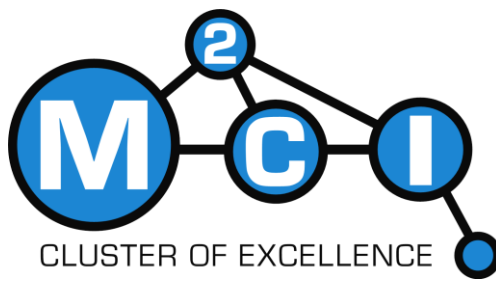




UNIVERSITÄT DES SAARLANDES



CLUSTER OF EXCELLENCE



Institut für
**Maschinelle
Sprachverarbeitung**

UNIVERSITÄT STUTTGART

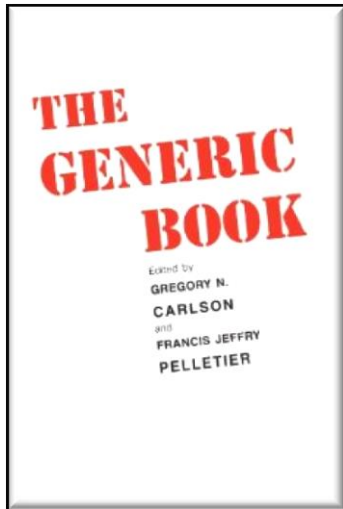
Annotating genericity: a survey, a scheme, and a corpus

Annemarie Friedrich¹, Alexis Palmer²,
Melissa Peate Sørensen¹ and Manfred Pinkal¹

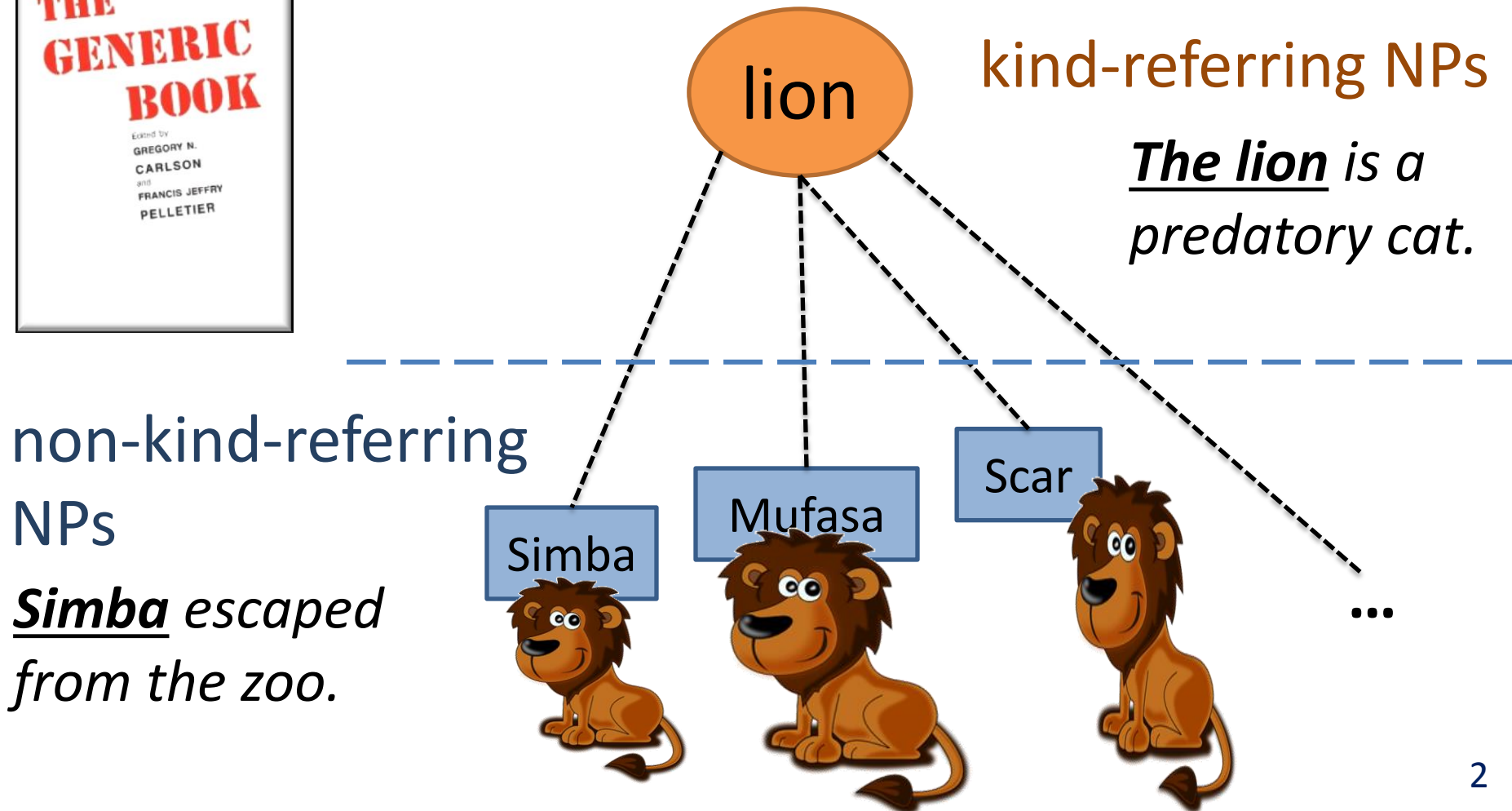
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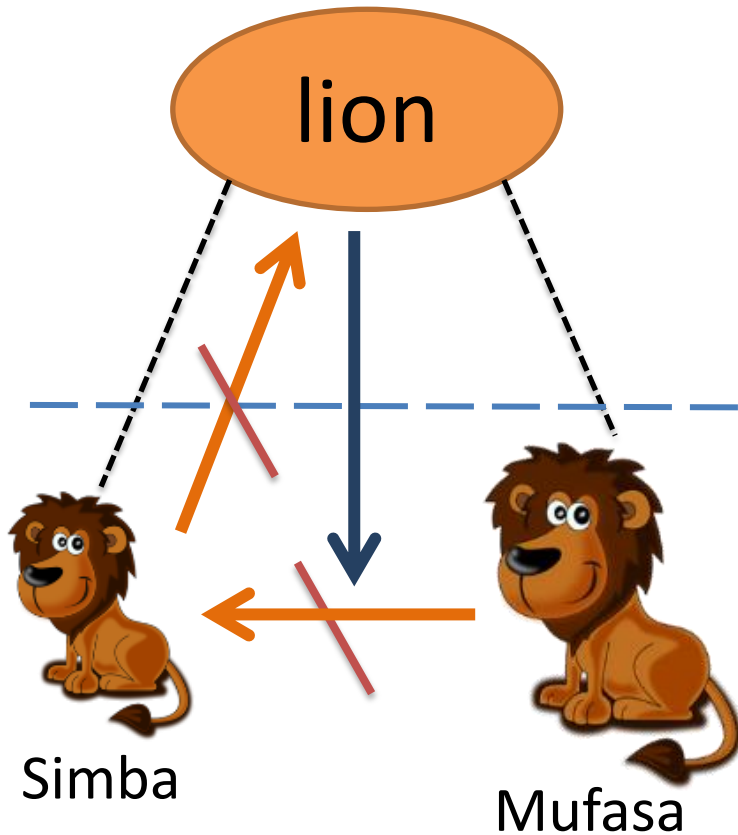
Reference to kinds



Krifka et al. (1995): Genericity: An Introduction.



Generic vs. non-generic expressions

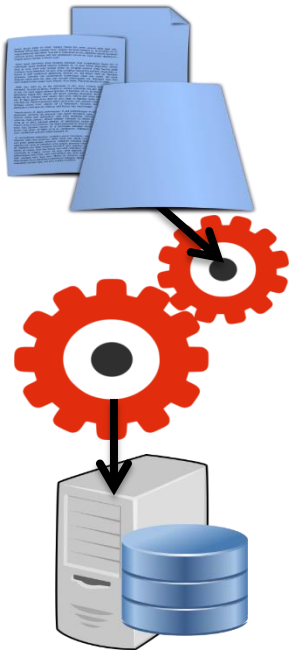


different
entailment properties

Lions are dangerous.

*Mufasa is dangerous.
Simba is dangerous.*

Identifying generic expressions: why?



knowledge
extraction
from text



natural language
understanding

Motivation

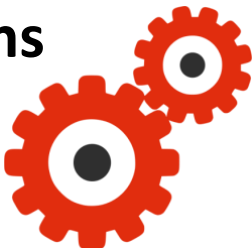
Survey

existing approaches
semantic theory literature



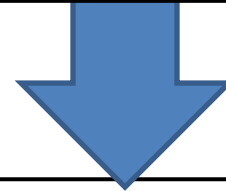
Aim:

computational
models for
identifying **generic
expressions**



Previously existing corpora

problematic points in annotation
guidelines or small data sets



Our corpus / annotation scheme

guidelines motivated by semantic theory
large data set
→ necessary for successful machine
learning approaches to genericity
identification

NP-level: reference to kinds

form of NP not sufficient

	kind-referring	non-kind-referring
definite NPs	<i><u>The lion</u> is a predatory cat.</i>	<i><u>The cat</u> chased the mouse.</i>
indefinite NPs	<i><u>Lions</u> eat meat.</i>	<i><u>Dogs</u> were barking outside.</i>
quantified NPs	<i><u>Some (type of) dinosaur</u> is extinct.</i>	<i><u>Some dogs</u> were barking outside.</i>
proper names	<i><u>Panthera leo persica</u> was first described by the Austrian zoologist Meyer.</i>	<i><u>John</u> likes ice cream.</i>

clause / context matters

Terminology: clause-level genericity

characterizing sentences

	lexically characterizing sentences	habitual sentences
kind-referring subject	<i>Lions have manes.</i>	<i>Lions eat meat.</i>
non-kind-referring subject	<i>John is tall.</i>	<i>John drives to work.</i>

Survey: annotating genericity

Level	Corpus	Scheme	Size
NP	ACE-2	generic, specific	40K entity mentions
	ACE-2005	GEN, SPC, USP, NEG	40K entity mentions
	ECB+	GEN, non-GEN	12.5K entity mentions
	GNOME	generic-yes, generic-no	900 clauses
	Herbelot & Copestake	ONE, SOME, MOST, ALL, QUANT	300 subject mentions
	CFD (Bhatia et al.)	GENERIC_KIND, GENERIC_INDIVIDUAL	3422 NPs (131 generic)
clause	Mathew & Katz	habitual, episodic	1052 sentences
	Louis & Nenkova	general, specific	894 sentences
NP, clause	MASC WikiGenerics	GEN_gen, NON-GEN_gen, NON-GEN_non-gen	20k clauses 10k clauses

Survey: clause-level annotations

[Mathew & Katz 2009]

episodic *John has finished the cake.*

vs. **habitual** *John drives to work. (regularity)*

[Louis & Nenkova 2011]

general sentences vs. **specific** sentences

≠ genericity as treated in literature

“broad statements about a topic”

A handful of serious attempts have been made to eliminate diseases.

vs. “detailed information”

Solid silicon compounds are already familiar – as rocks, glass, ...

Survey: NP-level annotations

[Nedoluzhko 2013]

coreference resolution research

no consistent definition

ignore generic entity mentions? avoid mixed chains?

GNOME corpus: generic-yes, generic-no

[Herbelot & Copestake 2009/2011]

<u>Cats</u> are mammals.	ALL cats
<u>Cats</u> have four legs.	MOST cats
<u>Cats</u> are black.	SOME cats
<u>A cat</u> chased the mouse.	ONE cat

[Bhatia et al. 2014]

GENERIC_KIND_LEVEL

Dinosaurs are extinct.

GENERIC_INDIVIDUAL_LEVEL

Cats have fur.

ACE entity class annotations

Automatic Content Extraction (2002-2008)

- largest corpora annotated with NP-level genericity to date
- basis for computational modeling [Reiter & Frank 2010]

ACE-2005:

GEN kind-referring

SPC non-kind-referring

NEG negatively quantified NPs

There are no confirmed suspects yet.

USP underspecified
ambiguous cases

There are new opportunities for women in New Delhi.
and mentions of entities “whose identity would be
difficult to locate”

Officials reported ...

ACE-2005: agreement study



annotations available from LDC
agreement study:

exactly-matching entity mention spans (~90%)

533 documents

adjudication

final corpus

news, broadcast news,
broadcast conversation,
forum and weblog texts

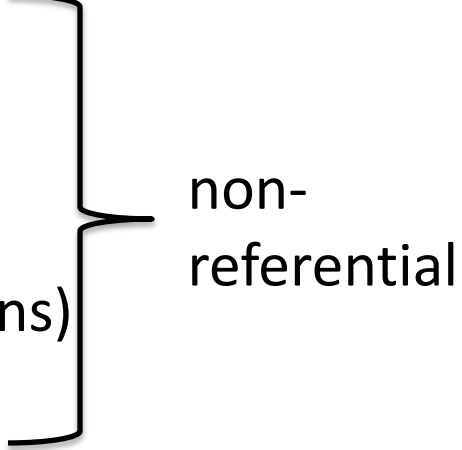
		annotator 2			
		SPC	USP	GEN	NEG
annotator 1	SPC	28168	1575	684	3
	USP	1142	1954	963	2
	GEN	757	1261	1707	10
	NEG	8	5	7	71

Cohen's $\kappa = 0.53$

confusion of SPC/GEN with USP is high

ACE-2005: agreement study

Problems of the ACE annotation guidelines

- **predicative uses** are marked
 - *John is a nice person. (specific)*
 - *John seems to be a nice person. (generic)*
 - **noun modifiers** in compounds (9.5% of all mentions) are marked as generic: *subway system*
 - guidelines mix **genericity** and **specificity**
(specificity = speaker has a particular referent in mind)
 - *Officials reported...*
 - not underspecified: not generic, but nonspecific
- 
- non-referential

Our approach: motivation

Previous approaches:

range / mix of linguistic phenomena, focus on applications
many linguistically motivated schemes, but small corpora



Our approach:

motivated by **semantic theory** (Krifka et al. 1995)
study references to and statement about kinds
(Task NP, Task CI, Task CI+NP)
(other aspects of genericity → future work)

contribution of clauses to **discourse**:

characterizing statements ≠ particular events or states

→ relevant for processing temporal structure of discourse

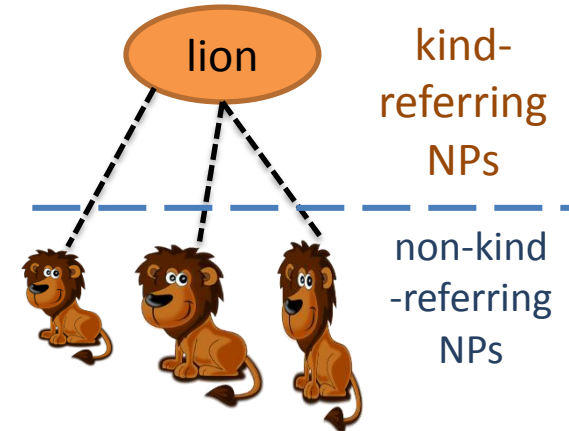
Task NP: genericity of subject

generic: references to kind / class

The lion is a predatory cat.

Lions have manes.

A lion may eat up to 30kg in one sitting.



non-generic: references particular individual(s)

Simba flees into exile.

A lion must have eaten the rabbit. (nonspecific)

Task C1: genericity of clause

generic: characterizing statements about kinds
subject must be **generic**.

The lion is a predatory cat.

Lions eat up to 30kg in one sitting. (habitual)

non-generic: statements about particular
individuals or particular events.

John is a nice guy.

John cycles to work. (habitual)

Task Cl+NP: clause and subject

clause subject	generic	non-generic
generic	<i><u>Lions</u> have manes. <u>Lions</u> eat meat.</i>	<i><u>The blobfish</u> was voted the “World’s Ugliest Animal”. <u>Dinosaurs</u> died out.</i>
non-generic	-- --	<i>John is a nice guy. John cycles to work.</i>

Corpus data



Manually Annotated Subcorpus of the Open American National Corpus (**MASC**)

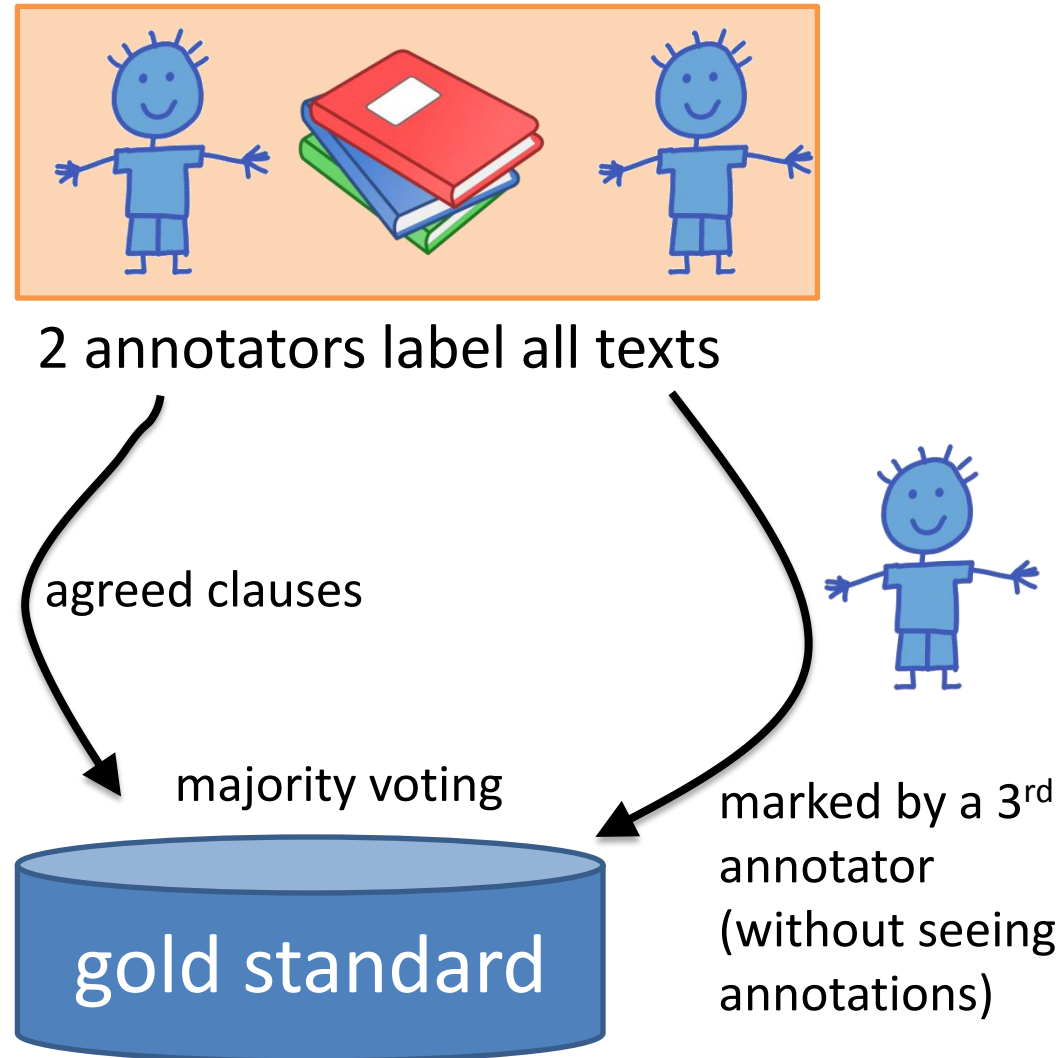
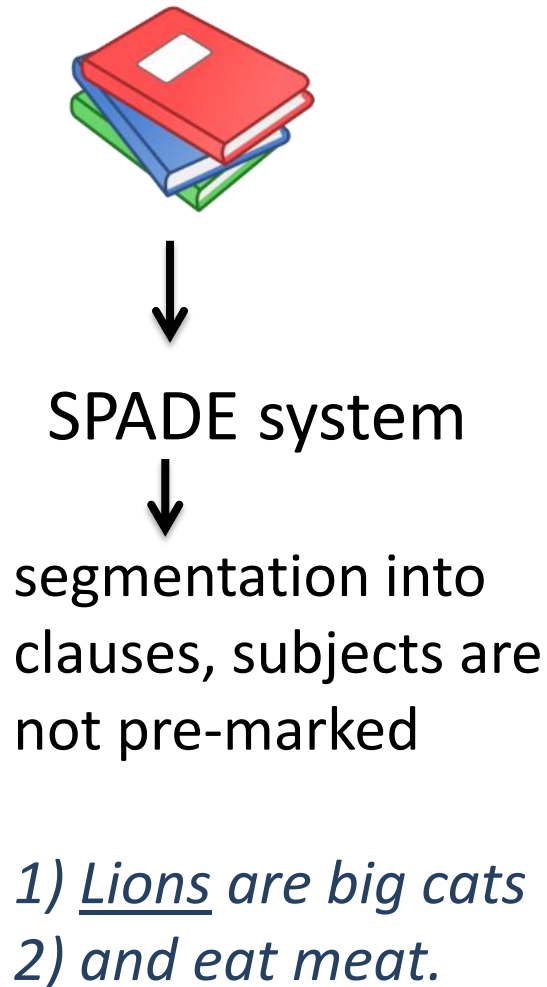
- essays, travel, letters, journal, jokes, blog, news, fiction
- 20136 clauses



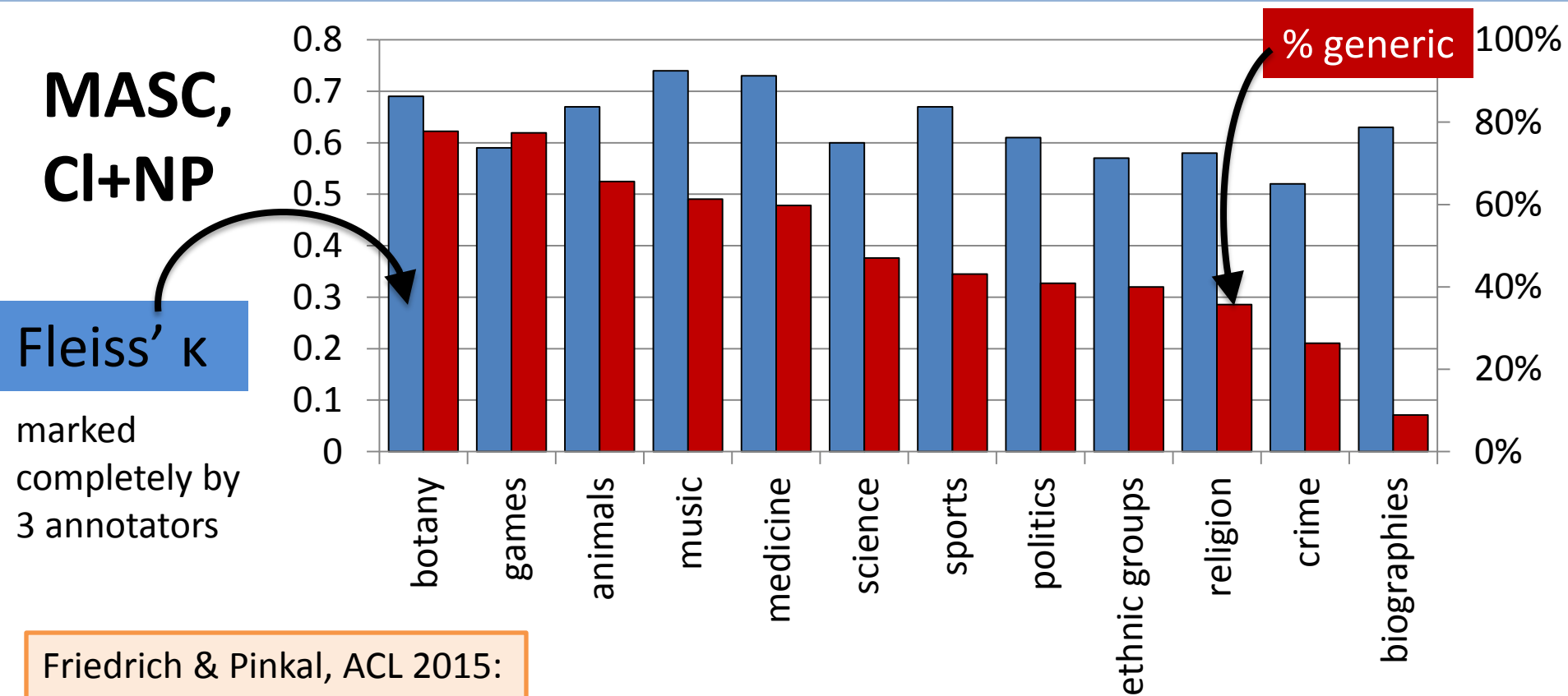
102 Wikipedia texts (**WikiGenerics**)

- aim: balanced corpus (many generics)
- about animals, sports, politics, science, biographies, ...
- 10279 clauses

Annotation process

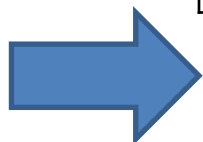


Inter-annotator agreement: WikiGenerics



Friedrich & Pinkal, ACL 2015:
Discourse-sensitive Automatic Identification of Generic Expressions.

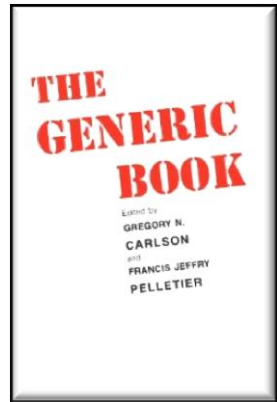
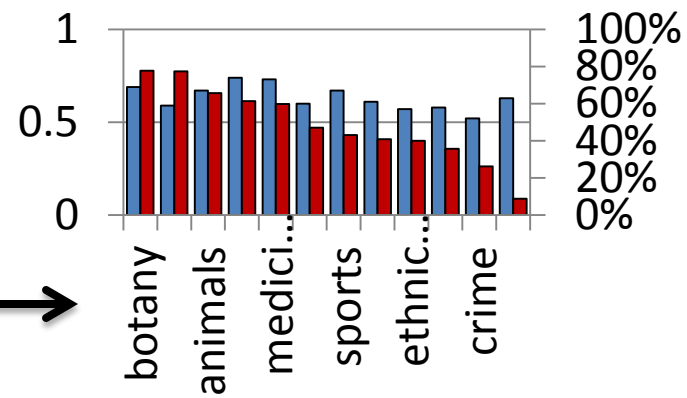
Task NP	Task CI	Task CI+NP	% generic
0.69	0.72	0.68	50.1%



balanced corpus, substantial agreement

survey & our corpus:
K moderate
 substantial

*interpretation in
 relation to label
 distribution*

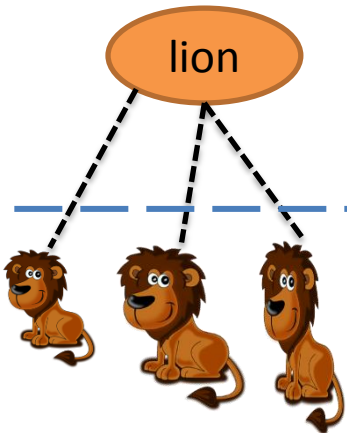


linguistically
 motivated 3-way
**annotation
 scheme:**
 NP, CI, CI+NP

Annotating genericity

MASC, WikiGenerics
 balanced
 substantial agreement

www.coli.uni-saarland.de/projects/sitent



kind-
 referring
 NPs

non-kind-
 referring
 NPs

*Students of Saarland
 university have lunch at
 mensa.*

**extensional (non-generic)
 vs. intensional (generic)
 reading**

redefine USP label?

- + study related phenomena (e.g. habitual sentences)
- + extend to other languages



Thank you



Alexis Palmer



Melissa Peate Sørensen



Manfred Pinkal

Questions?

www.coli.uni-saarland.de/projects/sitent

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