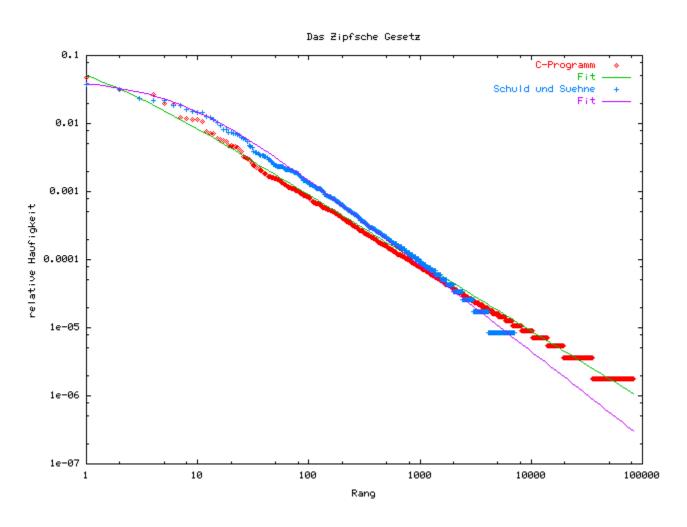


# 1. Introduction: Overview of the Topics





# Use Zipf's-Law in Language Modeling





# Chapter 2: Natural Language as a Sequence of Symbols

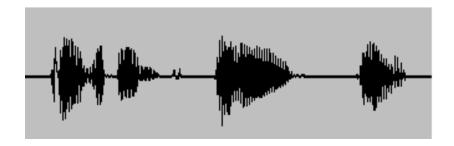


- Zipf's law
- Revision of basics of probability theory









President Bill ???



# Chapter 3: Basics of Language Modeling



- Language models for speech recognition
- Perplexity





## Coding a language efficiently

Space	Accent	∷• Ind.	:• Ind.	∷ Caps.	∷• :• Italics	 . ● . ● Letter Sign	ind.
•:	••	• : : •	••	• •	::	::	::
a	С	е	d	ch	sh	wh	th
•:	:• •:	••	••	• •	••	**	**
,	i	:	j	en	ow		w
•:	• •	• •	**	::	•	•	::
ь	f	h	g	gh	ed	ou	er
· · ·			::	::	::	::	::
,	st	in	ar	-	ing	"	Number Sign (#)
•:	**	• •	::	::	••	::	::
k	m	0_	n	u	х	Z	У
<b>:</b> :	:	::	<b>::</b>	::	::	**	::
;	s	ļ ļ	t	? or "	the	( or )	with
:	::	:	::	::	::	::	<b>::</b>
	р	r	q	v_	and	of	for





## Chapter 4: Entropy

- The Shannon game
- Text compression



# Chapter 5: Backing-Off Language Models

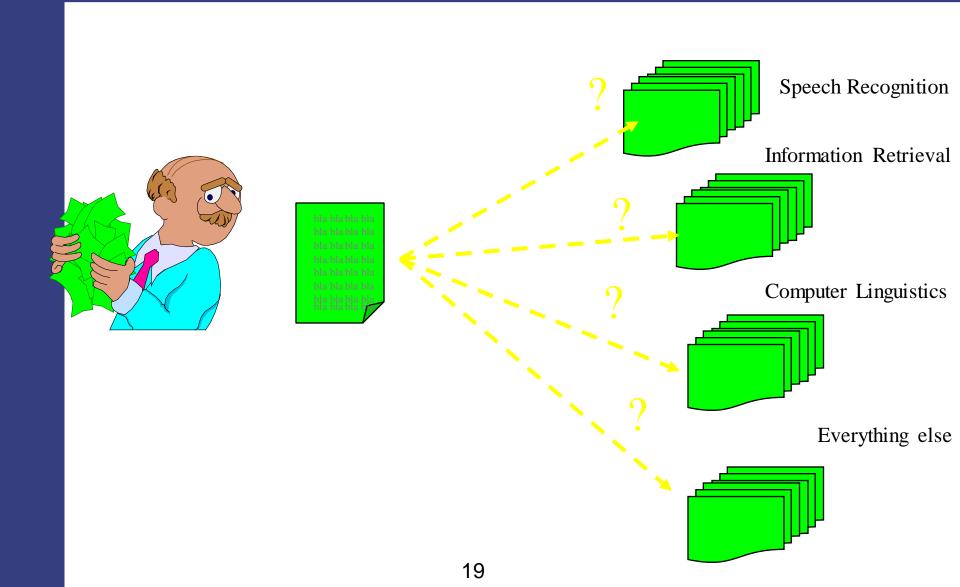


Smoothing techniques





## **Text Categorization**









```
V/agra $3,31
Amb/en
Mer/dia
C/alis $3,75
Val/um $1,21
X&nax
Som&
```

http://www.Chanatanxte.scriptmania.com/





### Chapter 6. Text Classification

- Variants of Task
- Algorithms
  - Nearest Neighbor Classifier
  - Maximum Entropy Models
  - Decision Trees
  - Neural Networks
  - Unsupervised Clustering



# Translation of the word "band" into German (output from LEO's)



- <u>band</u> <u>das</u> <u>Band</u>
- <u>band</u> <u>die Band</u> Musikgruppe
- <u>band</u> [tech.] <u>das Band</u>
- <u>band</u> <u>die Bandbreite</u>
- band [chem.] die Bande im Spektrum band das Beffchen band der Bereich band der Bund band der Frequenzbereich band die Gruppe band der Gurt band die Kapelle band die Leiste band die Musikkapelle band das Orchester band die Schar band die Schnur band [mus.] der Spielmannszug band der Streifen band die Truppe narrowband also: narrow-band adj. engbandig narrowband also: narrowband adi, schmalbandig sideband also; side band [elec.] [telecom.] das Seitenband Verben und Verbzusammensetzungen to band together sich verbinden to band together sich vereinigen to band together sich zusammenrotten to band together sich zusammentum to band together zu einer Gruppe vereinigen to beat the band nie da gewesen sein to cross-band [tech.] absperren [Holzverarbeitung]. Zusammengesetzte Einträge abrasive band - cloth [tech.] das Bandschleifleinen abrasive band paper [tech.] das Bandschleifpapier adhesive band [tech.] das Klischeeklebeband attenuating band [aviat.] der Dämpfungsbereich audio band [phys.] der Hörbereich **band** aerial die Bandantenne **band**-aid das Heftpflaster **band**-aid [Amer.] [med.] das Pflaster **band**-aid [Amer.] [med.] das Wundpflaster band boxdie Hutschachtel band ceramics die Bandkeramik band collar der Stehkragen band-conveyor das Fließband band conveyor [tech.] der Gurtförderer band-conveyor das Transportband band edge die Bandkante band emission [autom.] die Bandemission bandemission [autom.] die Bandenemission band gap [phys.] die Bandlücke band gate [tech.] der Bandausschnitt Spritzgusswerkzeug [Kunststoffe] band grinder [tech.] die Bandschleifmaschine band matrix [math.] die Bandmatrix band of barrel das Fassband band of barrel der Fassreifen band of radiation [phys.] der Strahlungsbereich band of robbers die Räuberbande band overlap [tech.] die Bandüberlappung band printer [print.] der Banddrucker band radiation [autom.] die Bandenstrahlung band resaw [tech.] die Trennbandsäge hand saw [tech.] die Bandsäge hand-saw die Bandsäge hand spectrum [tech.] das Bandenspektrum hand-spread die Bandspreizung band-stand der Musikpavillon band structure [phys.] die Bandstruktur band-switch der Bereichsschalter band-switch der Bereichsumschalter band width die Bandbreite base band [tech.] das Basisband brake band [tech.] das Bremsband brass band [mus.] die Blaskapelle brass band [mus.] die Blechmusik brass band [mus.] der Spielmannszug broad band [tech.] das Breitband carrier band [tech.] das Trägerfrequenzband clay band [geol.] das Salband clincher band [autom.] das Wulstband [Reifen] conveyer band das Förderband cover hand [tech.] das Deckband currency hand [bank.] die Währungsbandbreite dance hand die Tanzkapelle dead hand [metr.] die Totzone edge band [tech.] der Umleimer [Tischlerei] elastic band [tech.] das Gummiband elastic band der Gummistrumpf error band der Zufallsstreubereich filter band [tech.] das Siebband flexible band die Randzeit - Arbeitszeit glassy band [tech.] glassiger Streifen guard band [elec.] der Rasen - Abstand zwischen den Schrägspuren, den Videospuren, der benutzt wird, um eine gegenseitige Beeinflussung der Spuren zu vermeiden, guard hand [elec.] der Schutzabstand - Abstand zwischen den Schrägspuren, den Videospuren, der benutzt wird, um eine gegenseitige Beeinflussung der Spuren zu vermeiden guard band [elec.] [telecom.] der Schutzbereich - zwischen zwei Kanälen zur Vermeidung von Interferenzen, guard band [telecom.] der Schutzbereicht, guard band [elec.] [telecom.] das Sicherheitsband - zwischen zwei Kanälen zur Vermeidung von Interferenzen\_guard band [elec.] [telecom.] das Sicherheitsfrequenzband - zwischen zwei Kanälen zur Vermeidung von Interferenzen guide band das Führungsband hair-band das Haarband heating band [tech.] das Heizband hinge band [tech.] das Gelenkband mehr >>



# Chapter 7: Word Sense Disambiguation



- Dictionary-Based Disambiguation
- Thesaurus based methods
- Bayes Classifier





### Example for Part-Of-Speech Tagging

Xinhua News Agency, Guangzhou, March 16 (Reporter Chen Ji) The latest statistics show that from January through February this year, the export of hightech products in Guangdong Province reached 3.76 billion US dollars, up 34.8% over the same period last year and accounted for 25.5% of the total export in the province.





### Example for Part-Of-Speech Tagging

Xinhua/NNP News/NNP Agency/NNP ,/, Guangzhou/NNP ,/, Marčh/NNP 16/CD (/( Reporter/NNP Chen/NNP Ji/NNP )/SYM The/DT latest/JJS statistics/NNS show/VBP that/IN from/IN January/NNP through/IN February/NNP this/DT year/NN ,/, the/DT export/NN of/IN high-tech/JJ products/NNS in/IN Guangdong/NNP Province/NNP reached/VBD 3.76/CD billion/CD US/PRP dollars/NNS ,/, up/IN 34.8%/CD over/IN the/DT same/JJ period/NN last/JJ year/NN and/CC accounted/VBD for/IN 25.5%/CD of/IN the/DT total/JJ export/NN in/IN the/DT province/NN ./.





# Chapter 8: Part-Of-Speech Tagging

- Hidden Markov Model
- Rule based: The Brill tagger





## Chapter 9. Named Entity Tagging

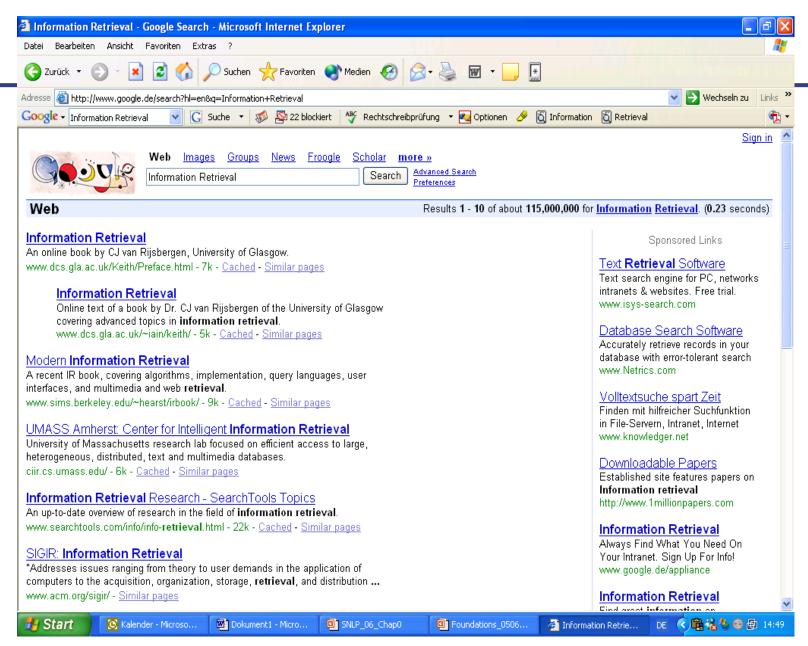
#### Task:

Identify names of people, organizations, locations ... in text

President <ENAMEX id="9"
 type="PERSON">Richard
 Nixon</ENAMEX> in <ENAMEX id="10"
 type="LOCATION">Moscow.</ENAMEX
 >











### Chapter 10: Information Retrieval

- Evaluation
- Processing the query
- Vector space model
- Term weighting
- Distance metrics
- Models for term distribution
- Probabilistic IR
- Singular value decomposition
- Language models

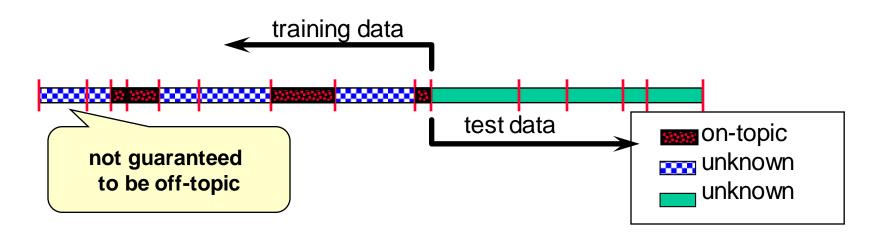


# Chapter 11. Topic Detection and Tracking (if time permits)



To detect stories that discuss the target topic, in multiple source streams.

- Find all the stories that discuss a given target topic
  - Training: Given N<sub>t</sub> sample stories that discuss a given target topic,
  - Test: Find all subsequent stories that discuss the target topic.

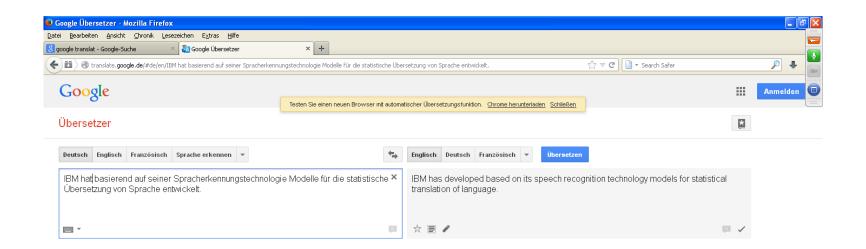




# Chapter 12: Statistical Machine Translation



- Machine translation as a sequence labeling problem
- IBM models 1-4







## **Summary Chapter 1**

- Organization of the lecture
- Overview of the topics

Are those the topics you are expecting?