

Task: Information Extraction for the Semantic Web

Solution: Integration of PDT Tools with GATE and Inductive Logic Programming

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Outline

1 Problem

- Information Extraction
- Semantic Annotation
- Example Tasks

2 Solution

- Basic Idea
- Linguistics we Are Using
- Manually Created Rules
- Semantic Interpretation
- Learning of Rules
- Evaluation

3 Implementation Details

- Integration of Linguistic Tools (GATE)
- Integration with Semantic Tools
- Conclusion

Information Extraction and the Semantic Web

- The Task of Information Extraction
 - Automatically **find** the information you're looking for.
 - Pick out the **most useful bits**.
 - **Present** it in preferred manner, at the right level of detail.
 - Semantic Web
 - Web as universal medium for the exchange of information.
 - Not only for humans but also for **software agents**.
 - Main problem today: **lack of semantic data on the Web**.
 - Extraction of information for the Semantic Web
 - Let's use information extraction to produce semantic data.

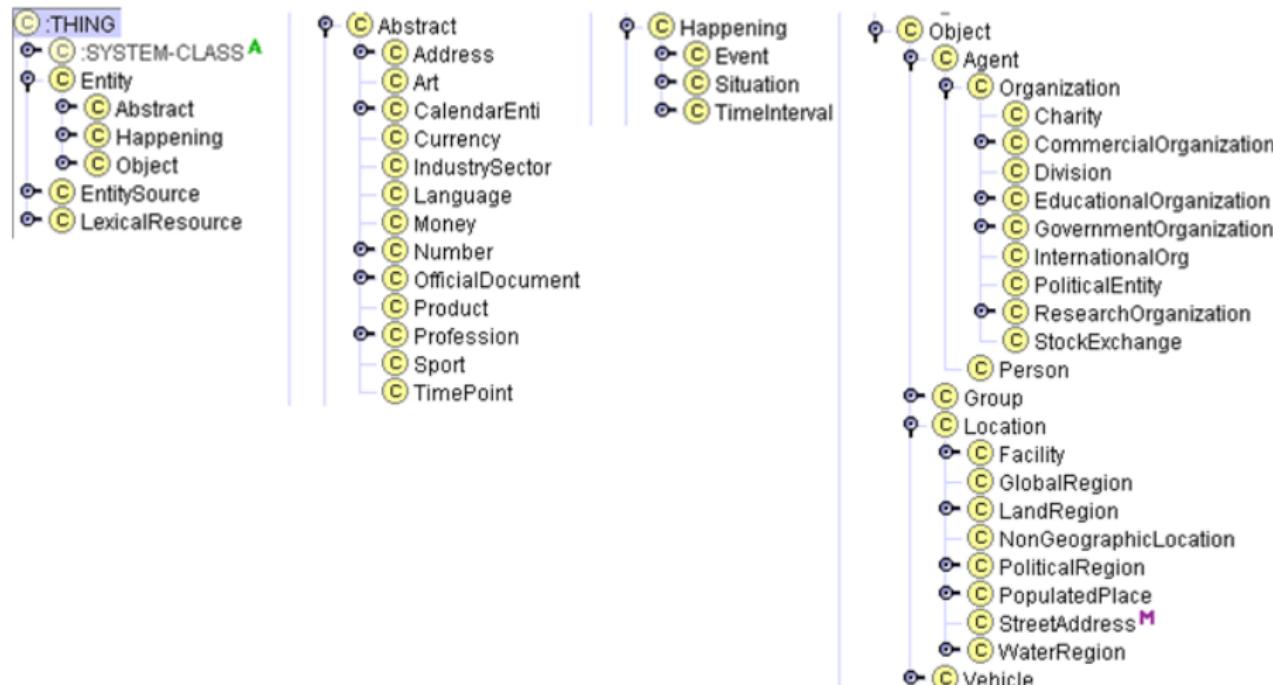
Semantic Web Introduction

We use semantic web **ontologies** to express the semantics.

- RDF, OWL languages
 - Motivated by description logics
 - Concepts or **Classes**
 - Predicates or **Relations**
 - Individuals or **Instances**
 - RDF **triples**: <Subject> <Predicate> <Object>
 - RDF triples form a **named oriented graph**
 - Basic data structure of the Semantic Web

Information Extraction

Ontology (example)



- PROTON (PROTo ONtology)
<http://proton.semanticweb.org/>

Semantic Annotation

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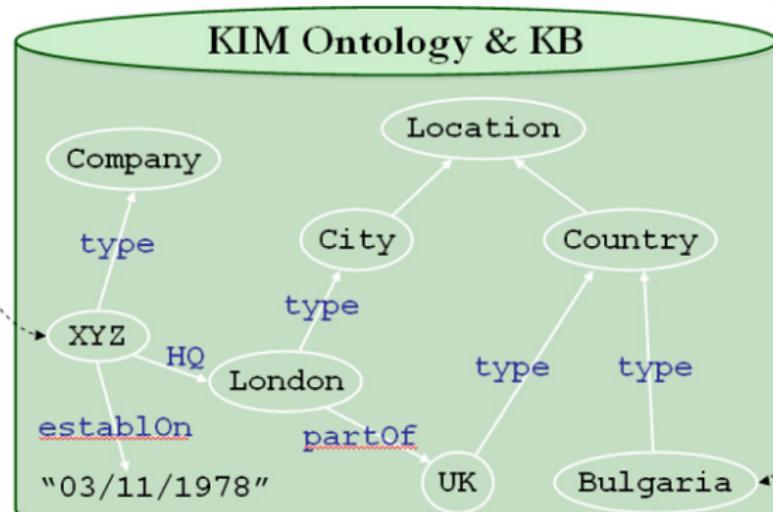
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Semantic Annotation

Semantic Annotation (<http://www.ontotext.com/kim/>)



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Example of the web-page with a report of a fire department

The screenshot shows a news article from the Ministry of the Interior's website. The header includes the logo of the Ministry of the Interior and the text "Ministerstvo vnitra". Below the header, there are navigation links: "home", "navigace", "vyhledávání", and "změna vzhledu". The main content area features a large image of a car accident scene. The title of the news article is "Zpravodajství" (News) and the subtitle is "Informace z resortu o tom, co se stalo, co se děje i co se připravuje" (Information from the ministry about what happened, what is being done, and what is being prepared). The article itself is titled "Hasiči vyjízděli na silnici k obci Česká do Kuřimi na Brněnsku" (Firefighters responded to a road in the village of Česká do Kuřimi near Brno).

HZS Jihomoravského kraje

Zubatého 1, 614 00 Brno, telefon 950 630 111,
<http://www.firebrno.cz>
Zpravodajství v roce 2006

15.05.2007

V trabantu zemřeli dva lidé

K tragické nehodě dnes odpoledne hasiči vyjízděli na silnici z obce Česká do Kuřimi na Brněnsku.



Nehoda byla operačnímu středisku HZS ohlášena ve 13.13 hodin a na místě zasahovala jednotka profesionálních hasičů ze stanice v Tišnově. Jednalo se o čelní srážku autobusu Karosa s vozidlem Trabant 601. Podle dostupných informací trabant jedoucí ve z Brna do Kuřimi zřejmě vylezl do protisměru, kde narazil do linkového autobusu dopravní společnosti ze Žďáru nad Sázavou. Ve zdemolovaném trabantu na místě zemřeli dva muži – 82letý senior a další muž, jehož totožnost zjištují policisté.

Hasiči udělali na vozidle protipožární opatření a po vyšetření a zadokumentování nehody dopravní policií vrak trabantu zaklesnutý pod autobusem pomocí lana odtrhl. Po odstranění střechy trabantu pak z kabiny vyprostili těla obou mužů. Oba vozidla – trabant i autobus, pak postupně odstranili na kraj vozovky a uvolnili tak jeden jízdní pruh. Únik provozních kapalin nebyl zjištěn. Po 16. hodině pomohli vrak trabantu naložit k odvahu a asistovali při odtažení autobusu. Po úklidu vozovky krátce před 16.30 hod. místo nehody předali policistům a ukončili zásah.



Odkazy

Hasiči

- Generální ředitelství
- hl. m. Praha
- Jihomoravský kraj
- Jihomoravský kraj
- Karlovarský kraj
- Královéhradecký kraj
- Liberecký kraj
- Moravskoslezský kraj
- Olomoucký kraj
- Pardubický kraj
- Plzeňský kraj
- Středočeský kraj
- Ústecký kraj
- kraj Vysočina
- Zlínský kraj



V této rubrice Zpravodajství

- Aktualizace stránek
- Archiv zpravodajství
- Bleskové zpravodajství
- RSS
- Boj proti korupci
- Digitální televize
- Hasiči
- Hlavní zprávy
- Ministerstvo
- Od dopisovatelů (neoficiální)
- Policie
- Regiony
- Servis nejen pro novináře
- Schengenská spolupráce
- WebEditorial

Na našem serveru v jiných rubrikách

- Aktuality Národního archivu

Example Tasks

Text of an Accident Report and Contained Information

fire 3 amateur units started at
Požár byl operace na strelce ZS ohlášen dnes ve 2.13
hodin, na místo vyjeli profesionální hasiči ze stanice v
Židlochovicích a dobrovolní hasiči z Židlochovic, Zabčic a
Přísnotic, Oheň, finished at 4:03 troinstalaci u chladícího
boxu, hasiči dostali pod kontrolu ve 2.32 hodin a uhasili tři
minuty po třetí hodině. Příčinou vzniku požáru byla technická
závada, škodu vyšetřovatel předběžně vyčíslil na osm tisíc
korun. damage 8 000 CZK

id_47443

- Information to be extracted is decorated.

Example Tasks

Acquisitions Corpus

- Corporate Acquisition Events
- Acquisitions v1.1 version¹

Key
<input checked="" type="checkbox"/> acqabr
<input checked="" type="checkbox"/> acqbus
<input checked="" type="checkbox"/> acqloc
<input checked="" type="checkbox"/> acquired
<input checked="" type="checkbox"/> dlramt
<input type="checkbox"/> doc
<input checked="" type="checkbox"/> purchabr
<input checked="" type="checkbox"/> purchaser
<input checked="" type="checkbox"/> purchcode

FIRST WISCONSIN <FWB> TO BUY MINNESOTA BANK
MILWAUKEE, Wis., March 26 - First Wisconsin Corp said it plans to acquire Shelard Bancshares Inc for about 25 mln dlsr in cash, its first acquisition of a Minnesota-based bank. First Wisconsin said Shelard is the holding company for two banks with total assets of 168 mln dlsr. First Wisconsin, which had assets at yearend of 7.1 billion dlsr, said the Shelard purchase price is about 12 times the 1986 earnings of the bank. It said the two Shelard banks have a total of five offices in the Minneapolis-St. Paul area.
Reuter

¹from the Dot.com project's resources:

<http://nlp.shef.ac.uk/dot.kom/resources.html>

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Basic Idea

How to extract the information about the damage of the accident?

fire
3 amateur units
started at

Požár byl operací na středisko ZS ohlášen dnes ve **2.13** hodin, na místo vyjeli profesionální hasiči ze stanice v Židlochovicích a dobrovolní hasiči z **Židlochovic, Žabčic a Přísnotic**, Oheň, **finished at 4:03** troinstalaci u chladícího boxu, hasiči dostali pod kontrolu ve **2.32** hodin a uhasili **tři minuty po třetí hodině**. Příčinou vzniku požáru byla technická závada, škodu vyšetřovatel předběžně vyčíslil na **osm tisíc korun.**

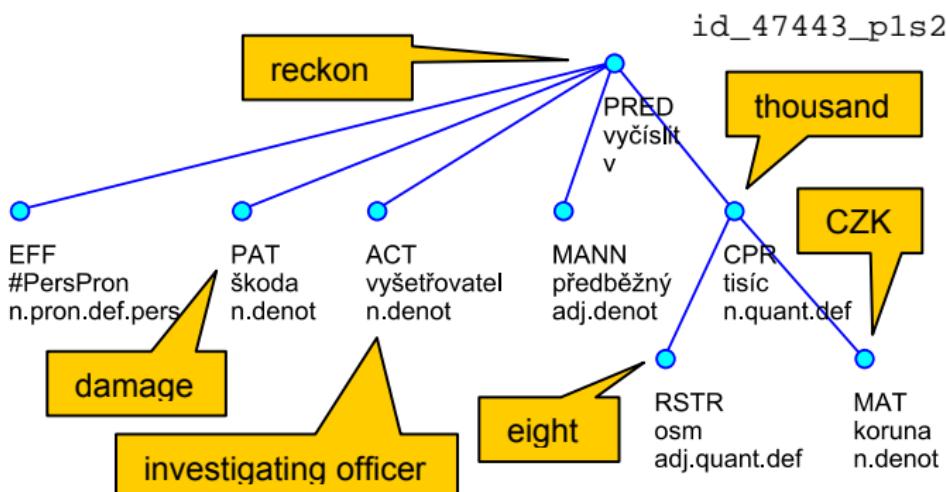
damage 8 000 CZK

id_47443

- How to extract the information about the damage of the accident?
- See the last sentence on the **next slide**.

Basic Idea

Corresponding linguistic tree



..., škodu vyšetřovatel předběžně vyčíslil na osm tisíc korun.

..., investigating officer preliminarily reckoned the damage to be 8 000 CZK.

- Basic Idea: use **tree queries** (tree patterns) to extract the information.

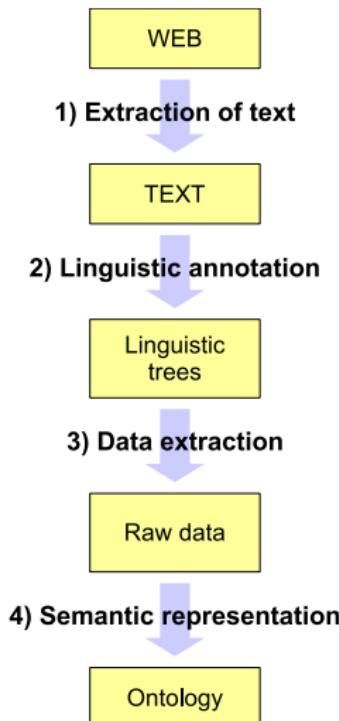
Basic Idea

Introduction of Our Solution

- Extraction of semantic information from texts.
- Exploiting of linguistic tools.
 - Mainly “from” the **Prague Dependency Treebank** project.
 - Related tools – language analyzers (TectoMT), Netgraph, etc.
 - Experiments with the Czech WordNet.
- **Rule based** extraction method.
 - Extraction rules ≈ **tree queries**
 - ILP **learning** of extraction rules

Basic Idea

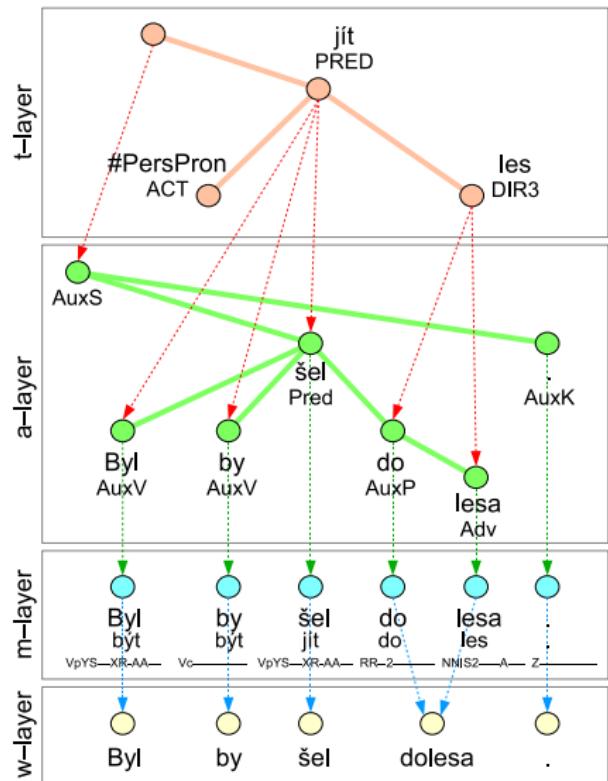
Schema of the extraction process



- ① Extraction of text
 - Using **RSS feed** to download pages.
 - **Regular expression** to extract text.
- ② Linguistic annotation
 - Using **chain** of 6 linguistic tools (see on next slides).
- ③ Data extraction
 - Exploitation of linguistic trees.
 - Using **extraction rules**.
- ④ Semantic representation of data
 - Ontology needed.
 - Semantic interpretation of rules.
 - Far from finished in current state.

Linguistics we Are Using

Layers of linguistic annotation in PDT



- Tectogrammatical layer
- Analytical layer
- Morphological layer
- PDT 2.0 on-line:

<http://ufal.mff.cuni.cz/pdt2.0/>

Sentence:

Byl by šel dolesa.

He-was would went to forest.

Linguistics we Are Using

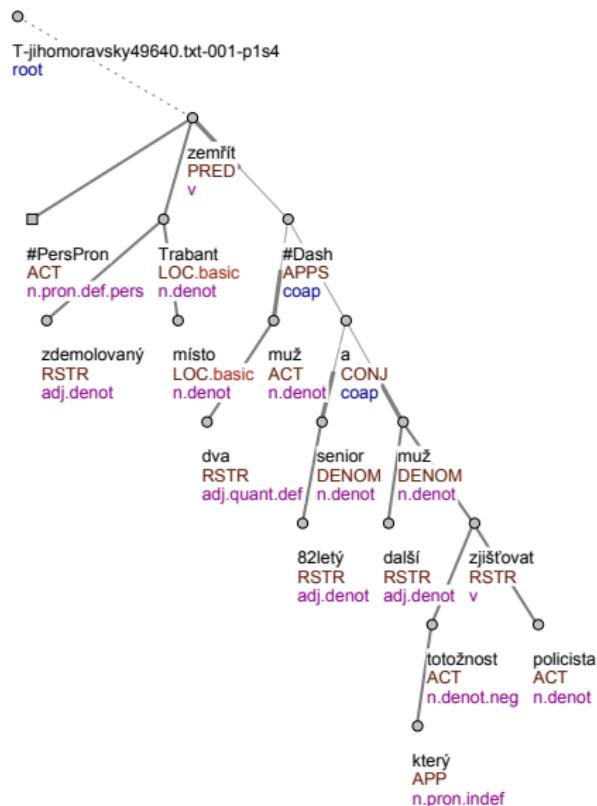
Tools for machine linguistic annotation

- ➊ Segmentation and tokenization
 - ➋ Morphological analysis
 - ➌ Morphological tagging
 - ➍ McDonald's Maximum Spanning Tree parser
– Czech adaptation
 - ➎ Analytical function assignment
 - ➏ Tectogrammatical analysis
– Developed by Václav Klimeš
- Available within the **TectoMT²** project

²<http://ufal.mff.cuni.cz/tectomt/>

Linguistics we Are Using

Example of an output tectogrammatical tree



- Lemmas
- Functors
- Semantic parts of speech

Sentence:

Ve zdemolovaném trabantu na místě zemřeli dva muži – 82letý senior a další muž, jehož totožnost zjišťují policisté.

Two men died on the spot in demolished trabant – ...

Manually Created Rules

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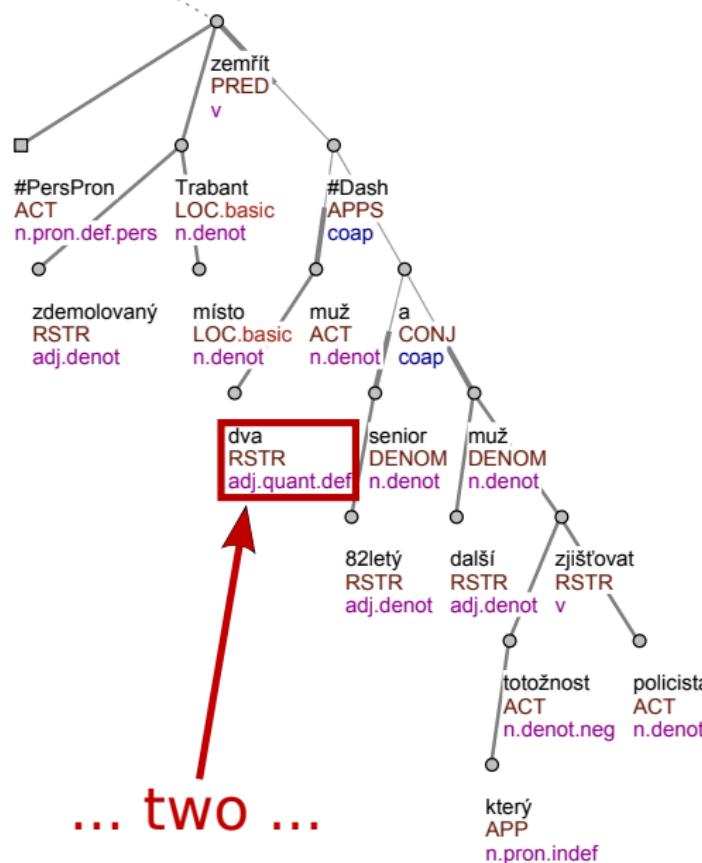
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.

T-jihomoravsky49640.txt-001-p1s4

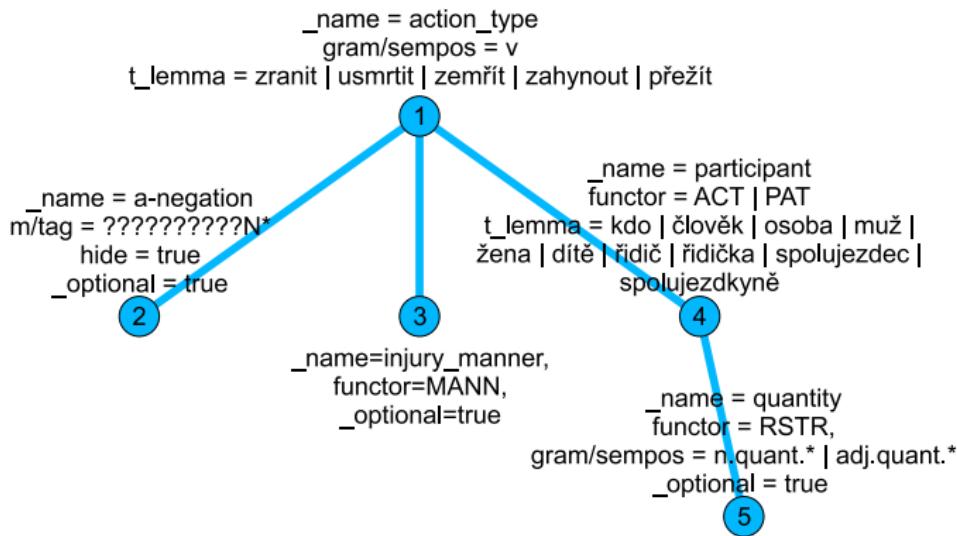
root



- How to extract the information about **two dead people**?

Manually Created Rules

Extraction rules – Netgraph queries



- Tree patterns on **shape** and **nodes** (on node attributes).
- Evaluation gives **actual matches** of particular nodes.
- Names** of nodes allow use of references.

Manually Created Rules

Raw data extraction output

```

<QueryMatches>
  <Match root_id="T-vysocina63466.txt-001-pls4" match_string="2:0,7:3,8:4,11:2">
    <Sentence>
      Při požáru byla jedna osoba lehce zraněna - jednalo se
      o majitele domu, který si vykloubil rameno.
    </Sentence>
    <Data>
      <Value variable_name="action_type" attribute_name="t_lemma">zranit</Value>
      <Value variable_name="injury_manner" attribute_name="t_lemma">lehký</Value>
      <Value variable_name="participant" attribute_name="t_lemma">osoba</Value>
      <Value variable_name="quantity" attribute_name="t_lemma">jeden</Value>
    </Data>
  </Match>
  <Match root_id="T-jihomoravsky49640.txt-001-pls4" match_string="1:0,13:3,14:4">
    <Sentence>
      Ve zdemolovaném trabantu na místě zemřeli dva muži - 82letý senior
      a další muž, jehož totožnost zjišťují policisté.
    </Sentence>
    <Data>
      <Value variable_name="action_type" attribute_name="t_lemma">zemřít</Value>
      <Value variable_name="participant" attribute_name="t_lemma">muž</Value>
      <Value variable_name="quantity" attribute_name="t_lemma">dva</Value>
    </Data>
  </Match>
  <Match root_id="T-jihomoravsky49736.txt-001-p4s3" match_string="1:0,3:3,7:1">
    <Sentence>Čtyřiatřicetiletý řidič nebyl zraněn.</Sentence>
    <Data>
      <Value variable_name="action_type" attribute_name="t_lemma">zranit</Value>
      <Value variable_name="a-negation" attribute_name="m/tag">VpYS---XR-[N]A---

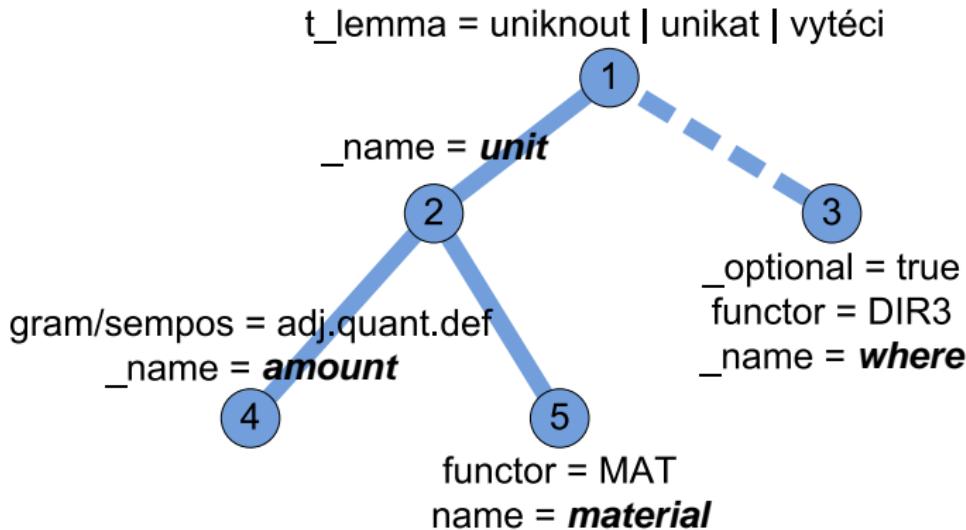
```



SELECT action_type.t_lemma, a-negation.mtag, injury_manner.t_lemma,
 participant.t_lemma, quantity.t_lemma **FROM ***extraction rule*****

Manually Created Rules

Extraction rules – Environment Protection Use Case

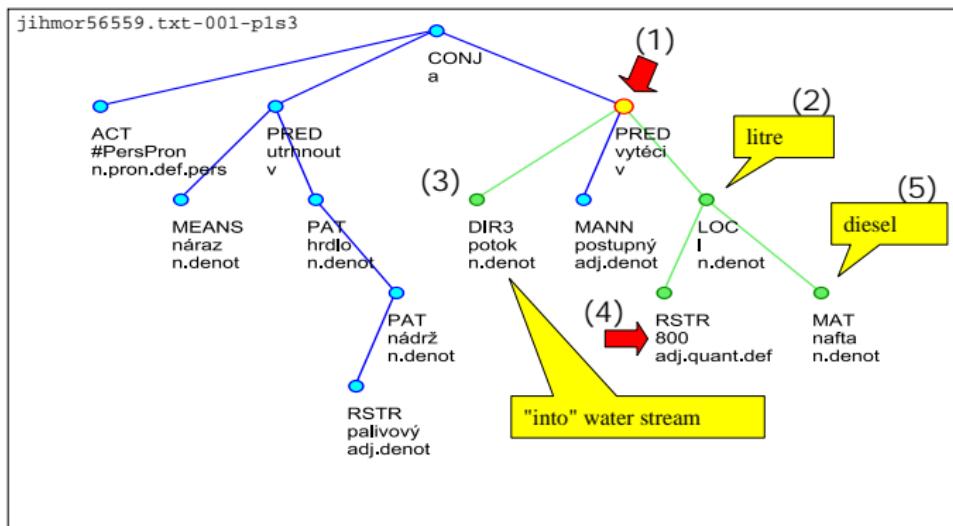


Manually Created Rules

Matching Tree

"Due to the clash the throat of fuel tank tore off and 800 litres of oil (diesel) has run out to a stream."

"Nárazem se utrhlo hrdlo palivové nádrže a do potoka postupně vytéklo na 800 litrů nafty."



Manually Created Rules

Raw data extraction output

```

<QueryMatches>
  <Match root_id="jihmor56559.txt-001-pls3" match_string="15:0,16:4,22:1,23:2,27:3">
    <Sentence>Nárazem se utrhl hrdlo palivové nádrže a do potoka postupně vytéklo na
    800 litrů nafty.</Sentence>
    <Data>
      <Value variable_name="amount" attribute_name="t_lemma">800</Value>
      <Value variable_name="unit" attribute_name="t_lemma">l</Value>
      <Value variable_name="material" attribute_name="t_lemma">nafta</Value>
      <Value variable_name="where" attribute_name="t_lemma">potok</Value>
    </Data>
  </Match>
  <Match root_id="jihmor68220.txt-001-pls3" match_string="3:0,12:4,21:1,22:2,27:3">
    <Sentence>Z palivové nádrže vozidla uniklo do půdy v příkopu vedle silnice zhruba
    350 litrů nafty, a proto byli o události informováni také pracovníci odboru životního
    prostředí Městského úřadu ve Vyškově a České inspekce životního prostředí.</Sentence>
    <Data>
      <Value variable_name="amount" attribute_name="t_lemma">350</Value>
      <Value variable_name="unit" attribute_name="t_lemma">l</Value>
      <Value variable_name="material" attribute_name="t_lemma">nafta</Value>
      <Value variable_name="where" attribute_name="t_lemma">půda</Value>
    </Data>
  </Match>
  ...

```

SELECT amount.t_lemma, unit.t_lemma, material.t_lemma, where.t_lemma

FROM ***extraction rule***

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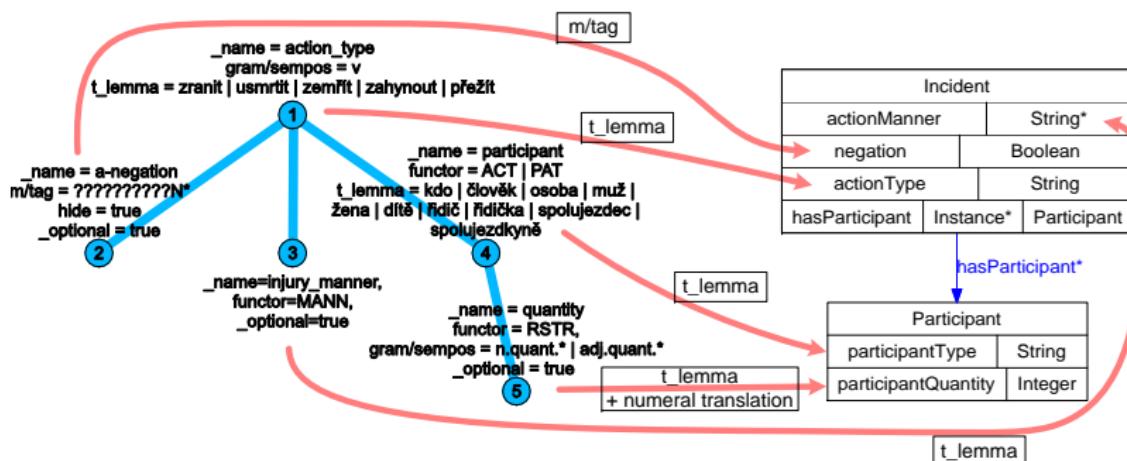
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Semantic Interpretation

Semantic interpretation of extraction rules



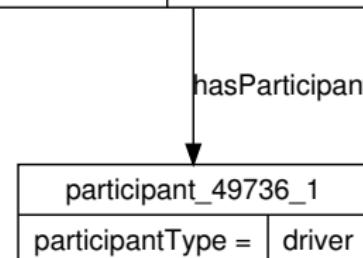
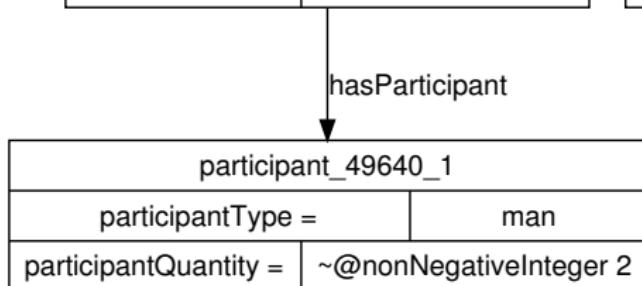
- Determines how particular values of attributes are used.
- Gives semantics to extraction rule.
- Gives semantics to extracted data.

Semantic Interpretation

Semantic data output

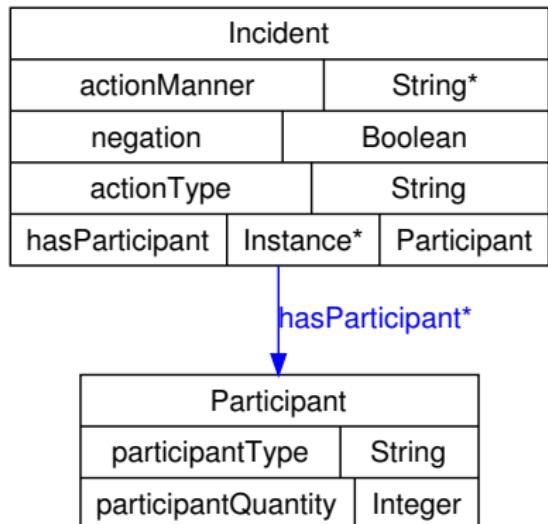
incident_49640	
negation =	false
actionType =	death
hasParticipant =	participant_49640_1

incident_49736	
negation =	true
actionType =	injury
hasParticipant =	participant_49736_1



- Two instances of two ontology classes.

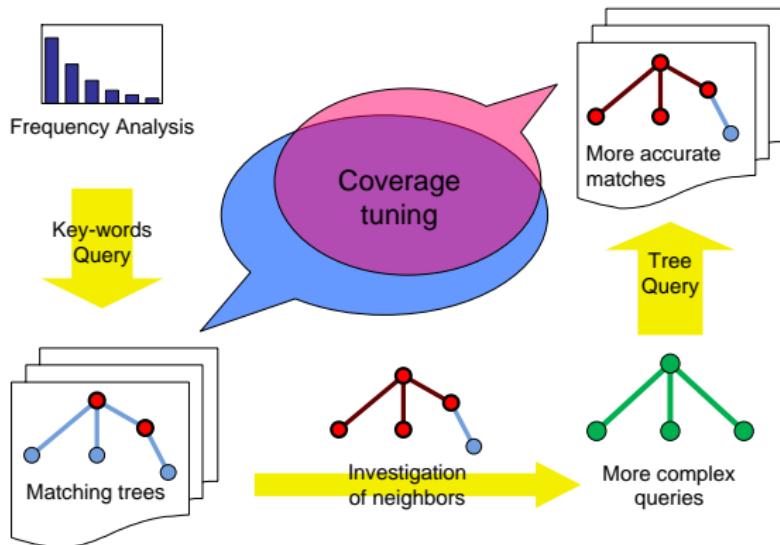
The experimental ontology



- Two **classes**
 - Incident and Participant
- One **object property** relation
 - hasParticipant
- Five **datatype property** relations
 - actionManner
(light or heavy injury)
 - negation
 - actionType
(injury or death)
 - participantType
(man, woman, driver, etc.)
 - participantQuantity

Semantic Interpretation

Design of extraction rules – iterative process



- ➊ Frequency analysis → representative key-words.
- ➋ Investigating of matching trees → tuning of tree query.
- ➌ Complexity of the query \cong complexity of extracted data.

Corpus of Fire-department articles

- Fire-department articles
- Published by The Ministry of Interior of the Czech Republic³
- Processed more than 800 articles from different regions of Czech Republic
- 1.2 MB of textual data
- Linguistic tools produced 10 MB of annotations, run time 3.5 hours
- Extracting information about injured and killed people
- 470 matches of the extraction rule, 200 numeric values of quantity (described later)

³<http://www.mvcr.cz/rss/regionhzs.html>

Learning of Rules

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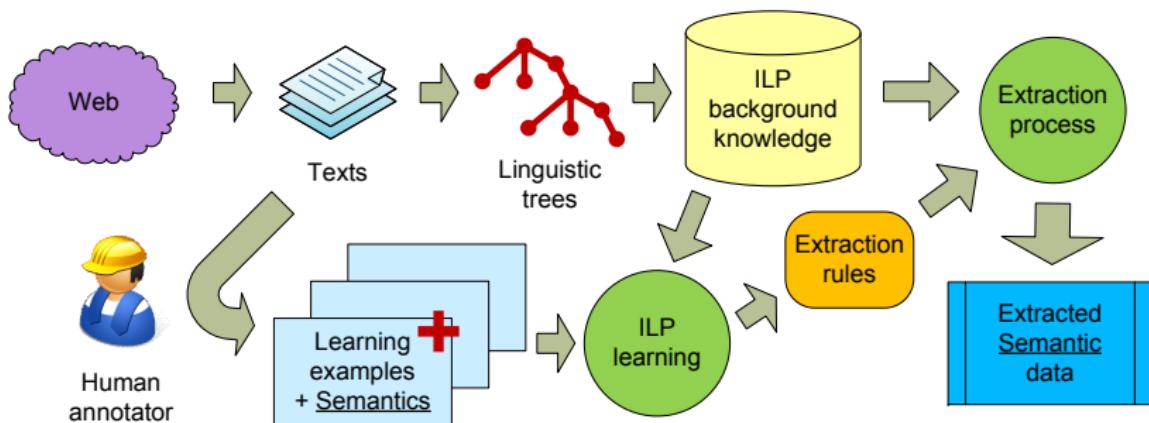
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Inductive Logic Programming

- Inductive Logic Programming (ILP)
 - is a Machine Learning procedure for **multirelational** learning
 - Heuristic and iterative method, learning is usually slow
 - It is capable to deal with graph or **tree structures** naturally
 - Learns from positive and negative **examples**
 - Positive and negative **tree nodes**
 - It is necessary to **label tree nodes** from corresponding labeled text (not trivial problem)
- Learned rules are strict (no weights, probabilities, etc.)
 - Easier human understanding, modification
 - Possibility of sharing of rules amongst different tools
 - Lower performance (precision, recall)

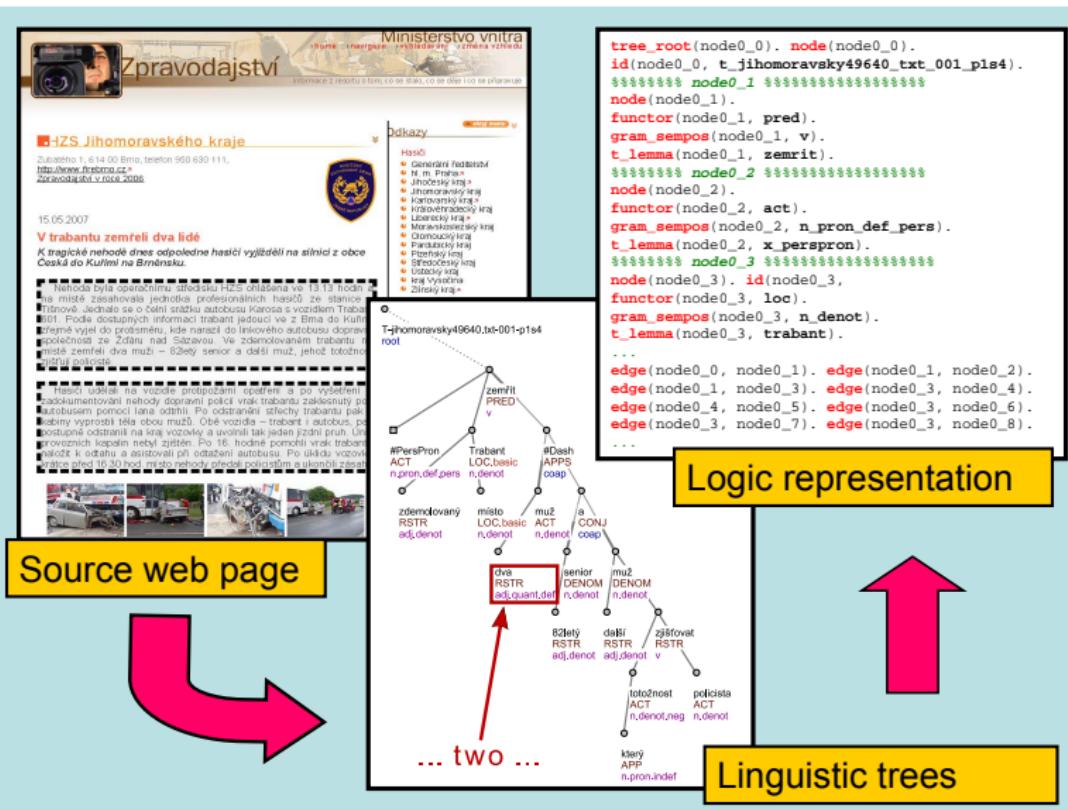
Learning of Rules

Integration of ILP in our extraction process



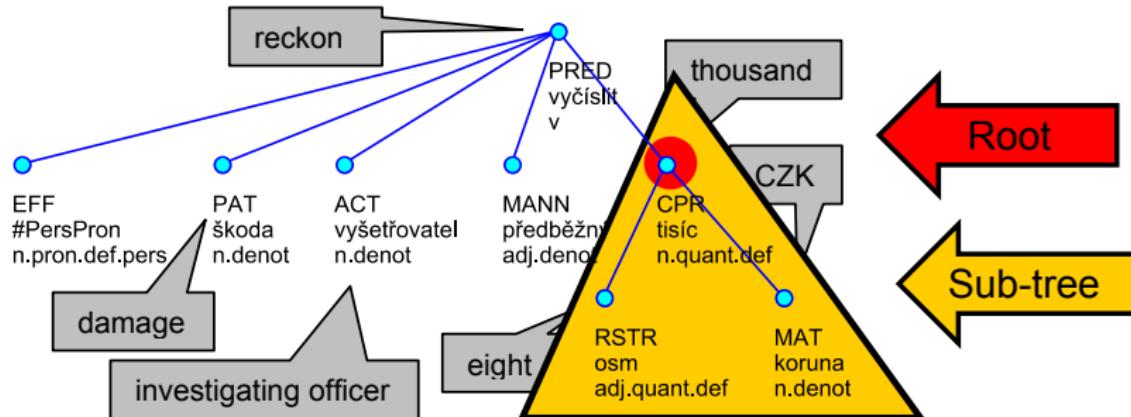
- Main point: transformation of trees to **logic representation**.
- Human annotator does **not** need to be a linguistic **expert**.

Logic representation of linguistic trees



Learning of Rules

Root/Subtree Preprocessing/Postprocessing (Chunk learning)



..., škodu vyšetřovatel předběžně vyčíslil na **osm tisíc korun**.

..., investigating officer preliminarily reckoned the damage to be
eight thousand **Crowns** (CZK).

Examples of learned rules, Czech words are translated.

Example

[Rule 1] [Pos cover = 14 Neg cover = 0]

```
damage_root(A) :- lex_rf(B,A), has_sempos(B,'n.quant.def'),  
    tDependency(C,B), tDependency(C,D),  
    has_t_lemma(D,'investigator').
```

[Rule 2] [Pos cover = 13 Neg cover = 0]

```
damage_root(A) :- lex_rf(B,A), has_functor(B,'TOWH'),  
    tDependency(C,B), tDependency(C,D), has_t_lemma(D,'damage').
```

[Rule 1] [Pos cover = 7 Neg cover = 0]

```
injuries(A) :- lex_rf(B,A), has_functor(B,'PAT'),  
    has_gender(B,anim), tDependency(B,C), has_t_lemma(C,'injured').
```

[Rule 8] [Pos cover = 6 Neg cover = 0]

```
injuries(A) :- lex_rf(B,A), has_gender(B,anim), tDependency(C,B),  
    has_t_lemma(C,'injure'), has_negation(C,neg0).
```

Evaluation

Evaluation results

task/method	matching	missing	excess	overlap	prec.%	recall%	F1.0%
damage/ILP	14	0	7	6	51.85	70.00	59.57
damage/ILP – lenient measures					74.07	100.00	85.11
dam./ILP-roots	16	4	2	0	88.89	80.00	84.21
damage/Paum	20	0	6	0	76.92	100.00	86.96
injuries/ILP	15	18	11	0	57.69	45.45	50.85
injuries/Paum	25	8	54	0	31.65	75.76	44.64
inj./Paum-afun	24	9	38	0	38.71	72.73	50.53

- 10-fold cross validation
- Two tasks: ‘damage’ and ‘injuries’
- Root/subtree preprocessing/postprocessing used for ‘damage’ task

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3 Implementation Details

- Integration of Linguistic Tools (GATE)
- Integration with Semantic Tools
- Conclusion

Integration of Linguistic Tools (GATE)

GATE

- GATE: General Architecture for Text Engineering
- The University of Sheffield
- <http://gate.ac.uk/>
- Implemented **Batch TectoMT Language Analyzer**
 - Transformation of PDT annotations to GATE
- **Netgraph** used as a tree viewer
 - Works also for Standford Dependencies

Integration of Linguistic Tools (GATE)

PDT in GATE

Požár byl operačním středisku HZS ohlášen dnes ve 2.13 hodin, na místo vyjeli profesionální hasiči ze stanice v Židlochovicích a dobrovolní hasiči z Židlochovic, Žabčic a Příšnotic, Oheň, kteří zasáhli elektroinstalaci u chladicího boxu, hasiči dostali pod kontrolu ve 2.32 hodin a uhasili tři minuty po třetí hodině. Přičinou vzniku požáru byla technická závada, škodu vyšetřovatel předběžně vyčíslil na osm tisíc korun.

Type	Set	Start	End	Id	
Token	TectoMT	2	7	2	{afun=Sb, ann_id=2, form=Požár, hidden=true, lemma=požár, type=TectoMT}
tDependency	TectoMT	2	44	278	{args=[125, 108]}
tToken	TectoMT	2	7	108	{ann_id=108, deppord=1, formeme=n:1, functor=PAT, gender=neut, type=TectoMT}
aDependency	TectoMT	2	44	279	{args=[7, 2]}
Sentence	TectoMT	2	319	1	{}
Token	TectoMT	8	11	3	{afun=AuxV, ann_id=3, form=byl, hidden=true, lemma=být, type=TectoMT}
auxRfDependency	TectoMT	8	44	205	{args=[125, 3]}
aDependency	TectoMT	8	44	280	{args=[7, 3]}
Token	TectoMT	12	22	4	{afun=Atr, ann_id=4, form=operačnímu, hidden=true, lemma=středisku, type=TectoMT}
tDependency	TectoMT	12	32	281	{args=[121, 119]}
tToken	TectoMT	12	22	119	{ann_id=119, deppord=2, degcmp=pos, formeme=adj:attr, functor=NNIS1, type=TectoMT}
aDependency	TectoMT	12	32	282	{args=[5, 4]}
Token	TectoMT	23	32	5	{afun=Obj, ann_id=5, form=středisku, hidden=true, lemma=středisko, type=TectoMT}
tDependency	TectoMT	23	36	283	{args=[121, 123]}
tDependency	TectoMT	23	44	284	{args=[125, 121]}
tToken	TectoMT	23	32	121	{ann_id=121, deppord=3, functor=ADDR, gender=neut, lex.rf=1, type=TectoMT}
aDependency	TectoMT	23	44	286	{args=[7, 5]}
aDependency	TectoMT	23	36	285	{args=[5, 6]}

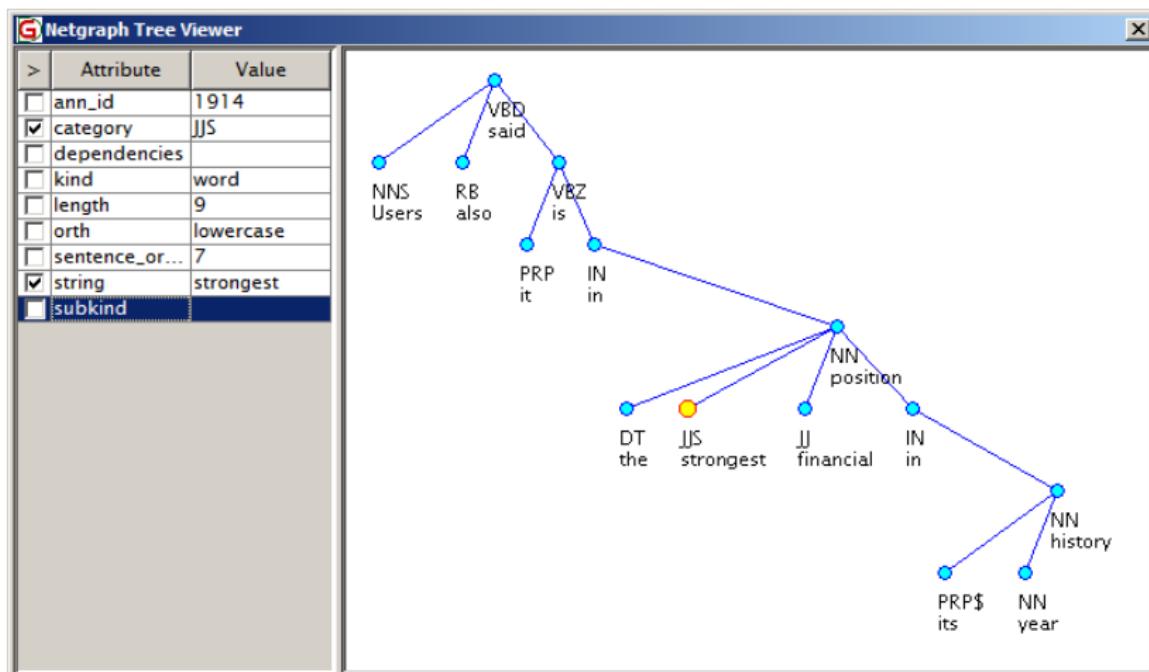
▼ TectoMT

- Sentence
- Token
- aDependency
- auxRfDependency
- tDependency
- tToken

The PDT annotation tool interface shows a list of tokens from the TectoMT set. Each token is represented by a row with fields: type, set, start, end, id, and a detailed description. A detailed view of token 2 is shown on the right, with fields like afun, ann_id, form, hidden, lemma, ord, sentence_order, tag, and type. Below the list is a button labeled "Open Search & Annotate tool".

Integration of Linguistic Tools (GATE)

Netgraph Tree Viewer in GATE (for Stanford Dependencies)



Sentence: Users also said it is in the strongest financial position in its 24-year history.

Integration with Semantic Tools

1 Problem

- Information Extraction
- Semantic Annotation
- Example Tasks

2 Solution

- Basic Idea
- Linguistics we Are Using
- Manually Created Rules
- Semantic Interpretation
- Learning of Rules
- Evaluation

3 Implementation Details

- Integration of Linguistic Tools (GATE)
- **Integration with Semantic Tools**
- Conclusion

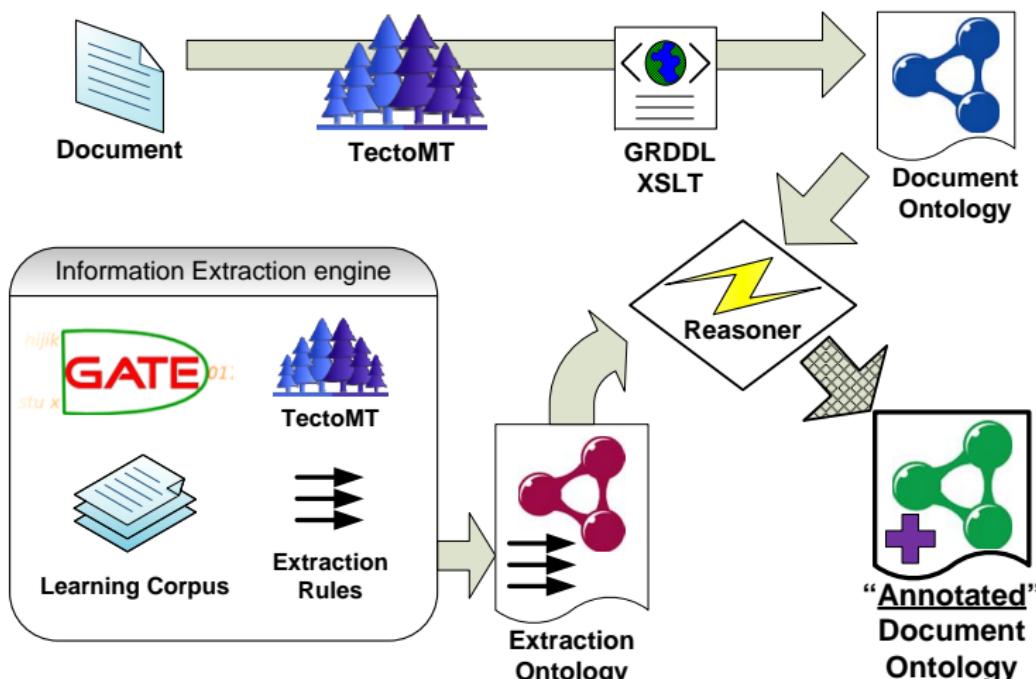
Integration with Semantic Tools

Transformation of PML to RDF

- Quite simple XSLT transformation
- Allows working with PDT annotations inside Semantic Web tools
 - Ontology Editors
 - Reasoners
 - Query tools (graph queries)
 - ?Visualization and navigation tools?
- In our case interpretation of extraction rules by a OWL reasoner

Integration with Semantic Tools

Extraction Rules Interpreted by OWL Reasoner



- Tool **independent** extraction ontologies

Integration with Semantic Tools

PDT in The Protégé Ontology Editor

Description: node/SCzechA-s4-w13

Types	+
MentionRoot	(@ X O)
Node	(@ X O)
Thing	(@ X O)

Same individuals +

Different individuals +

Members list: node/SCzechA-s4-w13

+	X
node/SCzechA-s4-w1	
node/SCzechA-s4-w10	
node/SCzechA-s4-w11	
node/SCzechA-s4-w12	
node/SCzechA-s4-w13	(selected)
node/SCzechA-s4-w14	
node/SCzechA-s4-w15	
node/SCzechA-s4-w16	
node/SCzechA-s4-w2	
node/SCzechA-s4-w3	
node/SCzechA-s4-w4	
node/SCzechA-s4-w5	
node/SCzechA-s4-w6	
node/SCzechA-s4-w7	
node/SCzechA-s4-w8	
node/SCzechA-s4-w9	

Property assertions: node/SCzechA-s4-w13

Object property assertions	+
hasParent node/SCzechA-s4-w12	(@ X O)
m.rf node/SCzechM-s4-w13	(@ X O)
hasChild node/SCzechA-s4-w14	(@ X O)

Data property assertions	+
mention_root "damage"	(@ X O)
lemma "osm1408"	(@ X O)
edge_toCollapse "1"^^PlainLiteral	(@ X O)
ord "13"	(@ X O)
afun "Obj"	(@ X O)
edge_toCollapse "1"	(@ X O)
afun "Obj"^^PlainLiteral	(@ X O)
form "osm"	(@ X O)
tag "Cn-S4-----"^^PlainLiteral	(@ X O)
isAuxiliary "0"	(@ X O)
form "osm"^^PlainLiteral	(@ X O)
isAuxiliary "0"^^PlainLiteral	(@ X O)
tag "Cn-S4-----"	(@ X O)
lemma "osm`8"^^PlainLiteral	(@ X O)
ord "13"^^PlainLiteral	(@ X O)

Negative object property assertions +

Negative data property assertions +

Integration with Semantic Tools

Examples of extraction rules in the native Prolog format.

[Rule 1] [Pos cover = 23 Neg cover = 6]

```
mention_root(acquired,A) :-  
    'lex.rf'(B,A), t_lemma(B,'Inc'), tDependency(C,B),  
    tDependency(C,D), formeme(D,'n:in+X'), tDependency(E,C).
```

[Rule 11] [Pos cover = 25 Neg cover = 6]

```
mention_root(acquired,A) :-  
    'lex.rf'(B,A), t_lemma(B,'Inc'), tDependency(C,B),  
    formeme(C,'n:obj'), tDependency(C,D), functor(D,'APP').
```

[Rule 75] [Pos cover = 14 Neg cover = 1]

```
mention_root(acquired,A) :-  
    'lex.rf'(B,A), t_lemma(B,'Inc'), functor(B,'APP'),  
    tDependency(C,B), number(C,pl).
```

Integration with Semantic Tools

Examples of extraction rules in Protégé 4 – Rules View's format

[Rule 1]

```
lex.rf(?b, ?a), t_lemma(?b, "Inc"), tDependency(?c, ?b),  
tDependency(?c, ?d), formeme(?d, "n:in+X"),  
tDependency(?c, ?e)  
    -> mention_root(?a, "acquired")
```

[Rule 11]

```
lex.rf(?b, ?a), t_lemma(?b, "Inc"), tDependency(?c, ?b),  
formeme(?c, "n:obj"), tDependency(?c, ?d), functor(?d, "APP")  
    -> mention_root(?a, "acquired")
```

[Rule 75]

```
lex.rf(?b, ?a), t_lemma(?b, "Inc"), functor(?b, "APP"),  
tDependency(?c, ?b), number(?c, "pl")  
    -> mention_root(?a, "acquired")
```

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Summary

- Implemented a system for extraction of semantic information
- Based on third party linguistic tools (**TectoMT**⁴)
- Extraction rules adopted from **Netgraph**⁵ application.
- **ILP** used for learning rules.
- All methods integrated inside **GATE**⁶.
- Main advantages:
 - Automated selection of learning features
 - “Language independent”
 - Rule based

⁴<http://ufal.mff.cuni.cz/tectomt/>

⁵<http://quest.ms.mff.cuni.cz/netgraph/>

⁶<http://gate.ac.uk/>

Future work

- Use some **Knowledge Base** (e.g. WordNet).
- Adaptation of this method on **other languages**.
- Evaluation of the method on **other datasets**.
- Be able to provide **more semantics**.
 - e.g. sophisticated semantic interpretation of extracted data