

OntoNotes: The 90% Solution

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The OntoNotes Project

- The OntoNotes Project started in 2006 and is a collaboration between
 - BBN Technologies
 - Ralph Weischedel
 - Lance Ramshaw
 - Sameer Pradhan
 - Brandeis University
 - Nianwen Xue
 - University of Colorado
 - Martha Palmer
 - University of Pennsylvania, and
 - Mitch Marcus
 - USC's Information Sciences Institute
 - Eduard Hovy
 - Robert Belvin

What is OntoNotes? (I)

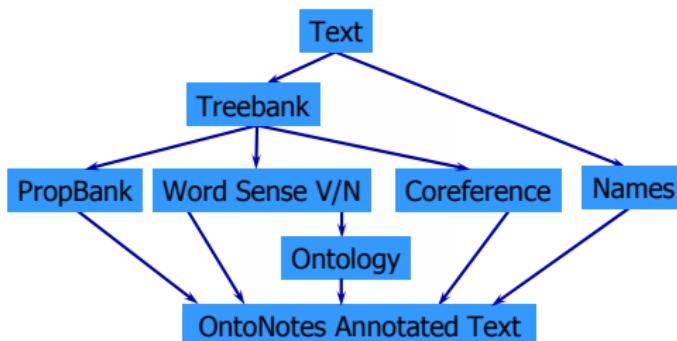
- Multiple layers of annotation

- Syntax
- Propositions
- Word sense
- Coreference
- Names
- Ontology

- Multilingual resource

- English
- Chinese
- Arabic

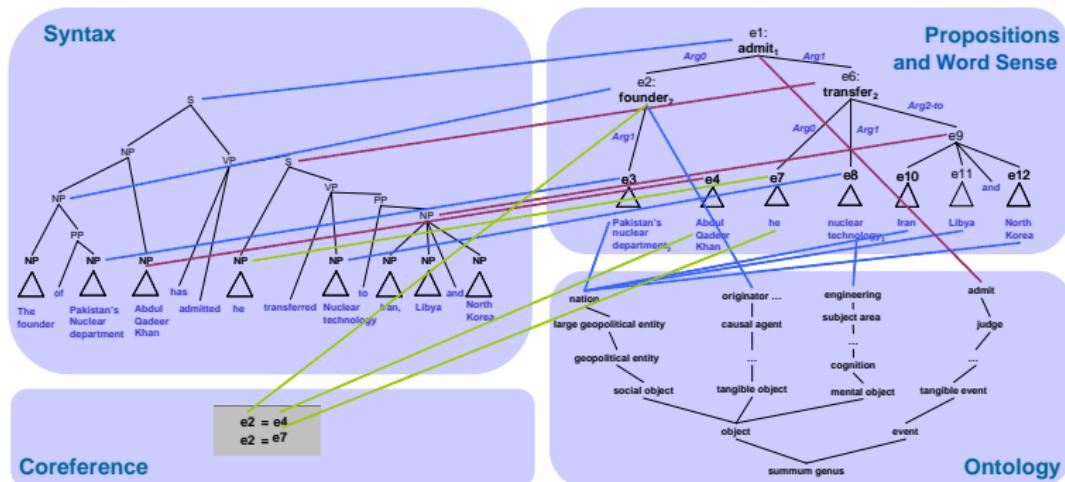
- Parallel Data



What is OntoNotes? (II)

- Skeletal representation of literal meaning
- Find “sweet spot”
 - In depth of representation
 - Inter-Annotator Agreement (~90%)
 - Productivity
- Integrated Representation
- API for ease of use
- Distribute data widely through LDC

The Grand View



The Founder of Pakistan's nuclear department, Abdul Qadeer Khan, has admitted he transferred nuclear technology to Iran, Libya and North Korea.

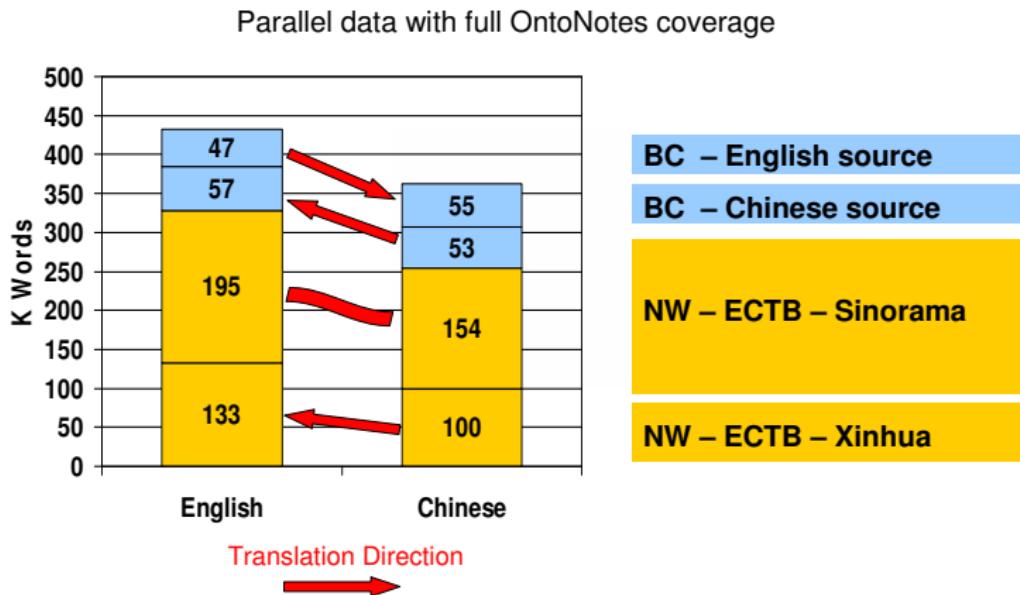
Amount of Data

OntoNotes 3.0

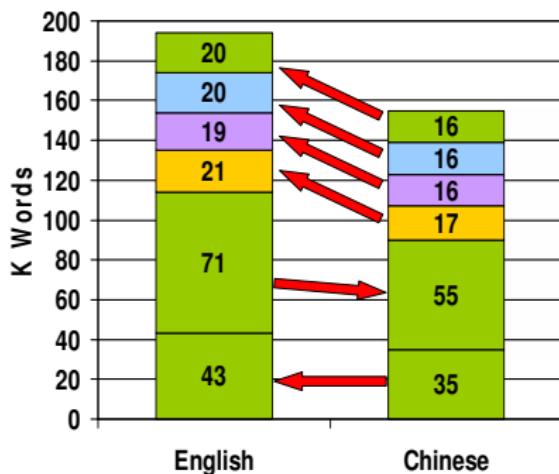
	NW	BN	BC
English	500	200	200
Chinese	250	300	150
Arabic	200		

(K Words)

Parallel Data Quantities: Full OntoNotes



Parallel Data Quantities: Only Treebank



Issues with Parallel Data

- Trade-offs
 - Translated data may not be predictive of the language as a whole
 - Translated versions of informal genres might end-up more text-like
- Issues
 - Long lead time involved
 - Data selection and translation
 - Treebanking
 - Propbanking, Word Sense, Coreference

An Example (Document)

And one of the longest running struggles for international justice reached a milestone today of sorts, when a Scottish court, meeting in the Netherlands, finally officially found someone guilty in the 1988 bombing that brought down Pan Am Flight 103. ...

A split decision for Lamen Khalifa Fhimah, acquittal, but Abdel Basset Ali Al-megrahi found guilty as charged. ...

The court ruled this senior Libyan intelligence agent planted the bomb that killed 270, mostly Americans, when the plane bound for New York exploded over Lockerbie, Scotland.

Example (Names)

The court ruled this senior Libyan intelligence agent planted the bomb that killed 270, mostly Americans, when the plane bound for New York exploded over Lockerbie, Scotland.

NORP (Nationality, Organization, Religious, Political)

GPE

Cardinal

Example (Parse Tree)

Example (PropBank)

9 planted (PB frame: plant.01)
ARG0 4:1 this senior Libyan intelligence agent
ARG1 10:2 the bomb that *T*-1 killed 270 , mostly
Americans , when the plane bound * for
New York exploded over Lockerbie ,
Scotland *T*-2

Token number
and height in tree

14 killed (PB frame: kill.01)
ARG0 13:0 *T*-1
12:1 that
LINK-SLC 10:1 the bomb
ARG1 15:2 270 , mostly Americans
ARGM-TMP 20:2 when the plane bound * for New York
exploded over Lockerbie , Scotland *T*-2

Example (Word Sense)

Court-N	1: a sovereign regime and its assemblage 2: assembly that transacts judicial business 3: demarcated area for sports play 4: a room in which judicial proceedings occur ... 8: respectful deference
Plant-V	1: place into the ground for growing 2: place firmly 3: place secretly, often for later discovery 4: establish, settle
Kill-V	1: cause death, be fatal 2: cause great pain or anguish 3: eliminate 4: thwart ... 9: drink down

Example (Coreference)

Sentence
and
token
numbers

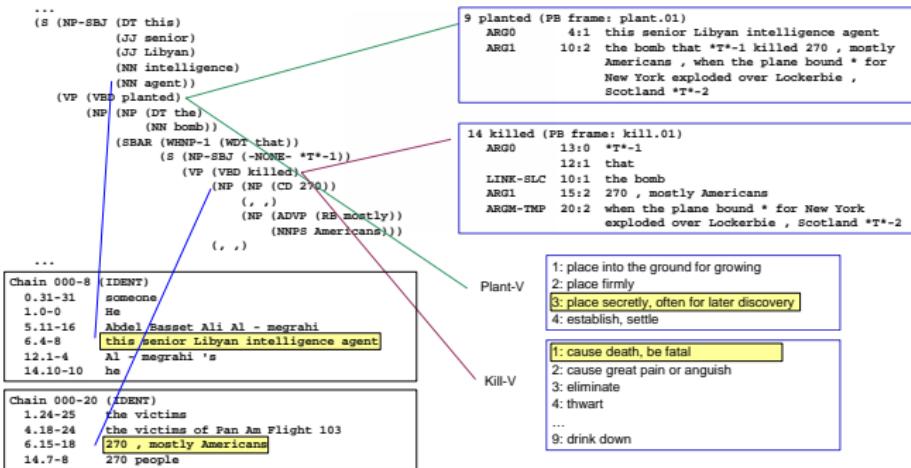
Chain 000-8 (IDENT)
0.31-31 someone
1.0-0 He
5.11-16 Abdel Basset Ali Al - megrahi
6.4-8 **this senior Libyan intelligence agent**
12.1-4 Al - megrahi 's
14.10-10 he

Chain 000-20 (IDENT)
1.24-25 the victims
4.18-24 the victims of Pan Am Flight 103
6.15-18 **270 , mostly Americans**
14.7-8 270 people

Chain 000-9 (IDENT)
0.34-44 the 1988 bombing that *T*-3 brought down
Pan Am Flight 103
6.28-28 **exploded**
20.33-34 this act
22.32-33 this crime

Example (Summary)

The court ruled this senior Libyan intelligence agent planted the bomb that killed 270, mostly Americans, when the plane bound for New York exploded over Lockerbie, Scotland.



Compared to other resources

Annotations	WordNet/ SemCor	Salsa	Prague	OntoNotes
Syntax		✓	✓	✓
Propositions		✓	✓	✓
Sense Tags ITA > 70-80%	✓			✓
Sense Tags ITA > 90%				✓
Coref				✓
> 1M words		✓	✓	✓
Genres		1	1	2+3* *NW, BN, +BC, NG, WebLogs
Languages	1	1	2* *Czech, English,	3* *English, Chinese, Arabic

Annotation Layers

1 Treebank

2 PropBank

3 Word Sense

4 Ontology

5 Coreference

6 Names

Data Access API

7 Challenges with Multiple Layers of Annotation

8 Architecture

9 Raw Data

10 Database Design

11 Python API Design

12 Data Access

Part I

Annotation Layers

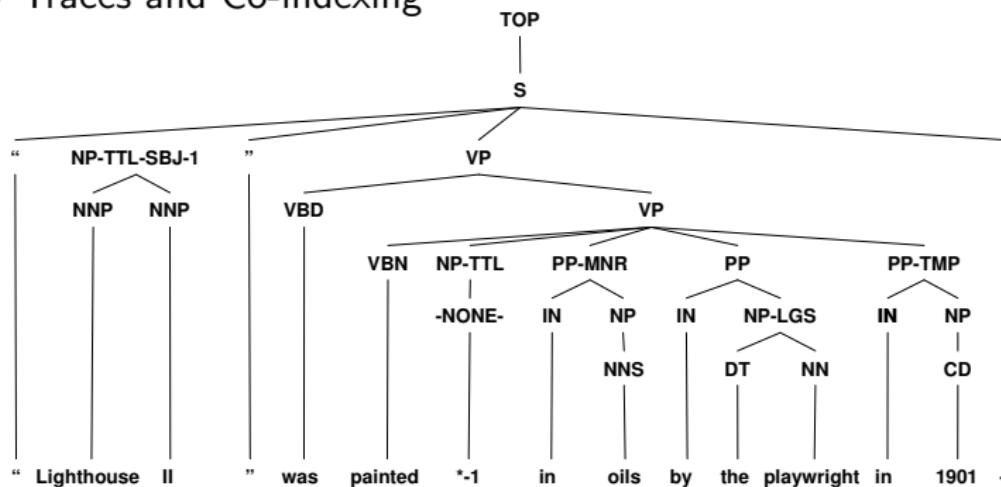
Treebank
PropBank
Word Sense
Ontology
Coreference
Names

Syntactic Structure
English Treebank
Enhancements to the English Treebank
Chinese Treebank

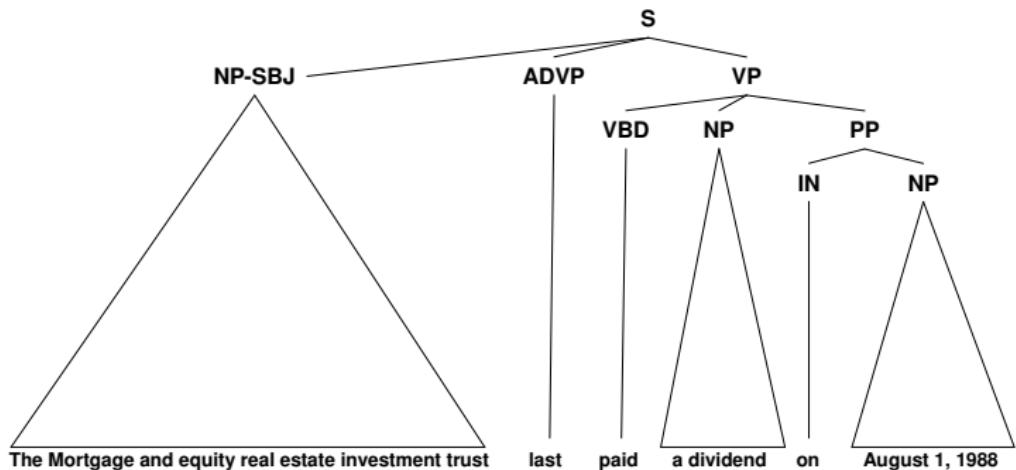
Treebank

Syntactic Structure

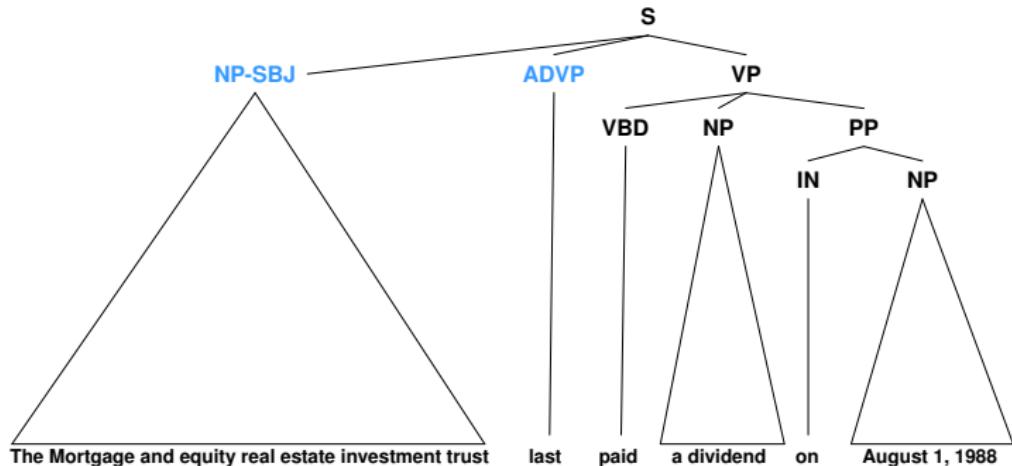
- Phrase Types
- Function Tags
- Traces and Co-indexing



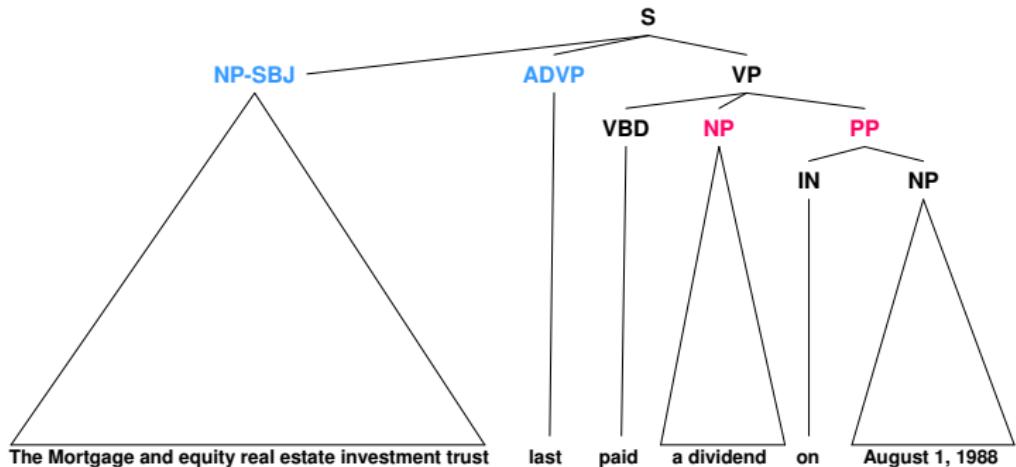
A English Treebank Example



A English Treebank Example



A English Treebank Example

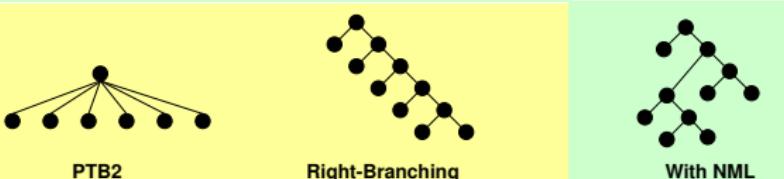


Adding NP internal structure: NMLs

- Penn Treebank 2 left prenominals flat
- NML constituents fill in that structure
 - Assume a default right-branching structure
 - Specify NMLs where necessary

(NP (DT a)
 (NML (CD 10,000) (NN square) (NN meter))
 (NN visitor)
 (NN center))

(NP (DT this)
 (NML (JJ large) (HYPH -) (NN scale))
 (NML (NN light) (CC and) (NN music))
 (NN show)))))))



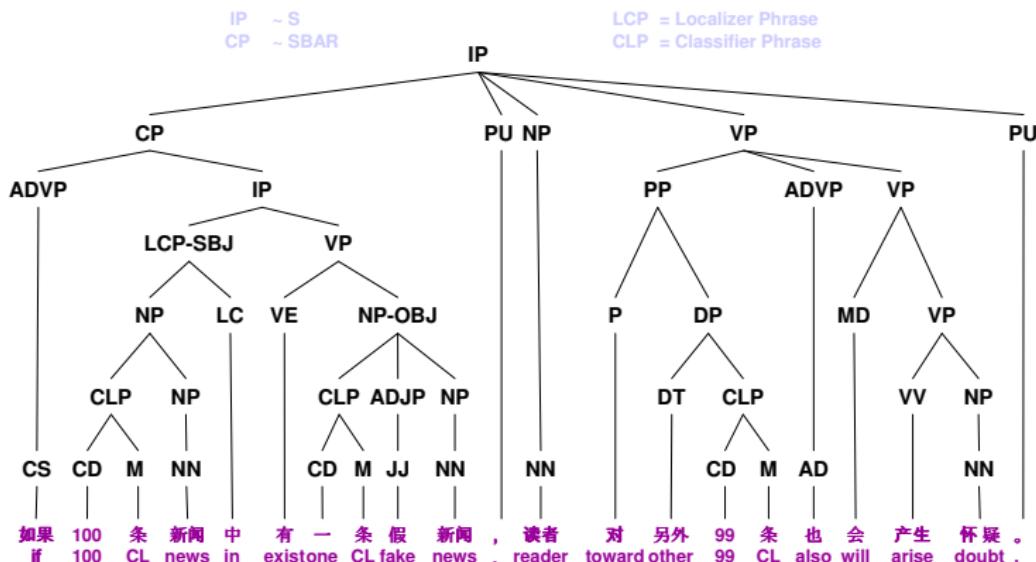
Improving English Treebank Consistency: Hyphenization

- Original treebank did not split any hyphens
- More recent treebanks were not very consistent on which hyphenated tokens were split.
 - This complicates things for parser and parser evaluations
- Trees were revised to split consistently on “most” hyphens
 - Add a GW (goes with) POS tag
 - Covers elements like “co-” in “co-operate”
 - Insert appropriate tree structure over the newly split tokens
 - For any additional layers of existing annotation (including PropBank and Word Sense):
 - Adjust token-based pointers
 - Annotate additional examples in newly-exposed tokens

Chinese Treebanking

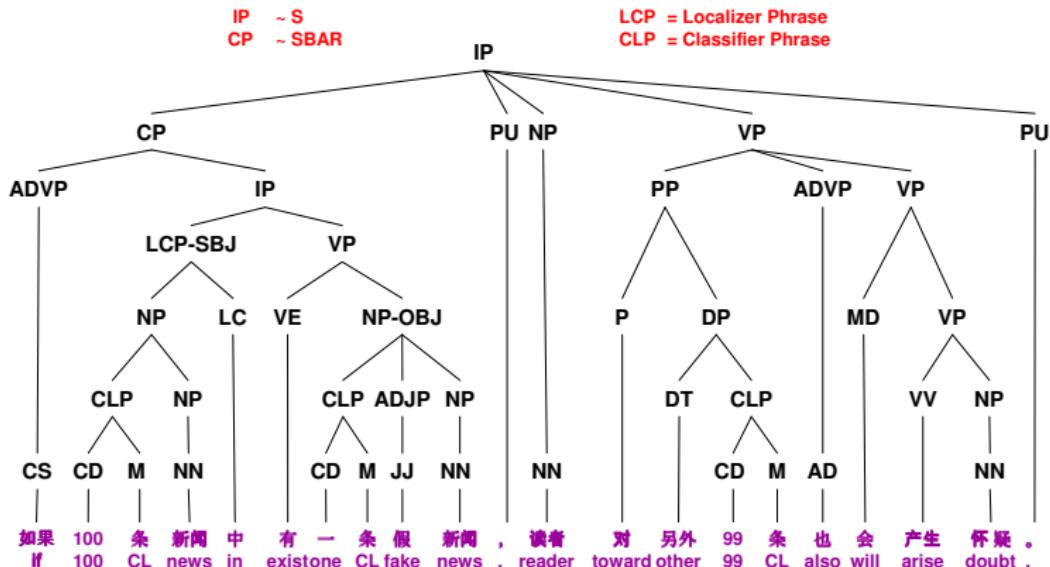
- Penn English Treebank approach
 - Phrase structure annotation
 - Emphasis on trade offs of annotation speed and consistency
 - ITA: 94%
- With enriched structures
 - All structures build on four primitive structures

A Treebanked Chinese Sentence



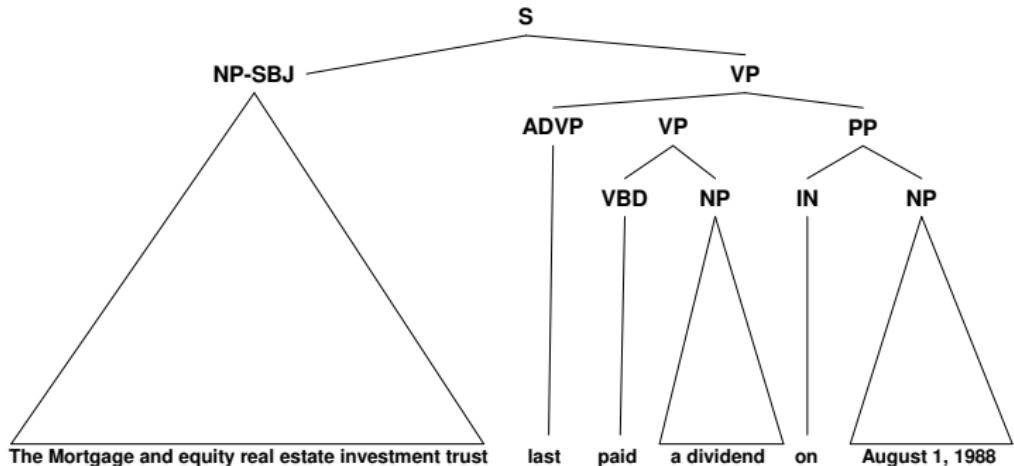
If among the 100 pieces of news one piece is made up, the reader will also doubt the other 99 pieces.

A Treebanked Chinese Sentence

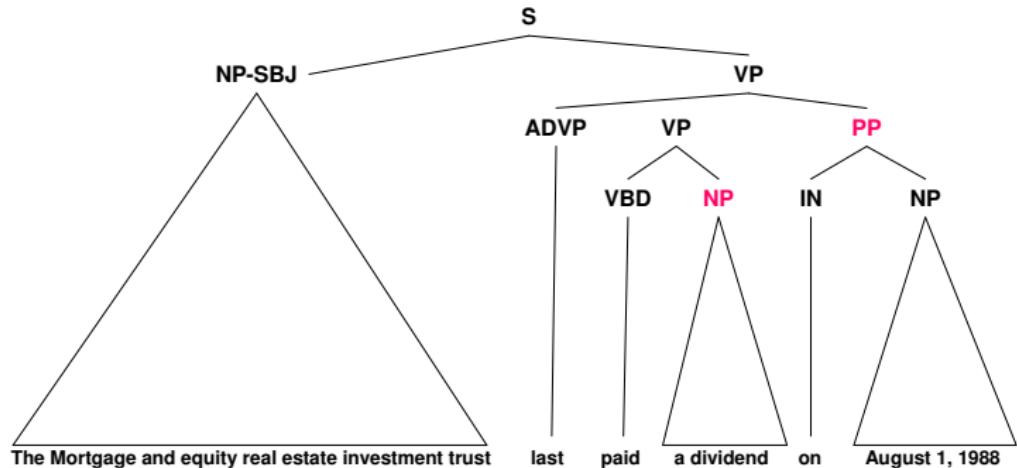


If among the 100 pieces of news one piece is made up, the reader will also doubt the other 99 pieces.

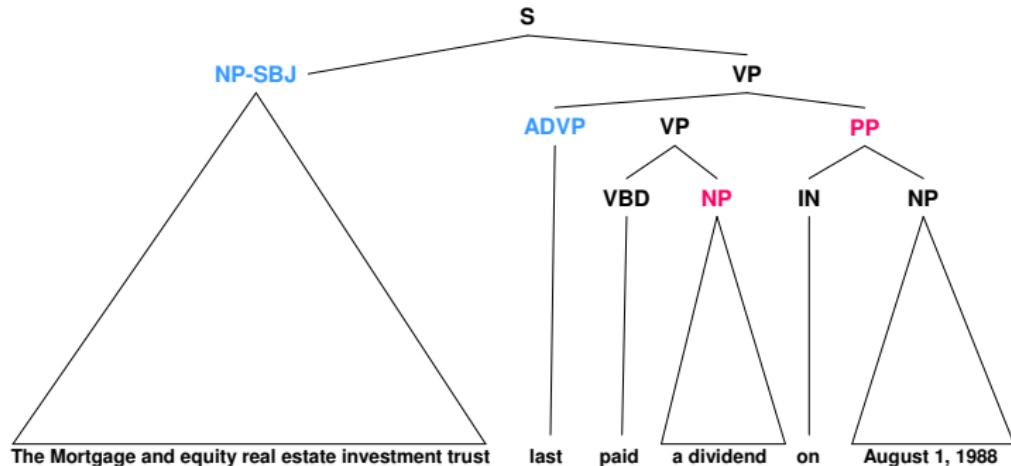
(Hypothetical) Chinese Treebank



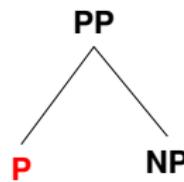
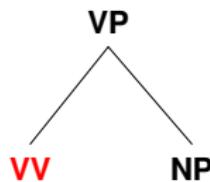
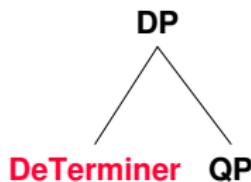
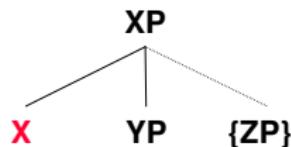
(Hypothetical) Chinese Treebank



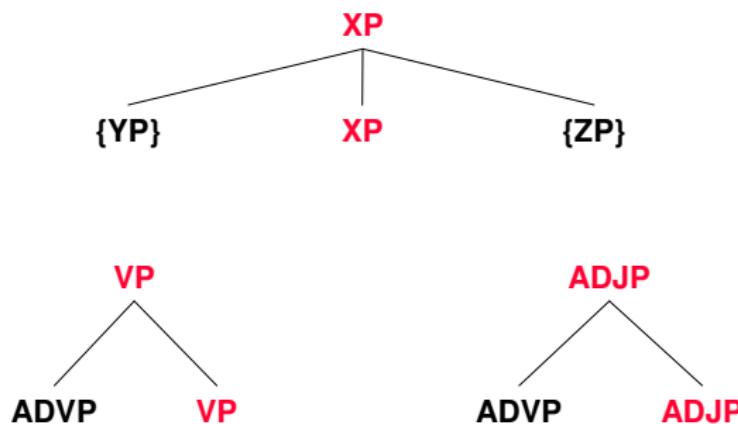
(Hypothetical) Chinese Treebank



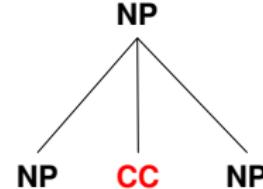
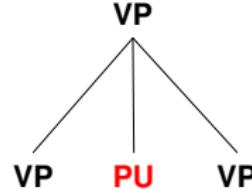
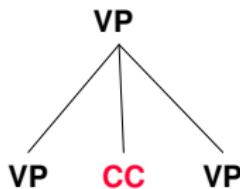
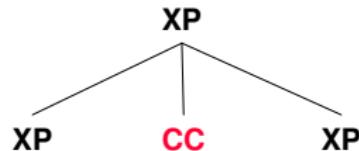
Complementation (left-headed)



Adjunction



Coordination



Treebank
PropBank
Word Sense
Ontology
Coreference
Names

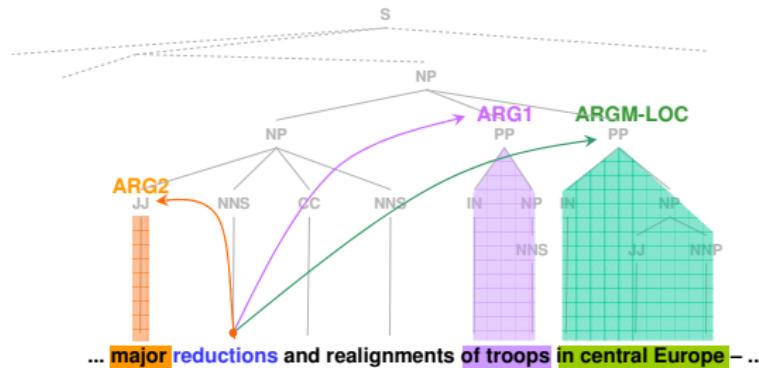
Propositional Structure
Predicate Frames
Predicate Senses
Argument Nomenclature
Annotation Procedure
Chinese PropBank
Treebank and PropBank

PropBank

Propositional Structure

- Tells Who did What to Whom, When, Where, How, etc.
- For both verbs and nouns

Concerns about the pace of the Vienna talks -- which are aimed at the destruction of some 100,000 weapons , as well as major reductions and realignments of troops in central Europe – also are being registered at the Pentagon .



Predicate Frames

- Predicate frames define the meanings of the numbered arguments

Concerns about the pace of the Vienna talks -- which are aimed at the destruction of some 100,000 weapons , as well as major reductions and realignments of troops in central Europe – also are being registered at the Pentagon .

reduce.01 – Make less

ARG0 – Agent	-	
ARG1 – Thing falling	→	of troops
ARG2 – Amount fallen	→	major
ARG3 – Starting point	-	
ARG4 – Ending point	-	

Frame Examples: *expect, replace*

Portfolio managers expect further declines in interest rates

expect.01 – Look forward to; anticipate

ARG0 – Expecter



Portfolio managers

ARG1 – Thing expected



further declines in interest rates

Continental Air replaced its top executive for the sixth time in as many years

replace.01 – substitute

ARG0 – replacer



Continental Air

ARG1 – old thing



Its top executive

ARG2 – new thing



for the sixth time in as many years

Frame Examples: *increase*

Net income increased to \$274 million from \$130 million

increase.01 – go up incrementally

- | | |
|----------------------------|----------------------|
| ARG0 – causer of increase | → - |
| ARG1 – thing increasing | → Net income |
| ARG2 – amount increased by | → - |
| ARG3 – starting point | → from \$130 million |
| ARG4 – end point | → To \$274 million |

Word Senses in PropBank

- Some word sense distinctions do not change the type of argument that a predicate can take, but some do.
- Propbank makes only sense distinctions that necessitate a different argument structure or when the argument have different meaning.
 - Mary left the room
 - If he knew how to handle the finances, I'd leave him lots of money

leave.01 – move away from

ARG0 – entity leaving
ARG1 – place left

leave.02 – give

ARG0 – giver
ARG1 – thing given
ARG2 – beneficiary

Trends in Argument Numbering

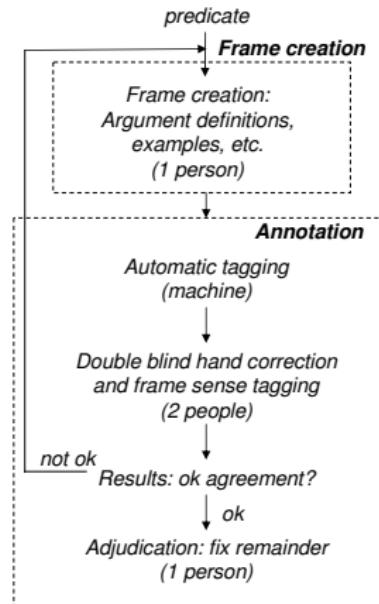
- Arg0 = agent
- Arg1 = direct object/theme/patient
- Arg2 = indirect object/benefactive/instrument/attribute/end state
- Arg3 = start point/benefactive/instrument/attribute
- Arg4 = end point

Consistency for Arg0 and Arg1, but not so much for Arg2, Arg3, ...

Additional tags: ArgMs (arguments or adjuncts?)

- TMP: When?
- LOC: Where at?
- DIR: Where located?
- MNR: How?
- PRP: Why?
- REC: himself, themselves, each other
- PRD: This argument refers to, or modifies another
- ADV: Catch all

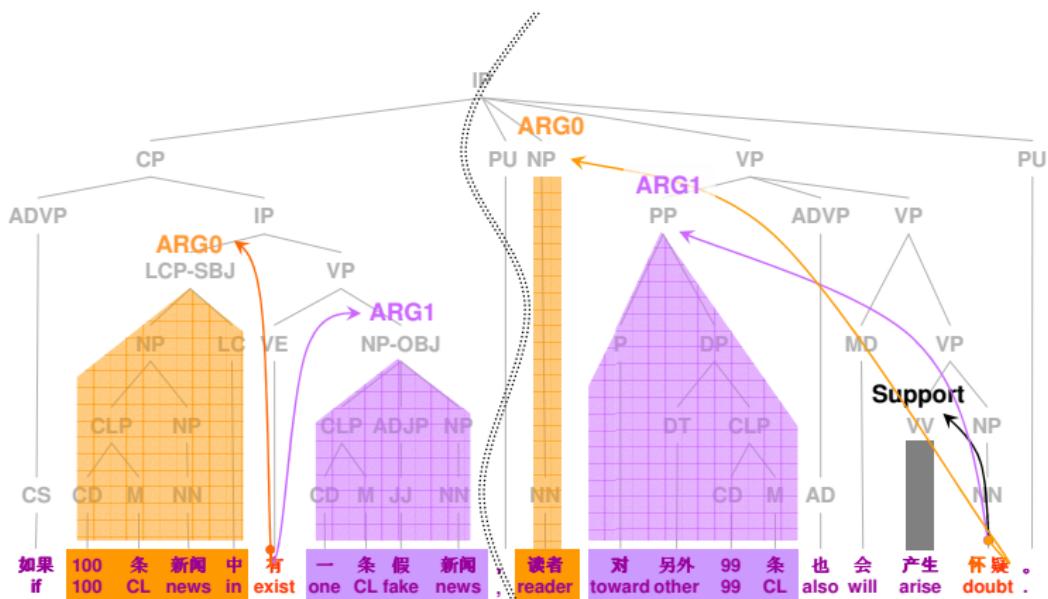
Annotation Procedure



Chinese PropBank

- Similar in style to English PropBank
 - Predicate-specific numbered labels for core arguments
 - ArgM_s for adjunctive arguments
 - Coarse-gained senses
- There are some differences
 - In how split arguments are handled
 - Multi-word expressions are dealt with

Argument structure of verb and noun



If among the 100 pieces of news one piece is made up, the reader will also doubt the other 99 pieces.

Traces and Split Arguments in English PropBank

- Traces

[What matters is what advertisers will pay]-1, **said** *T*-1 Newsweek's chairman

REL: said

Arg1: *T*

Arg0: Newsweek's chairman

- Split Arguments

"What you have to understand," **said** John [*?*], "is that Philly literally stinks."

Arg1: [*?*] → ["What you have to understand"] ["is that Philly literally stinks"]

REL: said

Arg0: John

Traces in Chinese PropBank

目前为止，中国 纺织 工业 承建 *T* 的 最大 项目

now till , Chinese textile industry take on DE largest project

“the largest project that the Chinese textile industry has taken on so far”

ARGM-TMP: 目前为止 “so far”

ARG0: 中国 纺织 工业 “Chinese textile industry”

REL: 承建 “take on”

ARG1: *T* → 最大 项目 “largest project”

Possession

茅台 酒 制作 工艺 复杂 , 生产 周期 长 。

Maotai liquor brewing process complex , production cycle long .

“The brewing process of Maotai Liquor is complex, and its production cycle is long.”

REL: 复杂 “complex”

ARGO-PSR: 茅台酒 “Maotai liquor”

ARGO-PSE: 制作工艺 “brewing process”

REL: 长 “long”

ARGO-PSE: 茅台酒 “Maotai Liquor”

ARGO-PSE: 生产周期 “production cycle”

Possession (II)

三 大 法 典 须 加 快 出 台 进 程 。

Three main law need accelerate promulgation process .

“The promulgation process of the three main laws need to be accelerated.”

PRED: “accelerate”

ARG1-PSR: “three main laws”

ARG1-PSE: “promulgation process”

Predication

西非 经济 明显 恢复 增长。

West African economy clearly resume grow .

“West African economy clearly resumed growing”

ARG0: 西非经济 “West African economy”

PRED: 恢复 “resume”

ARGM-ADV: 明显 “clearly”

ARGO-PRD: 增长 “grow”

Reconciling Treebank and PropBank

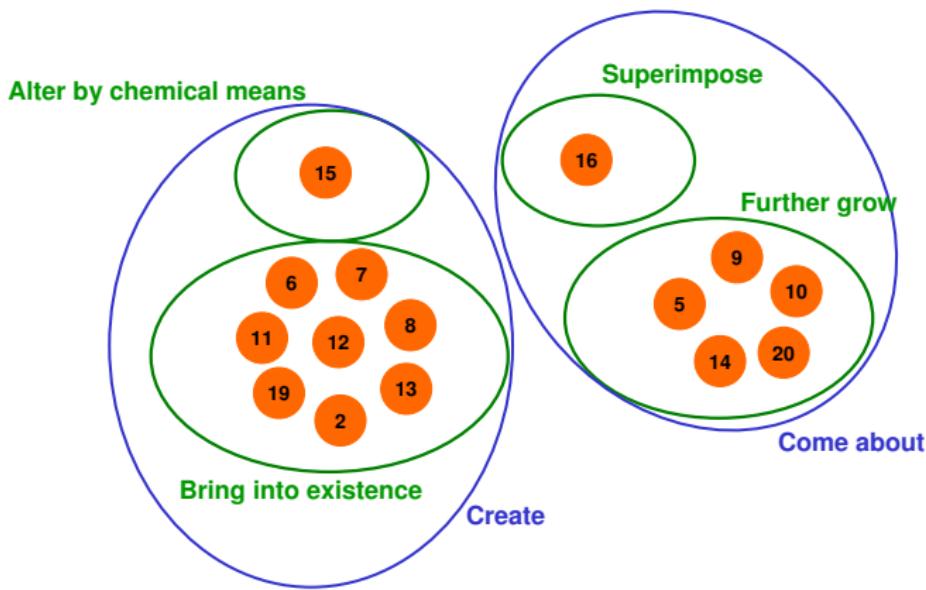
- We found several mismatches between syntax and propositions
 - Sometimes PropBank was right
 - Somethings Treebank was right
- Ambiguities were resolved (PP-attachment)
- Guidelines were modified to bring the two in sync
 - Modified list of verbs that take small-clauses and sentential complements (eg. keep their markets active)
 - A different approach to annotation of empty categories
- Now each argument points to a single node in the tree
 - Secondary connections are made using Treebank trace chains
 - Almost no discontinuous arguments
 - Non-trace connections are explicitly identified as LINK-SLC and LINK-PCR

Treebank
PropBank
Word Sense
Ontology
Coreference
Names

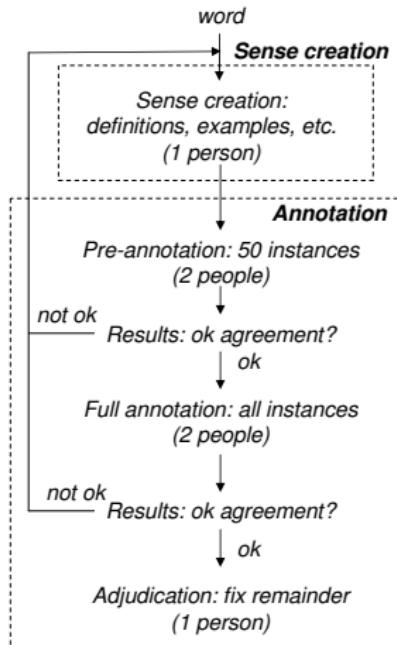
Sense Grouping
Annotation Procedure
Connection to Ontology

Word Sense

WordNet, OntoNotes and PropBank senses for *develop-v*



Sense Annotation Procedure



Word Sense and Ontology

- Meaning of nouns and verbs are specified using a catalog of possible senses
- All the senses are annotatable at ~90% ITA
- Ontology links (currently being added) capture similarities between related senses of different words

Concerns about the pace of the Vienna talks -- which are **aimed** at the destruction of some 100,000 weapons , as well as major reductions and realignments of troops in central Europe – also are being **registered** at the Pentagon .

aim

1. Point or direct object, weapon, at something ...
2. Wish, purpose or intend to achieve something

register

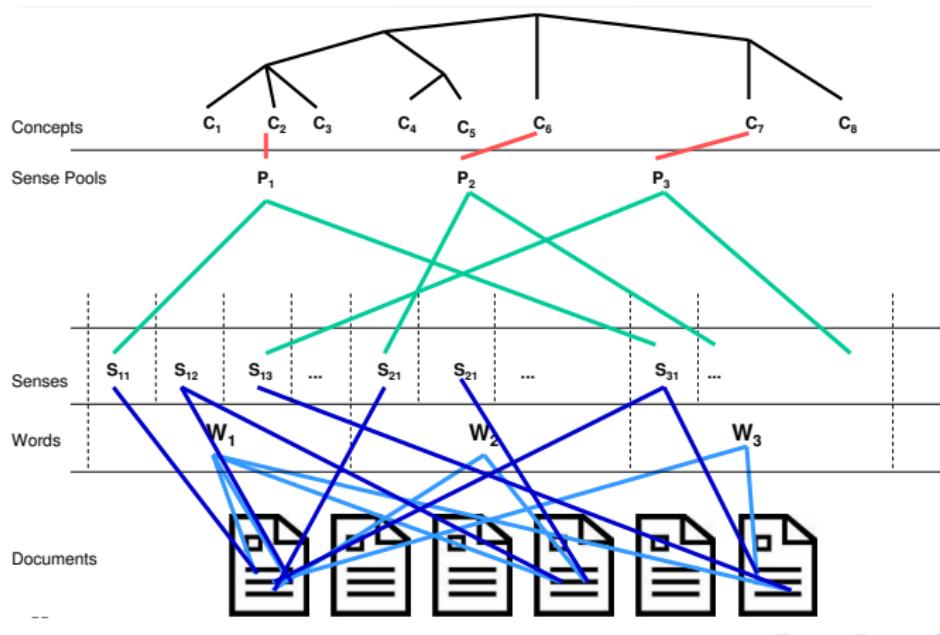
1. Enter into an official record
2. Be aware of, enter into someone's consciousness
3. Indicate a measurement
4. Show in one's face

Treebank
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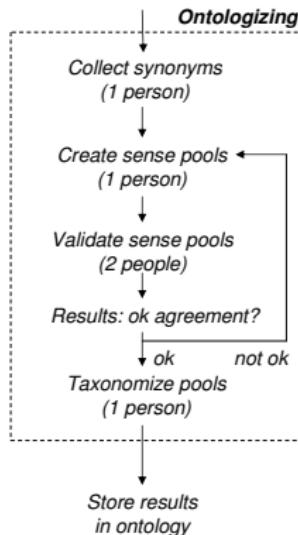
Ontologizing
Annotation Procedure
Structure of the Ontology

Ontology

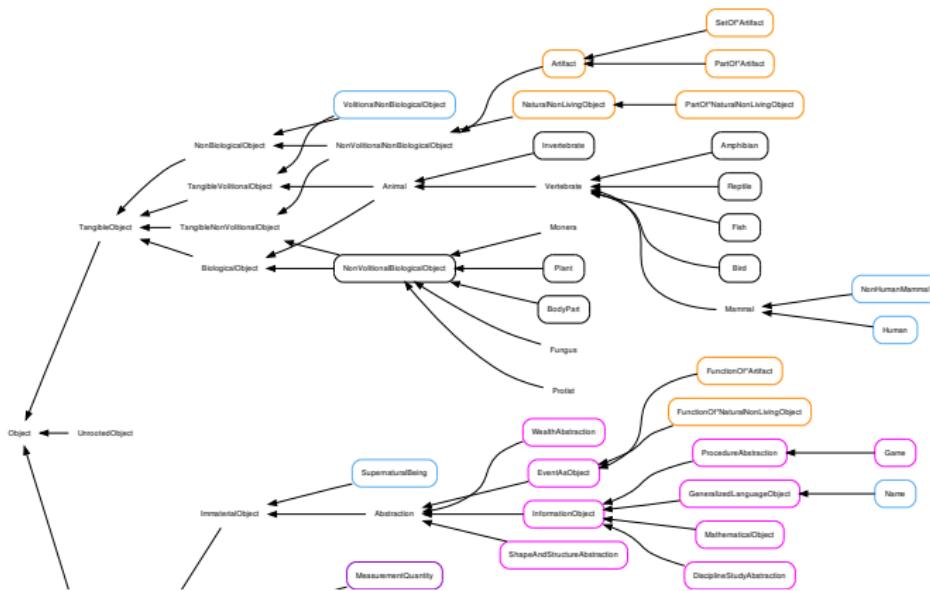
Ontologizing



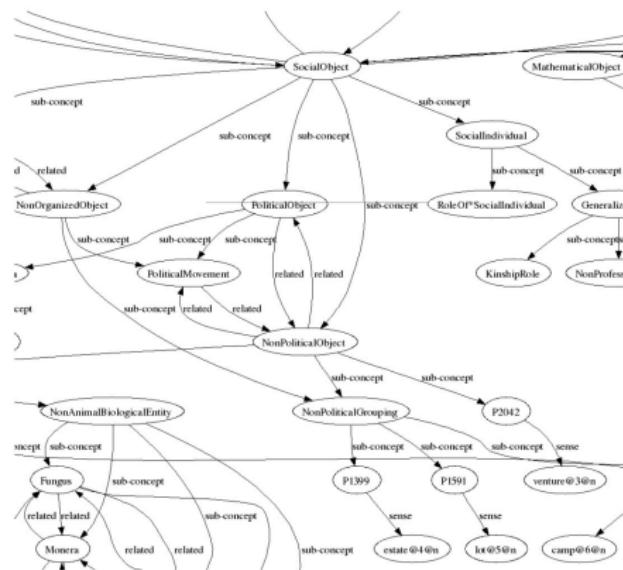
Sense Pooling Procedure



Snapshot of the Upper Model



Snapshot of the Ontology



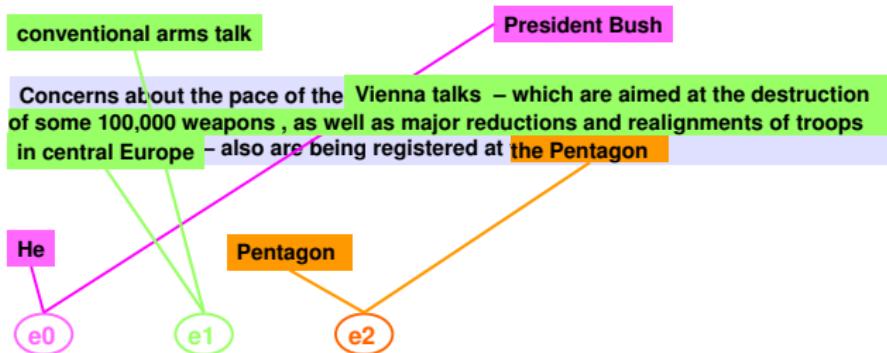
Ontology Structure

- Upper Model
 - 150 concepts
- Sense Pools
 - 3000 Sense Pools
- Links
 - Subtype
 - Related

Coreference

Coreference

- Identifies different mentions of the same entity within a document – especially links definite, referring noun phrases, and pronouns to their antecedents
- Two types tagged - Identity (IDENT) and Attributive (APPOS)



Salient points

- All types of entities, and even events (marked by verbs) are coreferenced
- Barring few exceptions (2%) coreference links are typically restricted to nodes in the syntax trees
- Name, nominal and pronoun mentions are coreferenced
- In *pro-drop* languages like Chinese and Arabic, the "*" or "*pro*" in the tree are tagged with coreference
- Generic, underspecified mentions are **not** coreferenced
- Singleton mentions are **not** coreferenced
- Copulas are not coreferenced with each other
- Only intra-document coreference is marked – When document lengths were prohibitive, they were broken down into parts and individual part independently annotated

Coreference Annotation Examples

- IDENT

- [Elco Industries Inc]_x said [it]_x expects net income to fall below a recent estimate of \$ 1.65 a share. [The Rockford, Ill. maker of fasteners]_x also said that [it]_x expects to post sales in the current fiscal year that are “slightly above” fiscal 1989 sales of \$ 155 million.
- Sales of passenger cars [grew]_x 22 %. [The strong growth]_x followed year-to-year increases.

- APPOS

- [[The PhacoFlex intraocular lens]_{HEAD}, [the first foldable silicone lens available for cataract surgery]_{ATTRIB}]_x

Special Challenges in the Broadcast Conversation Data

• Disfluency Effects

Former Iraqi war combat veteran I guess 0 <disfluency> he 's a -- --
</disfluency> he is a present veteran Paul Hackett

• Ambiguity in speaker turn labels

<Firefighter_A> It began as <disfluency> an- </disfluency> any other day you know
PRO <uncertain> just uh </uncertain> doing eh normal checks .
<Firefighter_B> At nine o'clock we started our shift .
<Firefighter_A> And so the bells went .
<Firefighter_B> It was about a minute past nine when we got the shout for uh
<uncertain> smoke issuing </uncertain> in Allgate tube station *T*-1 .
<Andrew_Carey> The explosion at Allgate was the first of the four bombs 0 *T*-1
to go off on July the seventh at eight fifty in the morning .
<Andrew_Carey> But Paul Kelly Steve Sodbury and Mel Anderson of <uncertain>
Shadwell </uncertain> Firestation 's blue watch had no idea what *T*-1 had
happened as they got into the fire engine *PRO*-2 to answer the call .

Names

Types of Names (I)

- Person – People, including fictional
- NORG – Nationalities, or religious or political groups
- Facility – Buildings, airports, highways, bridges, etc.
- Organization – Companies, agencies, institutions, etc.
- GPE – Countries, cities, states, etc.
- Location – Non-GPE locations, mountain ranges, bodies of water
- Product – Vehicles, weapons, foods, etc.
- Event – Named hurricanes, battles, wars, etc.
- Work of Art – Titles of books, songs, etc.

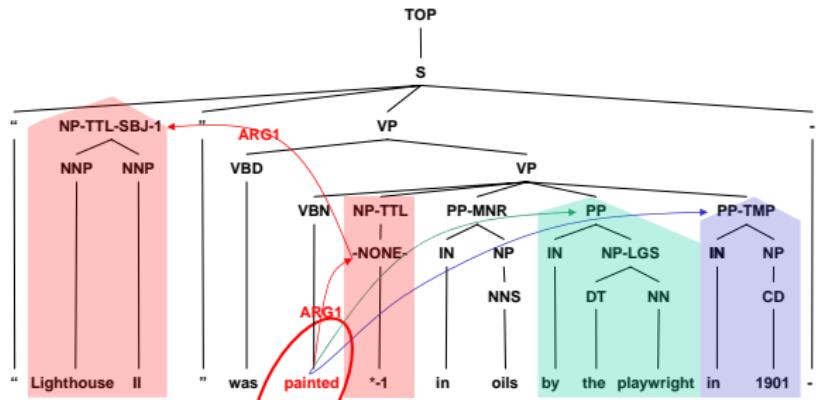
Types of Names (II)

- Law – Named documents made into law
- Language – Any named language
- Date – Absolute or relative dates or periods
- Time – Times smaller than a day
- Percent – Percentage
- Money – Monetary values – including unit
- Quantity – Measurements as of weight and distance
- Ordinal – “First”, “Second”, etc.
- Cardinal – Numerals that do not fall under another type

Part II

Integrated representation

Interpreting Tree pointers in Propositions



```

wsj_00/wsj_0037.mrg 67 5 gold set.02 ---- 0:2-ARG0 5:0-rel 6:1-ARG1 10:2-ARGM-TMP
wsj_00/wsj_0037.mrg 68 5 gold paint.01 ---- 5:0-rel 1:1*6:0-ARG1 8:1-ARG2-in 10:1-ARG0-by 12:1-ARGM-TMP
wsj_00/wsj_0037.mrg 69 21 gold exchange.01 ---- 17:2-ARG0 21:0-rel 22:1-ARG1 23:1-ARGM-TMP
wsj_00/wsj_0037.mrg 69 35 gold say.01 ---- 31:1-ARG0 35:0-rel 0:2*37:0-ARG1
  
```

Interpreting Argument meaning and constraints

```
wsj_0037.mrg 67 5 gold set.02 ----- 0:2-ARG0 5:0-rel 6:1-ARG1 10:2-ARGM-TMP
wsj_0037.mrg 68 5 paint.01 5:0-rel 1:1'6:0-ARG1 8:1-ARG2-in 10:1-ARG0 12:1-ARGM-TMP
wsj_0037.mrg 69 21 gold exchange.01 ----- 17:2-ARG0 21:0-rel 22:1-ARG1 23:1-ARGM-TMP
wsj_0037.mrg 69 35 gold say.01 ----- 31:1-ARG0 35:0-rel 0:2'37:0-ARG1
```

```
<!DOCTYPE frameset SYSTEM "frameset.dtd">
<frameset>
  <predicate lemma="paint">
    <note>
      Frames file for 'paint' based on sentences in wsj and automatic expansion via verbnet.
    </note>
    <roleset id="paint.01" name="put paint on a surface" vncls="25.1">
      <roles>
        <role descr="agent, painter" n="0"> <vnrole vncls="25.1" vntheta="Agent" /></role>
        <role descr="surface" n="1"><vnrole vncls="25.1" vntheta="Destination" /></role>
        <role descr="explicit mention of paint" n="2" > <vnrole vncls="25.1" vntheta="Theme" /> </role>
      </roles>
    </roleset>
  </frameset>
</frameset>
```

Interpreting Sense Numbers and their mappings

PRO Judging from the Americana in Haruki Murakami 's “ A Wild Sheep Chase ”
(Kodansha , 320 pages, \$18.95 *U*) , baby boomers on both sides of the Pacific
have a lot in common .

wsj/00/wsj_0037.mrg	0 1	judge-v	2	Sense Number
wsj/00/wsj_0037.mrg	0 36	lot-n	1	

```
<?xml version="1.0" ?>
<!DOCTYPE inventory SYSTEM "inventory.dtd">
<inventory lemma="judge-v">
  <sense group="1" n="1" name="act as an official judge">
    <examples> She was asked to judge the fancy-dress competition. </examples>
    <mappings> <wn version="2.1">1,5</wn> <pb>judge.01</pb> </mappings>
  </sense>
  <sense group="1" n="2" name="form an opinion, or conclusion">
    <examples> They quickly judged him unfit to join the team. </examples>
    <mappings> <wn version="2.1">2,3,4</wn> <pb>judge.01</pb> </mappings>
  </sense>
</inventory>
```

Challenge with Multiple Layers of Annotation

- **Not** previously available
 - A number of these layers have not been available in significant quantity before:
 - Word Sense
 - Coreference
- **Not** previously integrated
- **Not** previously completely consistent
- **Not** previously easily accessible
 - Raw text format
- **Not** user friendly

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A Solution: Unified Representation

- Provide a bare-bones representation independent of the individual semantics that can
 - Efficiently capture intra-and inter-layer semantics
 - Maintain component independence
 - Provide mechanism for flexible integration
 - Integrate information at the lowest level of granularity
 - Robust to superficial changes in representations
- A Relational Database + Object Oriented API

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Modes of Data Access

- SQL queries can extract examples based on multiple layers or define new views
- Python Object-Oriented API allows for programmatic access to tables and queries
- And, the raw text files as well

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Advantages of Integrated Representation

- Each layer translates into a common representation
- Clean consistent Layers
- Well defined relationships – The Database scheme defines the merged structure efficiently
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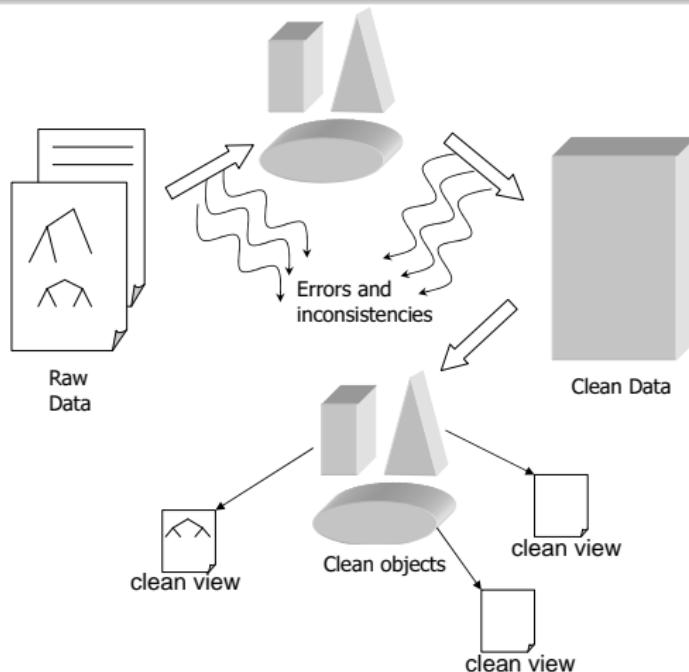
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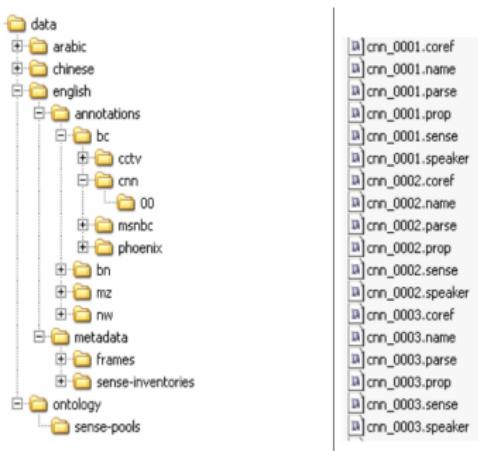
Data Lifecycle



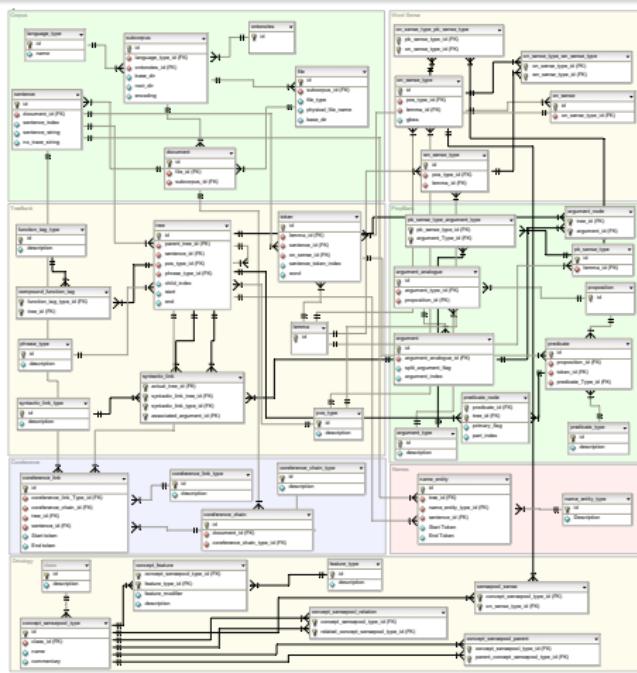
Organization of the OntoNotes data

```
.../data/<lang>/annotations/<genre>/<source>/<section>/<filename>.<extension>  
.../data/<lang>/metadata/<inventory-type>/<filename>.xml
```

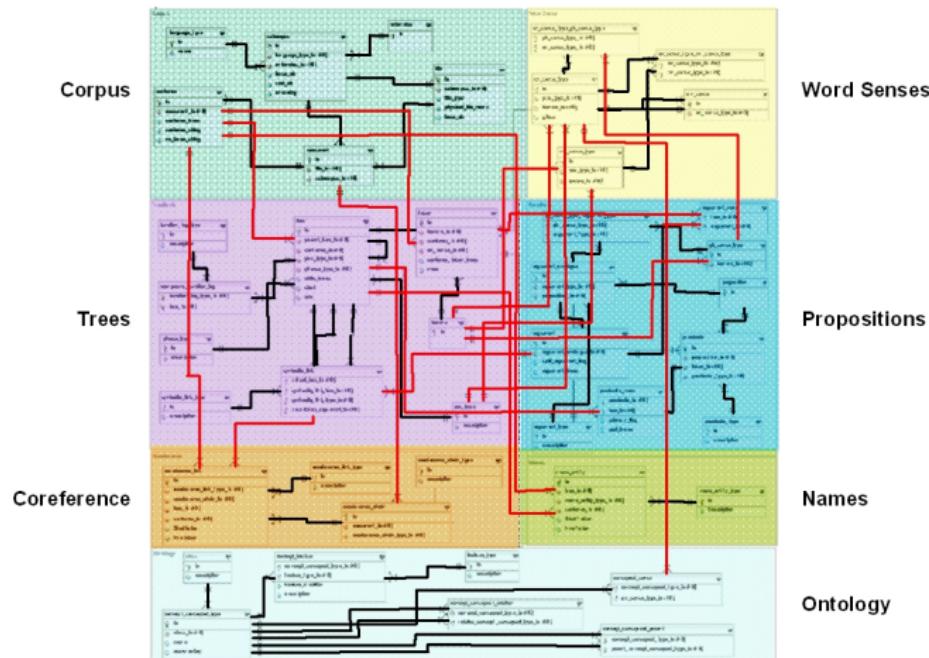
```
<extension> ::= ("parse" | "prop" | "sense" | "coref" | "name" | "parallel" | "speaker")  
<inventory-type> ::= ("frames" | "sense-inventories")
```



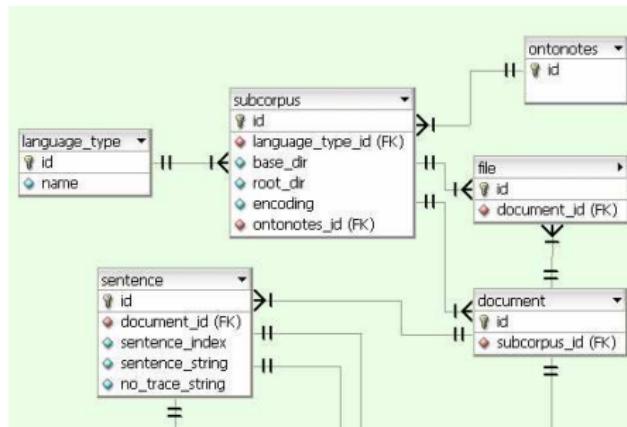
Entity Relationship Diagram (I)



Entity Relationship Diagram (II)

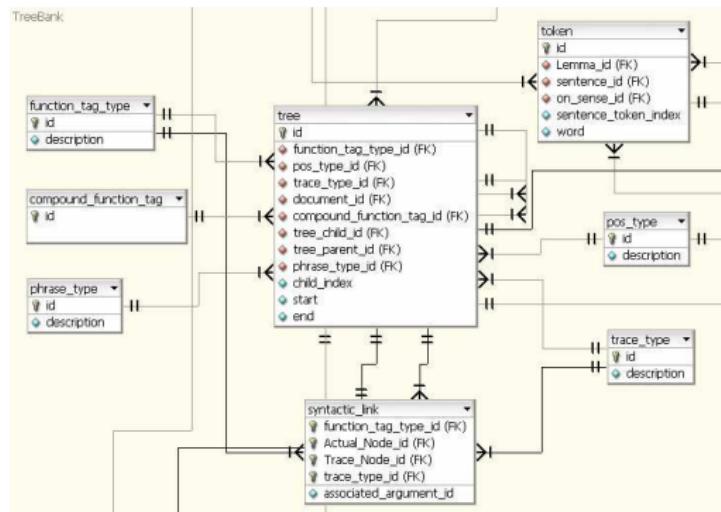


Corpus Tables



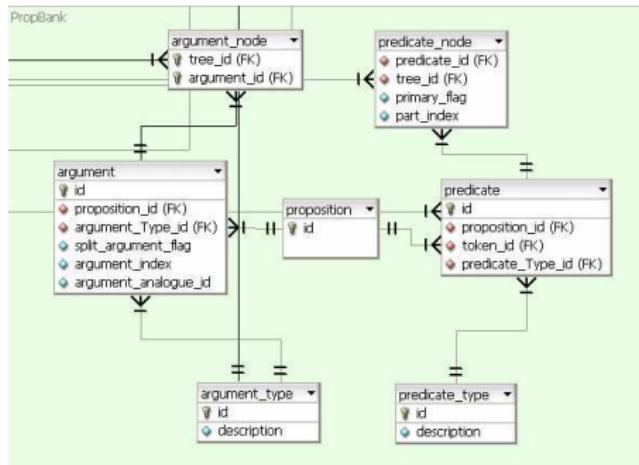
- The corpus tables collectively manage information about the corpus – specifically the subcorpora, documents, files, etc.

Treebank Tables



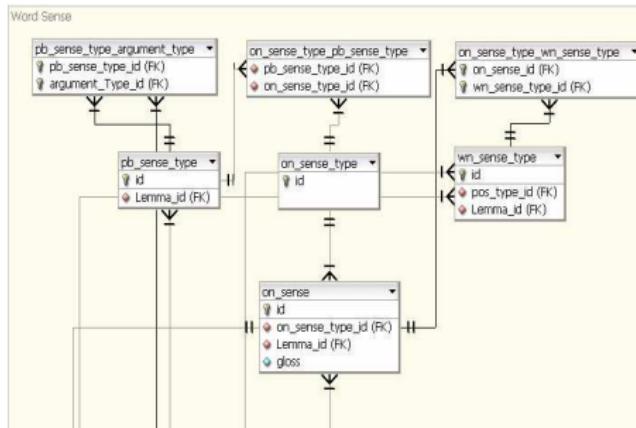
- The treebank tables manage the syntactic tree information. Tokens form the lowest level of granularity in OntoNotes.

PropBank Tables



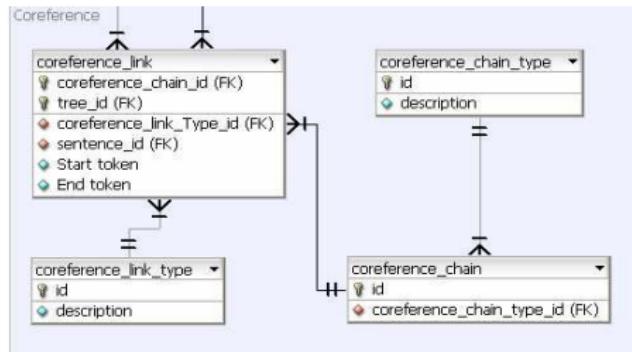
- The proposition tables manage the propositions. The argument_node forms a composite table to manage many-to-many argument/node relationships

Word Sense Tables



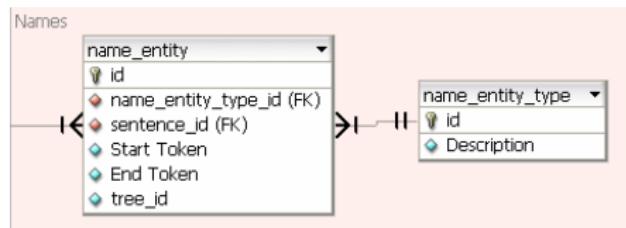
- The sense tables contain the lemma and sense number representing its sense
- Multiple composite tables are used to map WordNet sense, OntoNotes sense and Frame senses to each other

Coreference Tables



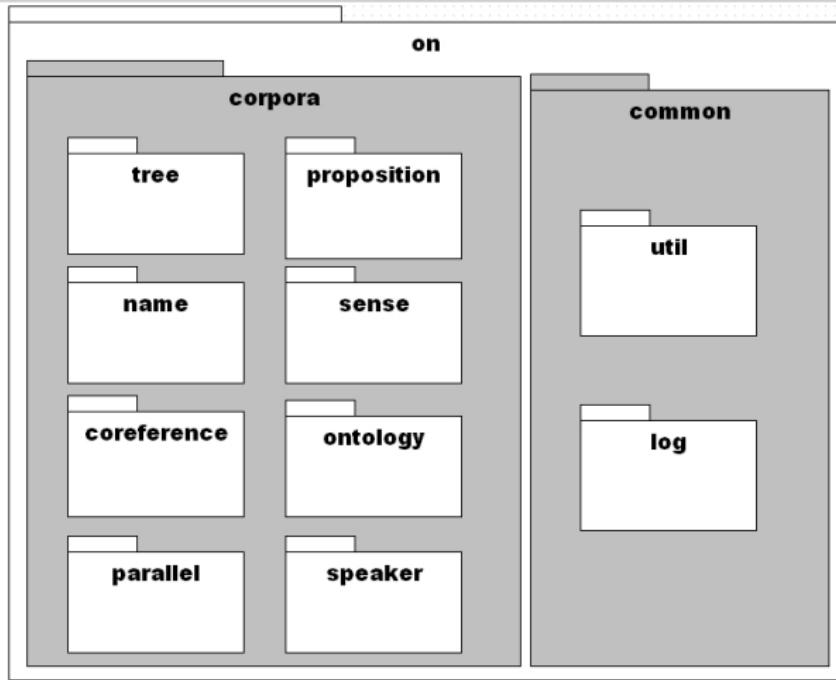
- The `coreference_chain` and `coreference_link` tables store the respective pointers.

Name Tables

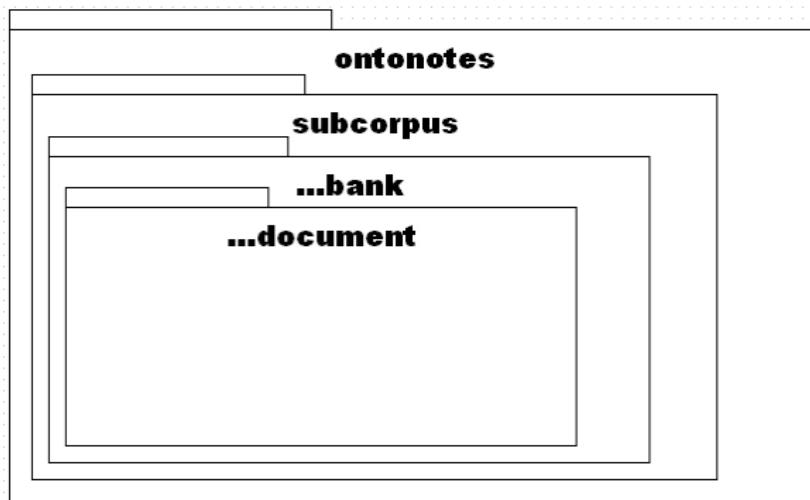


- The name_entity and name_type tables represent the names in the corpus

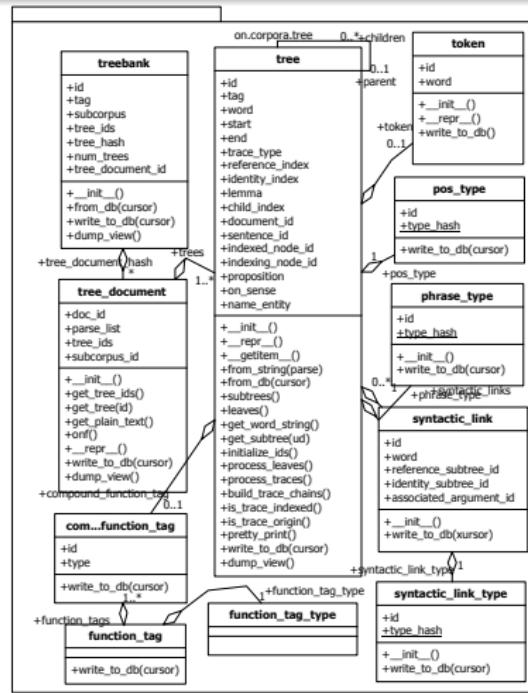
Module Organization



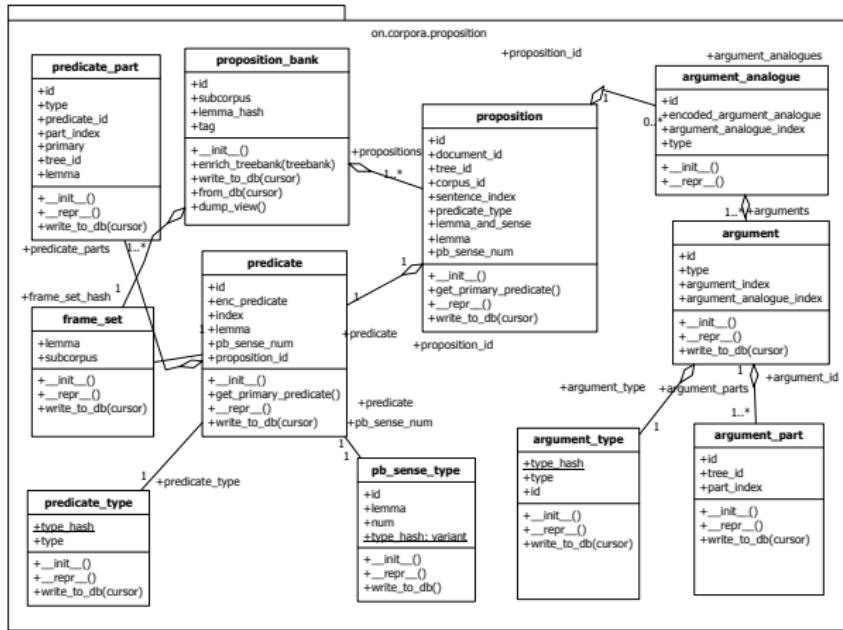
Object Composition



on.corpora.tree



on.corpora.proposition



Salient Methods

- Every bank has a `enrich_treebank` method which takes a `treebank` object and aligns itself to the trees
- Almost every object has a `from_db` and `write_to_db` method which can create itself from the database, or serialize itself to the database
- The SQL statements for reading/writing to DB are class attributes of most classes

Banks

DB Tables \Leftrightarrow Python Objects \Leftrightarrow File Elements

Bank Name	Database Table	Python Module	Extention
tree	tree	on.corpora.tree	.parse
sense	on_sense	on.corpora.sense	.sense
proposition	argument, predicate	on.corpora.proposition	.prop
coreference	coreference_link	on.corpora.coreference	.coref
name	name_entity	on.corpora.name	.name
speaker	speaker_sentence	on.corpora.speaker	.speaker
parallel	parallel_sentence, parallel_document	on.corpora.parallel	.parallel

Treebank

DB Tables \Leftrightarrow Python Objects \Leftrightarrow File Elements

Database Tables	Python Objects	File Elements
treebank	treebank	All <code>.parse</code> files for a <code>on.corpora.subcorpus</code>
None	tree_document	A <code>.parse</code> file
tree	tree	An S-expression in a <code>.parse</code> file
syntactic_link	syntactic_link	The numbers after '-' and '=' in trees
lemma	lemma	<code>.lemma</code> files (arabic only)

PropBank

DB Tables \Leftrightarrow Python Objects \Leftrightarrow File Elements

Database Tables	Python Objects	File Elements
proposition_bank	proposition_bank	All .prop files in an <code>on.corpora.subcorpus</code>
None	proposition_document	A single .prop file
proposition	proposition	A line in a .prop file, with everything after the ----- an "argument field"
None	predicate_analogue	REL argument fields (should only be one)
None	argument_analogue	ARG argument fields
None	link_analogue	LINK argument fields
predicate	predicate	Asterisk-separated components of a predicate_analogue. Each part is coreferential.
argument	argument	Asterisk-separated components of an argument_analogue. Each part is coreferential.
proposition_link	link	Asterisk-separated components of a link_analogue. Each part is coreferential.
predicate_node	predicate_node	Comma-separated components of predicates. The parts together make up the predicate.
argument_node	argument_node	Comma-separated components of arguments. The parts together make up the argument.
link_node	link_node	Comma-separated components of links. The parts together make up the link.
None	frame_set	An xml frame file (FF)
pb_sense_type	on.corpora.sense.pb_sense_type	Field six of a prop line and a FF's frameset/predicate/roleset element's id attribute
pb_sense_type_argument_type	argument_composition	For a FF's frameset/predicate element, a mapping between



Word Sense

DB Tables \Leftrightarrow Python Objects \Leftrightarrow File Elements

Database Tables	Python Objects	File Elements
sense_bank	sense_bank	All .sense files in a <code>on.corpora.subcorpus</code>
None	<code>sense_tagged_document</code>	A single .sense file
on_sense	on_sense	A line in a .sense file
None	<code>sense_inventory</code>	A sense inventory xml file (SI)
on_sense_type	on_sense_type	Fields four and six of a sense line and the <code>inventory/sense</code> element of a SI
on_sense_lemma_type	on_sense_lemma_type	The <code>inventory/its</code> element of a SI
wn_sense_type	wn_sense_type	The <code>inventory/sense/mappings/wn</code> element of a SI
pb_sense_type	pb_sense_type	The <code>inventory/sense/mappings/pb</code> element of a SI
tree	<code>on.corpora.tree.tree</code>	The first three fields of a sense line

Coreference

DB Tables \Leftrightarrow Python Objects \Leftrightarrow File Elements

Database Tables	Python Objects	File Elements
coreference_bank	coreference_bank	All .coref files in an <code>on.corpora.subcorpus</code>
None	coreference_document	A .coref file (a <code>DOC</code> span)
tree.coreference_section	on.corpora.tree.tree.coref_section	An annotation section of a .coref file (a <code>TEXT</code> span)
tree	on.corpora.tree.tree	A line in a .coref file
coreference_chain	coreference_chain	All <code>COREF</code> spans with a given <code>ID</code>
coreference_chain.type	coreference_chain.type	The <code>TYPE</code> field of a coreference link (the same for all links in a chain)
coreference_link	coreference_link	A single <code>COREF</code> span
coreference_link.type	coreference_link.type	The <code>SUBTYPE</code> field of a coreference link

Name

DB Tables \Leftrightarrow Python Objects \Leftrightarrow File Elements

Database Tables	Python Objects	File Elements
name_bank	name_bank	All .name files in an <code>on.corpora.subcorpus</code>
None	name_tagged_document	A .name file
tree	on.corpora.tree.tree	A line in a .name file
name_entity	name_entity	A single ENAMEX, TIMEX, or NUMEX span
None	name_entity_set	All name_entity instances for one on.corpora.tree.tree

Inventories

DB Tables \Leftrightarrow Python Objects \Leftrightarrow File Elements

Database Tables	Python Objects	File Elements
sense_bank	sense_bank	All .sense files in a <code>on.corpora.subcorpus</code>
None	sense_tagged_document	A single .sense file
on_sense	on_sense	A line in a .sense file
None	sense_inventory	A sense inventory xml file (SI)
on_sense_type	on_sense_type	Fields four and six of a sense line and the inventory/sense element of a SI
on_sense_lemma_type	on_sense_lemma_type	The inventory/ita element of a SI
wn_sense_type	wn_sense_type	The inventory/sense/mappings/wn element of a SI
pb_sense_type	pb_sense_type	The inventory/sense/mappings/pb element of a SI
tree	on.corpora.tree.tree	The first three fields of a sense line

Parallel

DB Tables \Leftrightarrow Python Objects \Leftrightarrow File Elements

Database Tables	Python Objects	File Elements
None	<code>parallel_bank</code>	All <code>.parallel</code> files in an <code>on.corpora.subcorpus</code>
<code>parallel_document</code>	<code>parallel_document</code>	The second line (original/translation line) in a <code>.parallel</code> file
<code>parallel_sentence</code>	<code>parallel_sentence</code>	All lines in a <code>.parallel</code> file after the first two (map lines)

Speaker

DB Tables \Leftrightarrow Python Objects \Leftrightarrow File Elements

Database Tables	Python Objects	File Elements
None	<code>speaker_bank</code>	All <code>.speaker</code> files in an <code>on.corpora.subcorpus</code>
None	<code>speaker_document</code>	A <code>.speaker</code> file
<code>speaker_sentence</code>	<code>speaker_sentence</code>	A line in a <code>.speaker</code> file

Configuration File

- Sections of the Configuration

- [corpus]**

- `data_in: [</path/to/data>]`
- `load: (<lang>-<genre> | <lang>-<genre>-<source>)+`
- `prefix: (<prefix>)*`
- `suffix: (<suffix>)*`
- `granularity: <granularity>`
- `banks: (<bank>)+`
- `ignore-inventories: (<inventory>)*`

- [db]**

- `db: <ontonotes-database-name>`
- `server: <your-mysql-server-address>`
- `db-user: <your-mysql-username>`

```
<lang> ::= ("english" | "chinese" | "arabic")           <genre> ::= ("nw" | "bn" | "mz" | "bc")
<source> ::= ("wsj" | "cnn" | "msnbc" | "xinhua" | ...)
<bank> ::= ("parse" | "prop" | "sense" | "coref" | "name" | "parallel" | "speaker")
<inventory> ::= ("senses" | "frames")                  <granularity> ::= ("file" | "source" | "genre")
<prefix> ::= <digit>+                                <suffix> ::= <digit>+
```

A Sample Configuration

[corpus]

A Sample Configuration

```
[corpus]
data_in      : /corpora/ontonotes/v3/data
```

A Sample Configuration

```
[corpus]
data_in      : /corpora/ontonotes/v3/data
load         : english-nw-wsj chinese-bc
```

A Sample Configuration

```
[corpus]
data_in      : /corpora/ontonotes/v3/data
load         : english-nw-wsj chinese-bc
prefix       : 02 03
```

A Sample Configuration

```
[corpus]
data_in      : /corpora/ontonotes/v3/data
load         : english-nw-wsj chinese-bc
prefix       : 02 03
suffix       :
```

A Sample Configuration

```
[corpus]
data_in      : /corpora/ontonotes/v3/data
load         : english-nw-wsj chinese-bc
prefix       : 02 03
suffix       :
granularity : file
```

A Sample Configuration

```
[corpus]
data_in      : /corpora/ontonotes/v3/data
load         : english-nw-wsj chinese-bc
prefix       : 02 03
suffix       :
granularity : file
banks        : parse prop sense
```

A Sample Configuration

```
[corpus]
data_in      : /corpora/ontonotes/v3/data
load         : english-nw-wsj chinese-bc
prefix       : 02 03
suffix       :
granularity : file
banks        : parse prop sense
ignore-inventories : senses frames
```

```
[db]
```

A Sample Configuration

```
[corpus]
data_in      : /corpora/ontonotes/v3/data
load         : english-nw-wsj chinese-bc
prefix       : 02 03
suffix       :
granularity : file
banks        : parse prop sense
ignore-inventories : senses frames

[db]
db          : ontonotes_v3
```

A Sample Configuration

```
[corpus]
data_in      : /corpora/ontonotes/v3/data
load         : english-nw-wsj chinese-bc
prefix       : 02 03
suffix       :
granularity : file
banks        : parse prop sense
ignore-inventories : senses frames

[db]
db          : ontonotes_v3
server     : ontonotes.bbn.com
```

A Sample Configuration

```
[corpus]
data_in      : /corpora/ontonotes/v3/data
load         : english-nw-wsj chinese-bc
prefix       : 02 03
suffix       :
granularity : file
banks        : parse prop sense
ignore-inventories : senses frames

[db]
db          : ontonotes_v3
server     : ontonotes.bbn.com
db-user   : ontonotes
```

Configuration File

```
[corpus]
data_in          : data
load             : english-nw-wsj
granularity      : source
banks            : parse coref sense name prop parallel speaker
ignore-inventories: senses frames
```

Challenges with Multiple Layers of Annotation
Architecture
Raw Data
Database Design
Python API Design
Data Access

Configuration
Creating ontonotes
Exploring Various Layers
Exploring Parallel Connections
Advanced Topics
Cross-Layer Query

Reading the Configuration

Reading the Configuration

In [1]: import on

Reading the Configuration

```
In [1]: import on
In [2]: import on.common.util
```

Reading the Configuration

```
In [1]: import on
In [2]: import on.common.util
In [3]: c = on.common.util.load_config("config.example")
```

Reading the Configuration

```
In [1]: import on
In [2]: import on.common.util
In [3]: c = on.common.util.load_config("config.example")
In [4]: c
```

Reading the Configuration

```
In [1]: import on
In [2]: import on.common.util
In [3]: c = on.common.util.load_config("config.example")
In [4]: c
Out[4]: <on.common.util.FancyConfigParser instance at 0x82c4c4c>
```

Reading the Configuration

```
In [1]: import on
In [2]: import on.common.util
In [3]: c = on.common.util.load_config("config.example")
In [4]: c
Out[4]: <on.common.util.FancyConfigParser instance at 0x82c4c4c>

In [5]: c.sections()
```

Reading the Configuration

```
In [1]: import on
In [2]: import on.common.util
In [3]: c = on.common.util.load_config("config.example")
In [4]: c
Out[4]: <on.common.util.FancyConfigParser instance at 0x82c4c4c>

In [5]: c.sections()
Out[5]: ['corpus']
```

Reading the Configuration

```
In [1]: import on
In [2]: import on.common.util
In [3]: c = on.common.util.load_config("config.example")
In [4]: c
Out[4]: <on.common.util.FancyConfigParser instance at 0x82c4c4c>

In [5]: c.sections()
Out[5]: ['corpus']

In [7]: c["corpus", "banks"]
```

Reading the Configuration

```
In [1]: import on
In [2]: import on.common.util
In [3]: c = on.common.util.load_config("config.example")
In [4]: c
Out[4]: <on.common.util.FancyConfigParser instance at 0x82c4c4c>

In [5]: c.sections()
Out[5]: ['corpus']

In [7]: c["corpus", "banks"]
Out[7]: 'parse coref sense name parallel prop speaker'
```

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Creating the ontonotes Object

Creating the ontonotes Object

```
In [9]: o = ontonotes(c)
```

Creating the ontonotes Object

```
In [9]: o = on.ontonotes(c)
Loading english nw wsj
.....
found 4 files in the subcorpus all@wsj@nw@en@on
```

Creating the ontonotes Object

```
In [9]: o = on.ontonotes(c)
Loading english nw wsj
.....
found 4 files in the subcorpus all@wsj@nw@en@on
```

```
In [10]: o
```

Creating the ontonotes Object

```
In [9]: o = on.ontonotes(c)
Loading english nw wsj
.....
found 4 files in the subcorpus all@wsj@nw@en@on
```

```
In [10]: o
Out[10]:
ontonotes instance, id=on, subcorpora:
[0] : all@wsj@nw@en@on
```

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```
In [6]: c["corpus", "granularity"] = "file"
```

```
In [6]: c["corpus", "granularity"] = "file"
```

```
In [8]: o = on.ontonotes(c)
```

```
In [6]: c["corpus", "granularity"] = "file"
```

```
In [8]: o = on.ontonotes(c)
```

```
Loading english nw wsj
```

```
.....
```

```
found 1 file in the subcorpus 0089@wsj@nw@en@on
```

```
.....
```

```
found 1 file in the subcorpus 0020@wsj@nw@en@on
```

```
.....
```

```
found 1 file in the subcorpus 0049@wsj@nw@en@on
```

```
.....
```

```
found 1 file in the subcorpus 0037@wsj@nw@en@on
```

```
In [6]: c["corpus", "granularity"] = "file"
```

```
In [8]: o = on.ontonotes(c)
```

```
Loading english nw wsj
```

```
.....
```

```
found 1 file in the subcorpus 0089@wsj@nw@en@on
```

```
.....
```

```
found 1 file in the subcorpus 0020@wsj@nw@en@on
```

```
.....
```

```
found 1 file in the subcorpus 0049@wsj@nw@en@on
```

```
.....
```

```
found 1 file in the subcorpus 0037@wsj@nw@en@on
```

```
In [14]: o
```

```
In [6]: c["corpus", "granularity"] = "file"
```

```
In [8]: o = on.ontonotes(c)
```

```
Loading english nw wsj
```

```
.....
```

```
found 1 file in the subcorpus 0089@wsj@nw@en@on
```

```
.....
```

```
found 1 file in the subcorpus 0020@wsj@nw@en@on
```

```
.....
```

```
found 1 file in the subcorpus 0049@wsj@nw@en@on
```

```
.....
```

```
found 1 file in the subcorpus 0037@wsj@nw@en@on
```

```
In [14]: o
```

```
Out[14]:
```

```
ontonotes instance, id=on, subcorpora:
```

```
[0] : 0089@wsj@nw@en@on
```

```
[1] : 0020@wsj@nw@en@on
```

```
[2] : 0049@wsj@nw@en@on
```

Loading the banks

Loading the banks

```
In [11]: s = o[0]
```

Loading the banks

```
In [11]: s = o[0]
```

```
Loading banks for all@wsj@nw@en@on: parse, coref, sense, name, parallel, prop, speaker ...
reading the treebank [parse] ..... 233 trees in the treebank
reading the coreference bank [coref] .....
Enriching parse with coref ...
```

Loading the banks

```
In [11]: s = o[0]
```

```
Loading banks for all@wsj@nw@en@on: parse, coref, sense, name, parallel, prop, speaker ...
reading the treebank [parse] ..... 233 trees in the treebank
reading the coreference bank [coref] .....
Enriching parse with coref ...
```

```
reading the sense bank [sense] .....
```

```
Enriching parse with sense ...
```

```
....
```

Loading the banks

In [11]: s = o[0]

```
Loading banks for all@wsj@nw@en@on: parse, coref, sense, name, parallel, prop, speaker ...
reading the treebank [parse] ..... 233 trees in the treebank
reading the coreference bank [coref] .....
Enriching parse with coref ...
```

```
reading the sense bank [sense] .....
```

```
Enriching parse with sense ...
```

```
....
```

```
reading the name bank [name].....
```

```
Enriching parse with name ...
```

```
....
```

```
reading the parallel bank [parallel] ...keys: ['parse', 'prop', 'coref', 'name', 'sense']
```

Loading the banks

In [11]: s = o[0]

```
Loading banks for all@wsj@nw@en@on: parse, coref, sense, name, parallel, prop, speaker ...
reading the treebank [parse] ..... 233 trees in the treebank
reading the coreference bank [coref] .....
Enriching parse with coref ...
```

```
reading the sense bank [sense] .....
```

```
Enriching parse with sense ...
```

```
....
```

```
reading the name bank [name].....
```

```
Enriching parse with name ...
```

```
....
```

```
reading the parallel bank [parallel] ...keys: ['parse', 'prop', 'coref', 'name', 'sense']
```

```
reading the proposition bank [prop] .....
```

```
Enriching parse with prop ...
```

```
....
```

```
reading the speaker bank [speaker] ...keys: ['parse', 'prop', 'coref', 'name', 'sense']
```

Loading the banks

In [11]: s = o[0]

```
Loading banks for all@wsj@nw@en@on: parse, coref, sense, name, parallel, prop, speaker ...
reading the treebank [parse] ..... 233 trees in the treebank
reading the coreference bank [coref] .....
Enriching parse with coref ...
```

```
reading the sense bank [sense] .....
Enriching parse with sense ...
```

....

```
reading the name bank [name].....
Enriching parse with name ...
```

....

```
reading the parallel bank [parallel] ...keys: ['parse', 'prop', 'coref', 'name', 'sense']
```

```
reading the proposition bank [prop] .....
Enriching parse with prop ...
```

....

```
reading the speaker bank [speaker] ...keys: ['parse', 'prop', 'coref', 'name', 'sense']
```

Not enriching parse with speaker because we have no documents

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Inside the subcorpus

Inside the subcorpus

In [12]: s

Inside the subcorpus

```
In [12]: s
Out[12]:
subcorpus instance, id=all@wsj@nw@en@on, banks:
[ coref] : gold@all@wsj@nw@en@on
[document] : gold@all@wsj@nw@en@on
[ name] : gold@all@wsj@nw@en@on
[parallel] : gold@all@wsj@nw@en@on
[ parse] : gold@all@wsj@nw@en@on
[ prop] : gold@all@wsj@nw@en@on
[ sense] : gold@all@wsj@nw@en@on
[ speaker] : gold@all@wsj@nw@en@on
```

Inside the subcorpus

```
In [12]: s
Out[12]:
subcorpus instance, id=all@wsj@nw@en@on, banks:
[ coref] : gold@all@wsj@nw@en@on
[document] : gold@all@wsj@nw@en@on
[ name] : gold@all@wsj@nw@en@on
[parallel] : gold@all@wsj@nw@en@on
[ parse] : gold@all@wsj@nw@en@on
[ prop] : gold@all@wsj@nw@en@on
[ sense] : gold@all@wsj@nw@en@on
[ speaker] : gold@all@wsj@nw@en@on
```

- Accessing the same again does not read from the disk because it uses `weakref`

Inside the subcorpus

```
In [12]: s
Out[12]:
subcorpus instance, id=all@wsj@nw@en@on, banks:
[ coref] : gold@all@wsj@nw@en@on
[document] : gold@all@wsj@nw@en@on
[ name] : gold@all@wsj@nw@en@on
[parallel] : gold@all@wsj@nw@en@on
[ parse] : gold@all@wsj@nw@en@on
[ prop] : gold@all@wsj@nw@en@on
[ sense] : gold@all@wsj@nw@en@on
[ speaker] : gold@all@wsj@nw@en@on
```

- Accessing the same again does not read from the disk because it uses `weakref`

```
In [14]: s = o[0]
```

Inside the subcorpus

```
In [12]: s
Out[12]:
subcorpus instance, id=all@wsj@nw@en@on, banks:
[ coref] : gold@all@wsj@nw@en@on
[document] : gold@all@wsj@nw@en@on
[ name] : gold@all@wsj@nw@en@on
[parallel] : gold@all@wsj@nw@en@on
[ parse] : gold@all@wsj@nw@en@on
[ prop] : gold@all@wsj@nw@en@on
[ sense] : gold@all@wsj@nw@en@on
[ speaker] : gold@all@wsj@nw@en@on
```

- Accessing the same again does not read from the disk because it uses `weakref`

```
In [14]: s = o[0]
In [15]
```

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Exploring Coreference Data

Exploring Coreference Data

```
In [13]: c_bank = s["coref"]
```

Exploring Coreference Data

```
In [13]: c_bank = s["coref"]
```

```
In [15]: c_bank
```

Exploring Coreference Data

```
In [13]: c_bank = s["coref"]
```

```
In [15]: c_bank
```

```
Out[15]:
```

```
coreference_bank instance, id=gold@all@wsj@nw@en@con, documents:  
[0] : nw/wsj/00/wsjs_0020@all@wsj@nw@en@con  
[1] : nw/wsj/00/wsjs_0037@all@wsj@nw@en@con  
[2] : nw/wsj/00/wsjs_0049@all@wsj@nw@en@con  
[3] : nw/wsj/00/wsjs_0089@all@wsj@nw@en@con
```

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In [17]: c_doc

```
In [17]: c_doc
Out[17]:
coreference_document, id=nw/wsj/00/wsj_0020@all@wsj@nw@en@on, coreference_chains

[ 0] : APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[ 1] : APPOS@000-57@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[ 2] : IDENT@000-10@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[ 3] : IDENT@000-12@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[ 4] : IDENT@000-25@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[ 5] : IDENT@000-2@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[ 6] : IDENT@000-30@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[ 7] : IDENT@000-33@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[ 8] : IDENT@000-36@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[ 9] : IDENT@000-38@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
...
...
[22] : IDENT@000-7@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[23] : IDENT@000-9@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
```

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In [21]: c_chain = c_doc[0]

```
In [21]: c_chain = c_doc[0]  
In [22]: c_chain
```

```
In [21]: c_chain = c_doc[0]
In [22]: c_chain
Out[22]:
coreference chain instance, id=APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on, links:
[0] : ATTRIB@1:2:4@APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[1] : HEAD@1:6:14@APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
```

```
In [21]: c_chain = c_doc[0]
```

```
In [22]: c_chain
```

```
Out[22]:
```

```
coreference chain instance, id=APPOS@000-52@000@nw/wsj/00/ws_j_0020@all@wsj@nw@en@on, links:  
[0] : ATTRIB@1:2:4@APPOS@000-52@000@nw/wsj/00/ws_j_0020@all@wsj@nw@en@on  
[1] : HEAD@1:6:14@APPOS@000-52@000@nw/wsj/00/ws_j_0020@all@wsj@nw@en@on
```

```
In [24]: c_link_0 = c_chain[0]
```

```
In [21]: c_chain = c_doc[0]
In [22]: c_chain
Out[22]:
coreference chain instance, id=APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on, links:
[0] : ATTRIB@1:2:4@APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[1] : HEAD@1:6:14@APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on

In [24]: c_link_0 = c_chain[0]

In [25]: c_link_1 = c_chain[1]
```

```
In [21]: c_chain = c_doc[0]
In [22]: c_chain
Out[22]:
coreference chain instance, id=APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on, links:
[0] : ATTRIB@1:2:4@APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[1] : HEAD@1:6:14@APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on

In [24]: c_link_0 = c_chain[0]

In [25]: c_link_1 = c_chain[1]

In [26]: c_link_0
```

```
In [21]: c_chain = c_doc[0]
```

```
In [22]: c_chain
```

```
Out[22]:
```

```
coreference chain instance, id=APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on, links:  
[0] : ATTRIB@1:2:4@APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on  
[1] : HEAD@1:6:14@APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
```

```
In [24]: c_link_0 = c_chain[0]
```

```
In [25]: c_link_1 = c_chain[1]
```

```
In [26]: c_link_0
```

```
Out[26]: <coreference_link object: id: ATTRIB@1:2:4@APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@...;  
type: ATTRIB --- 'five other countries'>
```

```
In [21]: c_chain = c_doc[0]
In [22]: c_chain
Out[22]:
coreference chain instance, id=APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on, links:
[0] : ATTRIB@1:2:4@APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[1] : HEAD@1:6:14@APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on

In [24]: c_link_0 = c_chain[0]

In [25]: c_link_1 = c_chain[1]

In [26]: c_link_0
Out[26]: <coreference_link object: id: ATTRIB@1:2:4@APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@...;
type: ATTRIB --- 'five other countries'>

In [27]: c_link_1
```

```
In [21]: c_chain = c_doc[0]
In [22]: c_chain
Out[22]:
coreference chain instance, id=APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on, links:
[0] : ATTRIB@1:2:4@APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[1] : HEAD@1:6:14@APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@nw@en@on

In [24]: c_link_0 = c_chain[0]

In [25]: c_link_1 = c_chain[1]

In [26]: c_link_0
Out[26]: <coreference_link object: id: ATTRIB@1:2:4@APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@...;
type: ATTRIB --- 'five other countries'>

In [27]: c_link_1
Out[27]: <coreference_link object: id: HEAD@1:6:14@APPOS@000-52@000@nw/wsj/00/wsj_0020@all@wsj@...;
type: HEAD --- 'China , Thailand , India , Brazil and Mexico'>
```

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In [32]: c_chain

In [32]: c_chain

Out[32]:

```
coreference chain instance, id=IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on, links:  
[ 0] : IDENT@1:34:38@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 1] : IDENT@3:0:1@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 2] : IDENT@3:10:10@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 3] : IDENT@4:0:0@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 4] : IDENT@6:0:1@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 5] : IDENT@7:19:19@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 6] : IDENT@10:35:36@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 7] : IDENT@17:0:1@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 8] : IDENT@18:0:0@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 9] : IDENT@19:5:6@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[10] : IDENT@20:3:4@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on
```

In [32]: c_chain

Out[32]:

```
coreference chain instance, id=IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on, links:  
[ 0] : IDENT@1:34:38@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 1] : IDENT@3:0:1@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 2] : IDENT@3:10:10@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 3] : IDENT@4:0:0@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 4] : IDENT@6:0:1@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 5] : IDENT@7:19:19@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 6] : IDENT@10:35:36@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 7] : IDENT@17:0:1@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 8] : IDENT@18:0:0@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 9] : IDENT@19:5:6@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[10] : IDENT@20:3:4@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on
```

In [38]: c_link_0 = c_chain[0]

In [32]: c_chain

Out[32]:

```
coreference chain instance, id=IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on, links:  
[ 0] : IDENT@1:34:38@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 1] : IDENT@3:0:1@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 2] : IDENT@3:10:10@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 3] : IDENT@4:0:0@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 4] : IDENT@6:0:1@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 5] : IDENT@7:19:19@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 6] : IDENT@10:35:36@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 7] : IDENT@17:0:1@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 8] : IDENT@18:0:0@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 9] : IDENT@19:5:6@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[10] : IDENT@20:3:4@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on
```

In [38]: c_link_0 = c_chain[0]

In [39]: c_link_1 = c_chain[1]

In [32]: c_chain

Out[32]:

```
coreference chain instance, id=IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on, links:  
[ 0] : IDENT@1:34:38@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 1] : IDENT@3:0:1@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 2] : IDENT@3:10:10@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 3] : IDENT@4:0:0@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 4] : IDENT@6:0:1@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 5] : IDENT@7:19:19@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 6] : IDENT@10:35:36@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 7] : IDENT@17:0:1@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 8] : IDENT@18:0:0@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[ 9] : IDENT@19:5:6@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on  
[10] : IDENT@20:3:4@IDENT@000-10@000@nw/wsj/00/wsj..0020@all@wsj@nw@en@on
```

In [38]: c_link_0 = c_chain[0]

In [39]: c_link_1 = c_chain[1]

In [40]: c_link_2 = c_chain[2]

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In [41]: c_link_0

```
In [41]: c_link_0
Out[41]: <coreference_link object: id: IDENT@1:34:38@IDENT@000-10@000@nw/wsj/00/wsj_0020@all@wsj@...
type: IDENT --- 'U.S. Trade Representative Carla Hills'>
```

```
In [41]: c_link_0
Out[41]: <coreference_link object: id: IDENT@1:34:38@IDENT@000-10@000@nw/wsj/00/wsj_0020@all@wsj@...
type: IDENT --- 'U.S. Trade Representative Carla Hills'>
```

```
In [42]: c_link_1
```

In [41]: c_link_0

Out[41]: <coreference_link object: id: IDENT@1:34:38@IDENT@000-10@000@nw/wsj/00/wsj_0020@all@wsj@...;
type: IDENT --- 'U.S. Trade Representative Carla Hills'>

In [42]: c_link_1

Out[42]: <coreference_link object: id: IDENT@3:0:1@IDENT@000-10@000@nw/wsj/00/wsj_0020@all@wsj@...;
type: IDENT --- 'Mrs. Hills'>

In [41]: c_link_0

Out[41]: <coreference_link object: id: IDENT@1:34:38@IDENT@000-10@000@nw/wsj/00/wsj_0020@all@wsj@...;
type: IDENT --- 'U.S. Trade Representative Carla Hills'>

In [42]: c_link_1

Out[42]: <coreference_link object: id: IDENT@3:0:1@IDENT@000-10@000@nw/wsj/00/wsj_0020@all@wsj@...;
type: IDENT --- 'Mrs. Hills'>

In [43]: c_link_2

In [41]: c_link_0

Out[41]: <coreference_link object: id: IDENT@1:34:38@IDENT@000-10@000@nw/wsj/00/wsj_0020@all@wsj@...;
type: IDENT --- 'U.S. Trade Representative Carla Hills'>

In [42]: c_link_1

Out[42]: <coreference_link object: id: IDENT@3:0:1@IDENT@000-10@000@nw/wsj/00/wsj_0020@all@wsj@...;
type: IDENT --- 'Mrs. Hills'>

In [43]: c_link_2

Out[43]: <coreference_link object: id: IDENT@3:10:10@IDENT@000-10@000@nw/wsj/00/wsj_0020@all@wsj@...;
type: IDENT --- 'she'>

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In [45]: c_link_0. [tab]

In [45]: c_link_0. [tab]

```
c_link_0.__class__.ff_
c_link_0.__delattr__
c_link_0.__dict__
c_link_0.__doc__
c_link_0.__getattribute__
c_link_0.__hash__
c_link_0.__init__
c_link_0.__module__
c_link_0.__new__
c_link_0.__reduce__
c_link_0.__reduce_ex__
c_link_0.__repr__
c_link_0.__setattro_
c_link_0.__str__
c_link_0.__weakref__
c_link_0.end_leaf
c_link_0.end_token_index
c_link_0.end_word_index
c_link_0.get_end_leaf
c_link_0.get_sentence_index
c_link_0.get_start_leaf
c_link_0.get_string
c_link_0.get_subtree_id
c_link_0.set_end_leaf
c_link_0.set_start_leaf
c_link_0.set_string
c_link_0.start_leaf
c_link_0.start_token_index
c_link_0.start_word_index
c_link_0.string
c_link_0.subtree_id
c_link_0.start_leaf
c_link_0.start_token_index
c_link_0.start_word_index
c_link_0.string
c_link_0.subtree
c_link_0.subtree_id
c_link_0.type
c_link_0.copy_to_different_trees
c_link_0.coreference_chain
c_link_0.coreference_chain_id
c_link_0.end_leaf
c_link_0.end_token_index
c_link_0.end_word_index
c_link_0.enrich_tree
c_link_0.id
c_link_0.overlaps
c_link_0.primary_end_index
c_link_0.primary_start_index
c_link_0.sentence_index
c_link_0.sql_create_statement
c_link_0.sql_insert_statement
c_link_0.valid
c_link_0.write_to_db
```

In [45]: c_link_0. [tab]

```
c_link_0.__class_ff_
c_link_0.__delattr__
c_link_0.__dict__
c_link_0.__doc__
c_link_0.__getattribute__
c_link_0.__hash__
c_link_0.__init__
c_link_0.__module__
c_link_0.__new__
c_link_0.__reduce__
c_link_0.__reduce_ex__
c_link_0.__repr__
c_link_0.__setattro_
c_link_0.__str__
c_link_0.__weakref__
c_link_0.end_leaf
c_link_0.end_token_index
c_link_0.end_word_index
c_link_0.get_end_leaf
c_link_0.get_sentence_index
c_link_0.get_start_leaf
c_link_0.get_string
c_link_0.get_subtree_id
c_link_0.sentence_index
c_link_0.set_end_leaf
c_link_0.set_start_leaf
c_link_0.set_string
c_link_0.start_leaf
c_link_0.start_token_index
c_link_0.start_word_index
c_link_0.string
c_link_0.subtree_id
c_link_0.sql_table_name
c_link_0.start_leaf
c_link_0.start_token_index
c_link_0.start_word_index
c_link_0.string
c_link_0.subtree
c_link_0.subtree_id
c_link_0.type
c_link_0.copy_to_different_trees
c_link_0.coreference_chain
c_link_0.coreference_chain_id
c_link_0.end_leaf
c_link_0.end_token_index
c_link_0.end_word_index
c_link_0.enrich_tree
c_link_0.id
c_link_0.overlaps
c_link_0.primary_end_index
c_link_0.primary_start_index
c_link_0.sentence_index
c_link_0.sql_create_statement
c_link_0.sql_insert_statement
c_link_0.valid
c_link_0.write_to_db
```

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In [45]: c_link_0.subtree

In [45]: c_link_0.subtree

Out[45]:

```
(NP-SBJ (NML (NNP U.S.)
           (NNP Trade)
           (NNP Representative))
      (NNP Carla)
      (NNP Hills))
```

In [45]: c_link_0.subtree

Out[45]:

```
(NP-SBJ (NML (NNP U.S.)
           (NNP Trade)
           (NNP Representative))
      (NNP Carla)
      (NNP Hills))
```

In [46]: c_link_0.subtree_id

In [45]: c_link_0.subtree

Out[45]:

```
(NP-SBJ (NML (NNP U.S.)
           (NNP Trade)
           (NNP Representative))
      (NNP Carla)
      (NNP Hills))
```

In [46]: c_link_0.subtree_id

Out[46]: '34:2@1@nw/wsj/00/wsj_0020@all@wsj@nw@en@on'

In [45]: c_link_0.subtree

Out[45]:

```
(NP-SBJ (NML (NNP U.S.)
           (NNP Trade)
           (NNP Representative))
      (NNP Carla)
      (NNP Hills))
```

In [46]: c_link_0.subtree_id

Out[46]: '34:2@1@nw/wsj/00/wsj_0020@all@wsj@nw@en@on'

In [47]: c_link_0.type

In [45]: c_link_0.subtree

Out[45]:

```
(NP-SBJ (NML (NNP U.S.)
           (NNP Trade)
           (NNP Representative))
      (NNP Carla)
      (NNP Hills))
```

In [46]: c_link_0.subtree_id

Out[46]: '34:2@1@nw/wsj/00/wsj_0020@all@wsj@nw@en@on'

In [47]: c_link_0.type

Out[47]: 'IDENT'

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Exploring Treebank Data

```
In [48]: t_bank = s["parse"]
```

Exploring Treebank Data

```
In [48]: t_bank = s["parse"]
```

```
In [49]: t_bank
```

Exploring Treebank Data

```
In [48]: t_bank = s["parse"]
```

```
In [49]: t_bank
```

```
Out[49]:
```

```
treebank instance, id=gold@all@wsj@nw@en@on, documents:  
[0] : nw/wsj/00/wsj_0020@all@wsj@nw@en@on  
[1] : nw/wsj/00/wsj_0037@all@wsj@nw@en@on  
[2] : nw/wsj/00/wsj_0049@all@wsj@nw@en@on  
[3] : nw/wsj/00/wsj_0089@all@wsj@nw@en@on
```

Exploring Treebank Data

```
In [48]: t_bank = s["parse"]
```

```
In [49]: t_bank
```

```
Out[49]:
```

```
treebank instance, id=gold@all@wsj@nw@en@on, documents:  
[0] : nw/wsj/00/wsj_0020@all@wsj@nw@en@on  
[1] : nw/wsj/00/wsj_0037@all@wsj@nw@en@on  
[2] : nw/wsj/00/wsj_0049@all@wsj@nw@en@on  
[3] : nw/wsj/00/wsj_0089@all@wsj@nw@en@on
```

```
In [50]: t_doc = t_bank[0]
```

Exploring Treebank Data

```
In [48]: t_bank = s["parse"]
```

```
In [49]: t_bank
```

```
Out[49]:
```

```
treebank instance, id=gold@all@wsj@nw@en@on, documents:  
[0] : nw/wsj/00/wsj_0020@all@wsj@nw@en@on  
[1] : nw/wsj/00/wsj_0037@all@wsj@nw@en@on  
[2] : nw/wsj/00/wsj_0049@all@wsj@nw@en@on  
[3] : nw/wsj/00/wsj_0089@all@wsj@nw@en@on
```

```
In [50]: t_doc = t_bank[0]
```

```
In [51]: t_doc
```

Exploring Treebank Data

```
In [48]: t_bank = s["parse"]
```

```
In [49]: t_bank
```

```
Out[49]:
```

```
treebank instance, id=gold@all@wsj@nw@en@on, documents:  
[0] : nw/wsj/00/wsj_0020@all@wsj@nw@en@on  
[1] : nw/wsj/00/wsj_0037@all@wsj@nw@en@on  
[2] : nw/wsj/00/wsj_0049@all@wsj@nw@en@on  
[3] : nw/wsj/00/wsj_0089@all@wsj@nw@en@on
```

```
In [50]: t_doc = t_bank[0]
```

```
In [51]: t_doc
```

```
Out[51]:
```

```
tree_document instance, id=nw/wsj/00/wsj_0020@all@wsj@nw@en@on, trees:  
[ 0] : 0@nw/wsj/00/wsj_0020@all@wsj@nw@en@on  
[ 1] : 1@nw/wsj/00/wsj_0020@all@wsj@nw@en@on  
[ 2] : 2@nw/wsj/00/wsj_0020@all@wsj@nw@en@on  
[ 3] : 3@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
```

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In [52]: t_0 = t_doc[0]

In [52]: t_0 = t_doc[0]

In [56]: t_0

In [52]: t_0 = t_doc[0]

In [56]: t_0

Out[56]:

```
<on.corpora.tree object id=0@nw/wsj/00/wsj_0020@all@wsj@nw@en@on value=<
(TOP (S (NP-SBJ-1 (DT The)
          (NNP U.S.))
        (, ,)
        (S-ADV (NP-SBJ (-NONE- *PRO*-1))
              (VP (VBG claiming)
                  (NP (NP (DT some)
                           (NN success)))
                  (PP-LOC (IN in)
                          (NP (PRP$ its)
                              (NN trade)
                              (NN diplomacy)))))))
      (, ,)
      (VP (VBD removed)
          (NP (NP (NNP South)
                   (NNP Korea)))
        (, ,)
        (NP (NNP Taiwan))
        (CC and)
        (NP (NNP Saudi)
            (NNP Arabia)))
      (PP-CLR (IN from)
              (NP (NP (DT a)
```

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```
In [65]: for leaf in t_0.leaves():
....:     print leaf
....:
....:
```

```
In [65]: for leaf in t_0.leaves():
....:     print leaf
....:
....:
(DT The)
(NNP U.S.)
(, ,)
(-NONE- *PRO*-1)
(VBG claiming)
(DT some)
(NN success)
(IN in)
(PRP$ its)
(NN trade)
(NN diplomacy)
...
...
...
```

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In [19]: t_0[3:11]

In [19]: t_0[3:11]

Out[19]:

```
(S-ADV (NP-SBJ (-NONE- *PRO*-1))
       (VP (VBG claiming)
            (NP (NP (DT some)
                     (NN success)))
            (PP-LOC (IN in)
                     (NP (PRP$ its)
                         (NN trade)
                         (NN diplomacy))))))
```

In [19]: t_0[3:11]

Out[19]:

```
(S-ADV (NP-SBJ (-NONE- *PRO*-1))
       (VP (VBG claiming)
            (NP (NP (DT some)
                     (NN success)))
            (PP-LOC (IN in)
                     (NP (PRP$ its)
                         (NN trade)
                         (NN diplomacy))))))
```

In [20]: t_0[3:10]

In [19]: t_0[3:11]

Out[19]:

```
(S-ADV (NP-SBJ (-NONE- *PRO*-1))
       (VP (VBD claiming)
            (NP (NP (DT some)
                     (NN success)))
            (PP-LOC (IN in)
                     (NP (PRP$ its)
                         (NN trade)
                         (NN diplomacy))))))
```

In [20]: t_0[3:10]

Out[20]:

```
[(-NONE- *PRO*-1),
 (VBD claiming),
 (DT some),
 (NN success),
 (IN in),
 (PRP$ its),
 (NN trade)]
```

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Exploring Proposition Data

Exploring Proposition Data

```
In [87]: p = []
```

Exploring Proposition Data

```
In [87]: p = []
```

```
In [88]: for leaf in t_0.leaves():
    if(leaf.proposition != None):
        p.append(leaf.proposition)
```

```
....:
```

```
....:
```

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In [95]: p[3]

In [95]: p[3]

Out[95]:

proposition:

```
id      : 29@nw/ws_j/00/ws_j_0020@all@ws_j@nw@en@on
doc_id  : nw/ws_j/00/ws_j_0020@all@ws_j@nw@en@on
tree_id : 0@nw/ws_j/00/ws_j_0020@all@ws_j@nw@en@on
frame   : watch.01
enc_prop: ws_j_0020@... 0 29 ... watch.01 ----- 29:0-rel 26:1-ARG0 30:0*25:1-ARG1 ... 24:1*25:1-LINK-SLC
predicate:
< predicate_analogue : id: watch.01@v@29@0@nw/ws_j/00/ws_j_0020@...; enc_self: '29:0-rel'
  < predicate : id: 0@watch.01@v@29@0@nw/ws_j/00/ws_j_0020@...; enc_self: '29:0'
    < predicate_node : id: 0@0@watch.01@v@29@0@nw/ws_j/00/ws_j_0020@...; enc_self: '29:0'>>>
arguments:
< argument_analogue : id: 0@ARG0@29@0@nw/ws_j/00/ws_j_0020@...; enc_self: '26:1-ARG0'
  < argument : id: 0@0@ARG0@29@0@nw/ws_j/00/ws_j_0020@...; enc_self: '26:1'
    < argument_node : id: 0@0@0@ARG0@29@0@nw/ws_j/00/ws_j_0020@...; enc_self: '26:1'>>>
...
...
links:
< link_analogue : id: 0@LINK-SLC@29@0@nw/ws_j/00/ws_j_0020@...; enc_self: '24:1*25:1-LINK-SLC'
  < link : id: 0@0@LINK-SLC@29@0@nw/ws_j/00/ws_j_0020@...; enc_self: '24:1'
    < link_node : id: 0@0@0@LINK-SLC@29@0@nw/ws_j/00/ws_j_0020@...; enc_self: '24:1'>>,
```

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In [98]: predicate = p[3].predicate

```
In [98]: predicate = p[3].predicate
```

```
In [99]: predicate.[tab]
```

In [98]: predicate = p[3].predicate

In [99]: predicate.[tab]

<code>predicate.__class__</code>	<code>predicate.add</code>	<code>predicate.get_primary_predicate</code>
<code>predicate.__delattr__</code>	<code>predicate.analogue_type</code>	<code>predicate.id</code>
<code>predicate.__dict__</code>	<code>predicate.children</code>	<code>predicate.index_in_parent</code>
<code>predicate.__doc__</code>	<code>predicate.copy_to_different_trees</code>	<code>predicate.lemma</code>
<code>predicate.__getattribute__</code>	<code>predicate.document_id</code>	<code>predicate.parent</code>
<code>predicate.__getitem__</code>	<code>predicate.enc_self</code>	<code>predicate.pb_sense_num</code>
<code>predicate.__hash__</code>	<code>predicate.enc_self_type</code>	<code>predicate.primary_predicate</code>
<code>predicate.__init__</code>	<code>predicate.enrich_tree</code>	<code>predicate.proposition</code>
<code>predicate.__len__</code>	<code>predicate.get_index_of</code>	<code>predicate.sentence_index</code>

In [98]: predicate = p[3].predicate

In [99]: predicate.[tab]

<code>predicate.__class__</code>	<code>predicate.add</code>	<code>predicate.get_primary_predicate</code>
<code>predicate.__delattr__</code>	<code>predicate.analogue_type</code>	<code>predicate.id</code>
<code>predicate.__dict__</code>	<code>predicate.children</code>	<code>predicate.index_in_parent</code>
<code>predicate.__doc__</code>	<code>predicate.copy_to_different_trees</code>	<code>predicate.lemma</code>
<code>predicate.__getattribute__</code>	<code>predicate.document_id</code>	<code>predicate.parent</code>
<code>predicate.__getitem__</code>	<code>predicate.enc_self</code>	<code>predicate.pb_sense_num</code>
<code>predicate.__hash__</code>	<code>predicate.enc_self_type</code>	<code>predicate.primary_predicate</code>
<code>predicate.__init__</code>	<code>predicate.enrich_tree</code>	<code>predicate.proposition</code>
<code>predicate.__len__</code>	<code>predicate.get_index_of</code>	<code>predicate.sentence_index</code>

In [99]: predicate.lemma

In [98]: predicate = p[3].predicate

In [99]: predicate.[tab]

predicate.__class__	predicate.add	predicate.get_primary_predicate
predicate.__delattr__	predicate.analogue_type	predicate.id
predicate.__dict__	predicate.children	predicate.index_in_parent
predicate.__doc__	predicate.copy_to_different_trees	predicate.lemma
predicate.__getattribute__	predicate.document_id	predicate.parent
predicate.__getitem__	predicate.enc_self	predicate.pb_sense_num
predicate.__hash__	predicate.enc_self_type	predicate.primary_predicate
predicate.__init__	predicate.enrich_tree	predicate.proposition
predicate.__len__	predicate.get_index_of	predicate.sentence_index

In [99]: predicate.lemma

Out[99]: u'watch'

In [98]: predicate = p[3].predicate

In [99]: predicate.[tab]

predicate.__class__	predicate.add	predicate.get_primary_predicate
predicate.__delattr__	predicate.analogue_type	predicate.id
predicate.__dict__	predicate.children	predicate.index_in_parent
predicate.__doc__	predicate.copy_to_different_trees	predicate.lemma
predicate.__getattribute__	predicate.document_id	predicate.parent
predicate.__getitem__	predicate.enc_self	predicate.pb_sense_num
predicate.__hash__	predicate.enc_self_type	predicate.primary_predicate
predicate.__init__	predicate.enrich_tree	predicate.proposition
predicate.__len__	predicate.get_index_of	predicate.sentence_index

In [99]: predicate.lemma

Out[99]: u'watch'

In [100]: predicate.tree_id

In [98]: predicate = p[3].predicate

In [99]: predicate.[tab]

predicate.__class__	predicate.add	predicate.get_primary_predicate
predicate.__delattr__	predicate.analogue_type	predicate.id
predicate.__dict__	predicate.children	predicate.index_in_parent
predicate.__doc__	predicate.copy_to_different_trees	predicate.lemma
predicate.__getattribute__	predicate.document_id	predicate.parent
predicate.__getitem__	predicate.enc_self	predicate.pb_sense_num
predicate.__hash__	predicate.enc_self_type	predicate.primary_predicate
predicate.__init__	predicate.enrich_tree	predicate.proposition
predicate.__len__	predicate.get_index_of	predicate.sentence_index

In [99]: predicate.lemma

Out[99]: u'watch'

In [100]: predicate.tree_id

Out[100]: '0@nw/wsj/00/wsj_0020@all@wsj@nw@en@on'

In [98]: predicate = p[3].predicate

In [99]: predicate.[tab]

predicate.__class__	predicate.add	predicate.get_primary_predicate
predicate.__delattr__	predicate.analogue_type	predicate.id
predicate.__dict__	predicate.children	predicate.index_in_parent
predicate.__doc__	predicate.copy_to_different_trees	predicate.lemma
predicate.__getattribute__	predicate.document_id	predicate.parent
predicate.__getitem__	predicate.enc_self	predicate.pb_sense_num
predicate.__hash__	predicate.enc_self_type	predicate.primary_predicate
predicate.__init__	predicate.enrich_tree	predicate.proposition
predicate.__len__	predicate.get_index_of	predicate.sentence_index

In [99]: predicate.lemma

Out[99]: u'watch'

In [100]: predicate.tree_id

Out[100]: '0@nw/wsj/00/wsj_0020@all@wsj@nw@en@on'

In [101]: predicate.token_index

In [98]: predicate = p[3].predicate

In [99]: predicate.[tab]

predicate.__class__	predicate.add	predicate.get_primary_predicate
predicate.__delattr__	predicate.analogue_type	predicate.id
predicate.__dict__	predicate.children	predicate.index_in_parent
predicate.__doc__	predicate.copy_to_different_trees	predicate.lemma
predicate.__getattribute__	predicate.document_id	predicate.parent
predicate.__getitem__	predicate.enc_self	predicate.pb_sense_num
predicate.__hash__	predicate.enc_self_type	predicate.primary_predicate
predicate.__init__	predicate.enrich_tree	predicate.proposition
predicate.__len__	predicate.get_index_of	predicate.sentence_index

In [99]: predicate.lemma

Out[99]: u'watch'

In [100]: predicate.tree_id

Out[100]: '0@nw/wsj/00/wsj_0020@all@wsj@nw@en@on'

In [101]: predicate.token_index

Out[101]: 29

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In [102]: predicate.document_id

```
In [102]: predicate.document_id  
Out[102]: 'nw/wsj/00/wsj_0020@all@wsj@nw@en@on'
```

```
In [102]: predicate.document_id  
Out[102]: 'nw/wsj/00/wsj_0020@all@wsj@nw@en@on'
```

```
In [103]: predicate.sentence_index
```

```
In [102]: predicate.document_id  
Out[102]: 'nw/wsj/00/wsj_0020@all@wsj@nw@en@on'
```

```
In [103]: predicate.sentence_index  
Out[103]: 0
```

```
In [102]: predicate.document_id  
Out[102]: 'nw/wsj/00/wsj_0020@all@wsj@nw@en@on'
```

```
In [103]: predicate.sentence_index  
Out[103]: 0
```

```
In [104]: predicate.type
```

```
In [102]: predicate.document_id  
Out[102]: 'nw/wsj/00/wsj_0020@all@wsj@nw@en@on'
```

```
In [103]: predicate.sentence_index  
Out[103]: 0
```

```
In [104]: predicate.type  
Out[104]: u'v'
```

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In [113]: `link_analogue = proposition.link_analogues`

```
In [113]: link_analogue = proposition.link_analogues
```

```
In [120]: link_analogue[0][0][0]
```

```
In [113]: link_analogue = proposition.link_analogues
```

```
In [120]: link_analogue[0][0][0]
```

```
Out[120]: <link_node id: 0@0@0@LINK-SLC@29@0@..wsj_0020@...@on; enc_self: '24:1'>
```

```
In [113]: link_analogue = proposition.link_analogues
```

```
In [120]: link_analogue[0][0][0]
```

```
Out[120]: <link_node id: 0@0@0@LINK-SLC@29@0@...wsj_0020@...@on; enc_self: '24:1'>
```

```
In [121]: link_node = link_analogue[0][0][0]
```

```
In [113]: link_analogue = proposition.link_analogues

In [120]: link_analogue[0][0][0]
Out[120]: <link_node id: 0@0@0@LINK-SLC@29@0@..wsj_0020@...@on; enc_self: '24:1'>

In [121]: link_node = link_analogue[0][0][0]

In [122]: link_node.type
```

```
In [113]: link_analogue = proposition.link_analogues

In [120]: link_analogue[0][0][0]
Out[120]: <link_node id: 0@0@0@LINK-SLC@29@0@...wsj_0020@...@on; enc_self: '24:1'>

In [121]: link_node = link_analogue[0][0][0]

In [122]: link_node.type
Out[122]: u'LINK-SLC'
```

```
In [113]: link_analogue = proposition.link_analogues

In [120]: link_analogue[0][0][0]
Out[120]: <link_node id: 0@0@0@LINK-SLC@29@0@..wsj_0020@...@on; enc_self: '24:1'>

In [121]: link_node = link_analogue[0][0][0]

In [122]: link_node.type
Out[122]: u'LINK-SLC'

In [123]: link_node.subtree
```

```
In [113]: link_analogue = proposition.link_analogues

In [120]: link_analogue[0][0][0]
Out[120]: <link_node id: 0@0@0@LINK-SLC@29@0@..wsj_0020@...@on; enc_self: '24:1'>

In [121]: link_node = link_analogue[0][0][0]

In [122]: link_node.type
Out[122]: u'LINK-SLC'

In [123]: link_node.subtree
Out[123]: (NP (NNS countries))
```

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In [125]: link_node.subtree.start

```
In [125]: link_node.subtree.start
Out[125]: 24
```

```
In [125]: link_node.subtree.start
```

```
Out[125]: 24
```

```
In [126]: link_node.subtree.end
```

```
In [125]: link_node.subtree.start  
Out[125]: 24
```

```
In [126]: link_node.subtree.end  
Out[126]: 25
```

```
In [125]: link_node.subtree.start
```

```
Out[125]: 24
```

```
In [126]: link_node.subtree.end
```

```
Out[126]: 25
```

```
In [128]: link_node.id
```

```
In [125]: link_node.subtree.start
```

```
Out[125]: 24
```

```
In [126]: link_node.subtree.end
```

```
Out[126]: 25
```

```
In [128]: link_node.id
```

```
Out[128]: u'0@0@0@LINK-SLC@29@0@nw/wsj/00/wsj_0020@all@wsj@nw@en@on'
```

```
In [125]: link_node.subtree.start
```

```
Out[125]: 24
```

```
In [126]: link_node.subtree.end
```

```
Out[126]: 25
```

```
In [128]: link_node.id
```

```
Out[128]: u'0@0@0@LINK-SLC@29@0@nw/wsj/00/ws_j_0020@all@wsj@nw@en@on'
```

```
In [134]: link_node.subtree.get_word[tab]
```

```
In [125]: link_node.subtree.start
```

```
Out[125]: 24
```

```
In [126]: link_node.subtree.end
```

```
Out[126]: 25
```

```
In [128]: link_node.id
```

```
Out[128]: u'0@0@0@LINK-SLC@29@0@nw/wsj/00/wsj_0020@all@wsj@nw@en@on'
```

```
In [134]: link_node.subtree.get_word[tab]
```

```
link_node.subtree.get_word_index    link_node.subtree.get_word_string
```

```
In [125]: link_node.subtree.start  
Out[125]: 24
```

```
In [126]: link_node.subtree.end  
Out[126]: 25
```

```
In [128]: link_node.id  
Out[128]: u'0@0@0@LINK-SLC@29@0@nw/wsj/00/wsj_0020@all@wsj@nw@en@on'
```

```
In [134]: link_node.subtree.get_word[tab]  
link_node.subtree.get_word_index    link_node.subtree.get_word_string
```

```
In [134]: link_node.subtree.get_word_string()
```

```
In [125]: link_node.subtree.start  
Out[125]: 24
```

```
In [126]: link_node.subtree.end  
Out[126]: 25
```

```
In [128]: link_node.id  
Out[128]: u'0@0@0@LINK-SLC@29@0@nw/wsj/00/wsj_0020@all@wsj@nw@en@on'
```

```
In [134]: link_node.subtree.get_word[tab]  
link_node.subtree.get_word_index    link_node.subtree.get_word_string
```

```
In [134]: link_node.subtree.get_word_string()  
Out[134]: u'countries'
```

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Exploring Senses

Exploring Senses

```
In [177]: s_bank = s["sense"]
```

Exploring Senses

```
In [177]: s_bank = s["sense"]  
In [178]: s_bank
```

Exploring Senses

```
In [177]: s_bank = s["sense"]
In [178]: s_bank
Out[178]:
sense.bank instance, id=gold@all@wsj@nw@en@on, documents:
[0] : nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[1] : nw/wsj/00/wsj_0037@all@wsj@nw@en@on
[2] : nw/wsj/00/wsj_0049@all@wsj@nw@en@on
[3] : nw/wsj/00/wsj_0089@all@wsj@nw@en@on
```

Exploring Senses

```
In [177]: s_bank = s["sense"]
In [178]: s_bank
Out[178]:
sense.Bank instance, id=gold@all@wsj@nw@en@on, documents:
[0] : nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[1] : nw/wsj/00/wsj_0037@all@wsj@nw@en@on
[2] : nw/wsj/00/wsj_0049@all@wsj@nw@en@on
[3] : nw/wsj/00/wsj_0089@all@wsj@nw@en@on
```

```
In [179]: s_doc_0 = s_bank[0]
```

Exploring Senses

```
In [177]: s_bank = s["sense"]
In [178]: s_bank
Out[178]:
sense.bank instance, id=gold@all@wsj@nw@en@on, documents:
[0] : nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[1] : nw/wsj/00/wsj_0037@all@wsj@nw@en@on
[2] : nw/wsj/00/wsj_0049@all@wsj@nw@en@on
[3] : nw/wsj/00/wsj_0089@all@wsj@nw@en@on
```

```
In [179]: s_doc_0 = s_bank[0]
```

```
In [180]: s_doc_0
```

Exploring Senses

```
In [177]: s_bank = s["sense"]
In [178]: s_bank
Out[178]:
sense.bank instance, id=gold@all@wsj@nw@en@on, documents:
[0] : nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[1] : nw/wsj/00/wsj_0037@all@wsj@nw@en@on
[2] : nw/wsj/00/wsj_0049@all@wsj@nw@en@on
[3] : nw/wsj/00/wsj_0089@all@wsj@nw@en@on
```

```
In [179]: s_doc_0 = s_bank[0]
```

```
In [180]: s_doc_0
Out[180]:
senses.tagged_document instance, id=nw/wsj/00/wsj_0020@all@wsj@nw@en@on, on_senses:
[ 0] : claim.2@v@3@0@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[ 1] : success.2@n@5@0@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[ 2] : trade.1@n@8@0@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[ 3] : remove.1@v@11@0@nw/wsj/00/wsj_0020@all@wsj@nw@en@on
[ 4] : list.1@n@21@0@nw/wsj/00/wsj_s0020@all@wsj@nw@en@on
```

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Exploring Parallel Connections

Exploring Parallel Connections

```
In [136]: s["parallel"]
```

Exploring Parallel Connections

```
In [136]: s["parallel"]
Out[136]:
parallel_bank instance, id=gold@all@wsj@nw@en@on, documents:
(empty)
```

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```
In [137]: c = on.common.util.load_config("config.parallel")
```

```
In [137]: c = on.common.util.load_config("config.parallel")
```

```
In [138]: o = on.ontonotes(c)
```

```
In [137]: c = on.common.util.load_config("config.parallel")
```

```
In [138]: o = on.ontonotes(c)
```

```
Loading chinese bc msnbc
```

```
.....
```

```
found 1 file in the subcorpus all@msnbc@bc@ch@on
```

```
Loading english bc msnbc
```

```
.....
```

```
found 1 file in the subcorpus all@msnbc@bc@en@on
```

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In [139]: o

```
In [139]: o
Out[139]:
ontonotes instance, id=on, subcorpora:
[0] : all@msnbc@bc@ch@on
[1] : all@msnbc@bc@en@on
```

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In [140]: s_0 = o[0]

```
In [140]: s_0 = o[0]
Loading banks for all@msnbc@bc@ch@on: parse, coref, sense, name, parallel, prop, speaker ...
reading the treebank [parse] .... 665 trees in the treebank
reading the coreference bank [coref] .... Enriching parse with coref ...
reading the sense bank [sense] .... Enriching parse with sense ...
reading the name bank [name].... Enriching parse with name ...
reading the parallel bank [parallel] ....
```

```
In [140]: s_0 = o[0]
Loading banks for all@msnbc@bc@ch@on: parse, coref, sense, name, parallel, prop, speaker ...
reading the treebank [parse] .... 665 trees in the treebank
reading the coreference bank [coref] .... Enriching parse with coref ...
reading the sense bank [sense] .... Enriching parse with sense ...
reading the name bank [name].... Enriching parse with name ...
reading the parallel bank [parallel] ....

finding original trees to prepare for parallel bank enrichment....
```

```
In [140]: s_0 = o[0]
Loading banks for all@msnbc@bc@ch@on: parse, coref, sense, name, parallel, prop, speaker ...
reading the treebank [parse] .... 665 trees in the treebank
reading the coreference bank [coref] .... Enriching parse with coref ...
reading the sense bank [sense] .... Enriching parse with sense ...
reading the name bank [name].... Enriching parse with name ...
reading the parallel bank [parallel] ....
```

finding original trees to prepare for parallel bank enrichment....

```
Loading banks for all@msnbc@bc@en@on: parse, coref, sense, name, parallel, prop, speaker ...
reading the treebank [parse] .... 660 trees in the treebank
reading the coreference bank [coref] ....Enriching parse with coref ...
reading the sense bank [sense] .... Enriching parse with sense ...
reading the name bank [name].... Enriching parse with name ...
reading the parallel bank [parallel] ....
reading the proposition bank [prop] .... Enriching parse with prop ...
reading the speaker bank [speaker] .... Enriching parse with speaker ...
```

```
In [140]: s_0 = o[0]
```

```
Loading banks for all@msnbc@bc@ch@on: parse, coref, sense, name, parallel, prop, speaker ...
reading the treebank [parse] .... 665 trees in the treebank
reading the coreference bank [coref] .... Enriching parse with coref ...
reading the sense bank [sense] .... Enriching parse with sense ...
reading the name bank [name].... Enriching parse with name ...
reading the parallel bank [parallel] ....
```

```
finding original trees to prepare for parallel bank enrichment....
```

```
Loading banks for all@msnbc@bc@en@on: parse, coref, sense, name, parallel, prop, speaker ...
reading the treebank [parse] .... 660 trees in the treebank
reading the coreference bank [coref] ....Enriching parse with coref ...
reading the sense bank [sense] .... Enriching parse with sense ...
reading the name bank [name].... Enriching parse with name ...
reading the parallel bank [parallel] ....
reading the proposition bank [prop] .... Enriching parse with prop ...
reading the speaker bank [speaker] .... Enriching parse with speaker ...
```

```
found 1 original treebanks.
```

```
enriching treebanks with tree-to-tree parallel data .....
reading the proposition bank [prop] ....Enriching parse with prop ...
reading the speaker bank [speaker] ....Enriching parse with speaker ...
```

- If you try to load the next subcorpus you will not see any output because it has already read it automatically

- If you try to load the next subcorpus you will not see any output because it has already read it automatically

```
In [141]: s_1 = o[1]
```

- If you try to load the next subcorpus you will not see any output because it has already read it automatically

```
In [141]: s_1 = o[1]
```

```
In [142]:
```

- But, they are different

- But, they are different

In [143]: s_0

• But, they are different

In [143]: s_0

Out[143]:

```
subcorpus instance, id=all@msnbc@bc@ch@on, banks:  
[ coref] : gold@all@msnbc@bc@ch@on  
[document] : gold@all@msnbc@bc@ch@on  
[ name] : gold@all@msnbc@bc@ch@on  
[parallel] : gold@all@msnbc@bc@ch@on  
[ parse] : gold@all@msnbc@bc@ch@on  
[ prop] : gold@all@msnbc@bc@ch@on  
[ sense] : gold@all@msnbc@bc@ch@on  
[ speaker] : gold@all@msnbc@bc@ch@on
```

• But, they are different

In [143]: s_0

Out[143]:

```
subcorpus instance, id=all@msnbc@bc@ch@on, banks:  
[ coref] : gold@all@msnbc@bc@ch@on  
[document] : gold@all@msnbc@bc@ch@on  
[ name] : gold@all@msnbc@bc@ch@on  
[parallel] : gold@all@msnbc@bc@ch@on  
[ parse] : gold@all@msnbc@bc@ch@on  
[ prop] : gold@all@msnbc@bc@ch@on  
[ sense] : gold@all@msnbc@bc@ch@on  
[ speaker] : gold@all@msnbc@bc@ch@on
```

In [144]: s_1

• But, they are different

In [143]: s_0

Out[143]:

```
subcorpus instance, id=all@msnbc@bc@ch@on, banks:  
[ coref] : gold@all@msnbc@bc@ch@on  
[document] : gold@all@msnbc@bc@ch@on  
[ name] : gold@all@msnbc@bc@ch@on  
[parallel] : gold@all@msnbc@bc@ch@on  
[ parse] : gold@all@msnbc@bc@ch@on  
[ prop] : gold@all@msnbc@bc@ch@on  
[ sense] : gold@all@msnbc@bc@ch@on  
[ speaker] : gold@all@msnbc@bc@ch@on
```

In [144]: s_1

Out[144]:

```
subcorpus instance, id=all@msnbc@bc@en@on, banks:  
[ coref] : gold@all@msnbc@bc@en@on  
[document] : gold@all@msnbc@bc@en@on  
[ name] : gold@all@msnbc@bc@en@on  
[parallel] : gold@all@msnbc@bc@en@on  
[ parse] : gold@all@msnbc@bc@en@on  
[ prop] : gold@all@msnbc@bc@en@on  
[ sense] : gold@all@msnbc@bc@en@on  
[ speaker] : gold@all@msnbc@bc@en@on
```

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In [145]: c_t_b = s_0["parse"]

```
In [145]: c_t_b = s_0["parse"]  
In [146]: e_t_b = s_1["parse"]
```

```
In [145]: c_t_b = s_0["parse"]
In [146]: e_t_b = s_1["parse"]
In [147]: c_t_b
```

```
In [145]: c_t_b = s_0["parse"]
In [146]: e_t_b = s_1["parse"]
In [147]: c_t_b
Out[147]:
treebank instance, id=gold@all@msnbc@bc@ch@on, documents:
[0] : bc/msnbc/00/msnbc_0000@all@msnbc@bc@ch@on
```

```
In [145]: c_t_b = s_0["parse"]
In [146]: e_t_b = s_1["parse"]
In [147]: c_t_b
Out[147]:
treebank instance, id=gold@all@msnbc@bc@ch@on, documents:
[0] : bc/msnbc/00/msnbc_0000@all@msnbc@bc@ch@on

In [148]: e_t_b
```

```
In [145]: c_t_b = s_0["parse"]
In [146]: e_t_b = s_1["parse"]
In [147]: c_t_b
Out[147]:
treebank instance, id=gold@all@msnbc@bc@ch@on, documents:
[0] : bc/msnbc/00/msnbc_0000@all@msnbc@bc@ch@on

In [148]: e_t_b
Out[148]:
treebank instance, id=gold@all@msnbc@bc@en@on, documents:
[0] : bc/msnbc/00/msnbc_0005@all@msnbc@bc@en@on
```

```
In [145]: c_t_b = s_0["parse"]
In [146]: e_t_b = s_1["parse"]
In [147]: c_t_b
Out[147]:
treebank instance, id=gold@all@msnbc@bc@ch@on, documents:
[0] : bc/msnbc/00/msnbc_0000@all@msnbc@bc@ch@on

In [148]: e_t_b
Out[148]:
treebank instance, id=gold@all@msnbc@bc@en@on, documents:
[0] : bc/msnbc/00/msnbc_0005@all@msnbc@bc@en@on

In [149]: c_t_doc = c_t_b[0]
```

```
In [145]: c_t_b = s_0["parse"]
In [146]: e_t_b = s_1["parse"]
In [147]: c_t_b
Out[147]:
treebank instance, id=gold@all@msnbc@bc@ch@on, documents:
[0] : bc/msnbc/00/msnbc_0000@all@msnbc@bc@ch@on

In [148]: e_t_b
Out[148]:
treebank instance, id=gold@all@msnbc@bc@en@on, documents:
[0] : bc/msnbc/00/msnbc_0005@all@msnbc@bc@en@on

In [149]: c_t_doc = c_t_b[0]
In [150]: e_t_doc = e_t_b[0]
```

```
In [145]: c_t_b = s_0["parse"]
In [146]: e_t_b = s_1["parse"]
In [147]: c_t_b
Out[147]:
treebank instance, id=gold@all@msnbc@bc@ch@on, documents:
[0] : bc/msnbc/00/msnbc_0000@all@msnbc@bc@ch@on

In [148]: e_t_b
Out[148]:
treebank instance, id=gold@all@msnbc@bc@en@on, documents:
[0] : bc/msnbc/00/msnbc_0005@all@msnbc@bc@en@on

In [149]: c_t_doc = c_t_b[0]
In [150]: e_t_doc = e_t_b[0]
In [151]: c_t_0 = c_t_doc[0]
```

```
In [145]: c_t_b = s_0["parse"]
In [146]: e_t_b = s_1["parse"]
In [147]: c_t_b
Out[147]:
treebank instance, id=gold@all@msnbc@bc@ch@on, documents:
[0] : bc/msnbc/00/msnbc_0000@all@msnbc@bc@ch@on

In [148]: e_t_b
Out[148]:
treebank instance, id=gold@all@msnbc@bc@en@on, documents:
[0] : bc/msnbc/00/msnbc_0005@all@msnbc@bc@en@on

In [149]: c_t_doc = c_t_b[0]
In [150]: e_t_doc = e_t_b[0]
In [151]: c_t_0 = c_t_doc[0]
In [152]: e_t_0 = e_t_doc[0]
```

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In [153]: c_t_0

In [153]: c_t_0

Out[153]:

```
<on.corpora.tree object id=0@bc/msnbc/00/msnbc_0000@all@msnbc@bc@ch@on value=<
(TOP (IP (CODE [speaker1_#1E])
          (IP (NP-SBJ (-NONE- *pro*))
              (VP (NP-PRD (NP (NP-PN (NR ...))
                               (NP-PN (NR ...))
                               (NP-PN (NN ...))
                               (NN ...))
                               (NN ...))))
              (NP (NN ...))))))
          (PU ...))
          (IP (NP-SBJ (PN ...))
              (VP (VC ...)
                  (NP-PRD (DNP (NP-PN (NR ...))
                                 (DEG ...))
                  (NP-PN (PU ...))
                  (IP (NP-SBJ (-NONE- *pro*))
                      (VP (VV ...)
                          (NP-OBJ (NN ...)))))))
              (PU ...))))))
          (PU ...)))>
```

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In [154]: e_t_0

In [154]: e_t_0

Out[154]:

```
<on.corpora.tree object id=0@bc/msnbc/00/msnbc_0005@all@msnbc@bc@en@on value=<
(TOP (S (CODE [speaker1])
  (PP (IN From)
    (NP (NP (NNP ~NBC)
      (NN news))
    (PP-LOC (IN in)
      (NP (NNP Washington))))))
  (NP-SBJ (DT this))
  (VP (VBZ is)
    (NP-PRD (NP (NNP Meet)
      (NNP the)
      (NNP Press)))
    (PP (IN with)
      (NP (NNP Jim)
        (NNP Russert))))))
  (. /)))>
```

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In [155]: c_t_0.originals

In [155]: c_t_0.originals

Out[155]:

```
[<on.corpora.tree object id=0@bc/msnbc/00/msnbc_0005@all@msnbc@bc@en@on value=<(TOP (S (CODE [speaker1])  
    (PP (IN From)  
        (NP (NP (NNP ~NBC)  
  
            (NN news))  
        (PP-LOC (IN in)  
            (NP (NNP Washington))))))  
    (NP-SBJ (DT this))  
    (VP (VBZ is)  
        (NP-PRD (NP (NNP Meet)  
            (NNP the)  
            (NNP Press))  
        (PP (IN with)  
            (NP (NNP Jim)  
                (NNP Russert))))  
    (. /..)))>]
```

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```
In [156]: c_t_0.originals[0].translations
```

In [156]: c_t_0.originals[0].translations

Out[156]:

```
[<on.corpora.tree object id=0@bc/msnbc/00/msnbc_0000@all@msnbc@bc@ch@on value=<(TOP (IP (CODE [speaker1_#1E])  
    (IP (NP-SBJ (-NONE- *pro*))  
        (VP (NP-PRD (NP (NP-PN (NR ...))  
            (NP-PN (NR ...))  
            (NP-PN (NN ...))  
            (NN ...))  
            (NN ...)))  
        (NP (NN ...))))  
    (PU ...)  
    (IP (NP-SBJ (PN ...))  
        (VP (VC ...)  
            (NP-PRD (DNP (NP-PN (NR ...))  
                (DEG ...))  
            (NP-PN (PU ...))  
                (IP (NP-SBJ (-NONE- *pro*))  
                    (VP (VV ...))  
                    (NP-OBJ (NN ...))))  
            (PU ...))))  
    (PU ...))))>]
```

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In [167]: len(c_t_doc)

```
In [167]: len(c_t_doc)  
Out[167]: 665
```

```
In [167]: len(c_t_doc)  
Out[167]: 665
```

```
In [169]: for c_t_index in range(0, len(c_t_doc)):  
    if(len(c_t_doc[c_t_index].originals) > 1):  
        print c_t_index  
....:  
....:
```

In [167]: len(c_t_doc)

Out[167]: 665

```
In [169]: for c_t_index in range(0, len(c_t_doc)):
    if(len(c_t_doc[c_t_index].originals) > 1):
        print c_t_index
.....
....:
```

643

In [167]: len(c_t_doc)

Out[167]: 665

In [169]: for c_t_index in range(0, len(c_t_doc)):
 if(len(c_t_doc[c_t_index].originals) > 1):
 print c_t_index

.....:

.....:

643

In [172]: c_t_643 = c_t_doc[643]

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In [173]: c_t_643.originals

In [173]: c_t_643.originals

Out[173]:

```
[<on.corpora.tree object id=638@bc/msnbc/00/msnbc_0005@all@msnbc@bc@en@on value=<
(TOP (S (CODE [Tim_Russert])
        (NP-SBJ-1 (PRP I))
        (VP (VBD was)
            (ADJP-PRD (JJ ready)
                (S (NP-SBJ (-NONE- *PRO*-1))
                    (VP (TO to)
                        (VP (VB wear)
                            (NP (DT this))
                            (PP-PRP (IN for)
                                (NP (DT the)
                                    (JJ final)
                                    (CD four))))))))
            (. /.))>,
<on.corpora.tree object id=639@bc/msnbc/00/msnbc_0005@all@msnbc@bc@en@on value=<
(TOP (S-UNF (CODE [Tim_Russert])
        (CC but)
        (INTJ (UH uh))
        (INTJ (UH uh))
        (NP-SBJ (PRP I))
        (. /-)))>]
```

Advanced Configuration

```
[corpus]
data_in          : data
load             : english-nw-wsj
granularity      : source
banks            : parse coref sense name prop
                  b_parse:parse b_sense:b_parse b_prop:b_parse
ignore-inventories: senses frames
```

Dealing with Alignment

- Examples on Live CD

Cross-Layer Query

What is the distribution of named entities that are ARG0s of the predicate “say”?

```

for a_proposition in a_proposition_bank:
    if proposition_type == "ARG0":
        arg_in_p_q = "select * from argument where proposition_id = '%s';" % (a_proposition.id)
        a_cursor.execute(arg_in_p_q)
        argument_rows = a_cursor.fetchall()
        argument_rows_count = len(argument_rows)

        for a_argument_row in argument_rows:
            a_argument_id = a_argument_row["id"]
            a_argument_type = a_argument_row["type"]

            if a_argument_type == "ARG0":
                n_in_arg_q = "select * from argument where argument_id = '%s';" % (a_argument.id)
                a_cursor.execute(n_in_arg_q)
                argument_node_rows = a_cursor.fetchall()
                for a_argument_node_row in argument_node_rows:
                    a_node_id = a_argument_node_row["node_id"]

                    a_ne_node_query = "select * from name_entity where subtree_id = '%s';" % (a_node_id)
                    a_cursor.execute(a_ne_node_query)
                    ne_rows = a_cursor.fetchall()

                    for a_ne_row in ne_rows:
                        a_ne_type = a_ne_row["type"]
                        ne_hash[a_ne_type] = ne_hash[a_ne_type] + 1

                    a_tree = a_tree_document.get_tree(a_tree_id)
                    a_node = a_tree.get_subtree(a_node_id)

                    for a_child in a_node.subtrees():
                        a_ne_subtree_query = "select * from name_entity where subtree_id = '%s';" % (a_child.id)
                        subtree_ne_rows = a_cursor.execute(a_ne_subtree_query)
                        ne_subtree_rows_count = len(subtree_ne_rows)

                        for a_ne_subtree_row in ne_subtree_rows:
                            a_ne_subtree_type = a_ne_subtree_row["type"]
                            ne_hash[a_subtree_ne_type] = ne_hash[a_subtree_ne_type] + 1

```

if (proposition.lemma == "say"):

query = “select * from argument where proposition_id = ‘%s’;” ..

if (argument_type == "ARG0"):

for child in node.subtrees():

Name Entity	Frequency
Person	84
GPE	34
Organization	29
NORP	15
...	...

Acknowledgment

