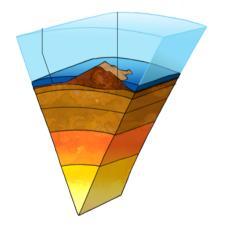
## **Towards Deep Universal Dependencies**



Kira Droganova, Daniel Zeman

{droganova,zeman}@ufal.mff.cuni.cz http://universaldependencies.org/

# Multiple Layers of Dependencies

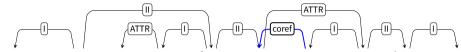


#### Form

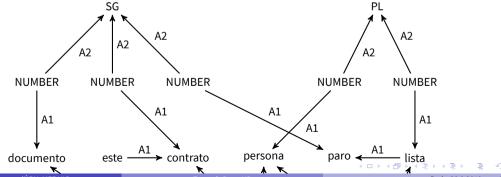
- Surface syntax
- Deep syntax
- Semantics

Meaning

## **Meaning-Text Theory**

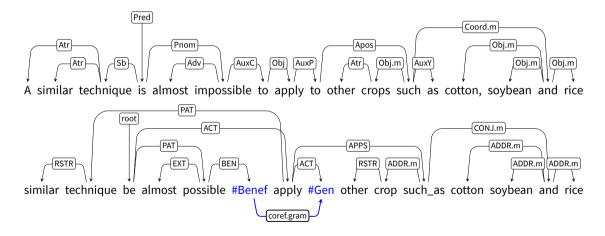


documento proponer este contrato afectar persona persona engrosar lista paro document suggest this contract affect person person enlarge list unemployed "The document suggests that this contract affect the persons who make the unemployment lists swell."

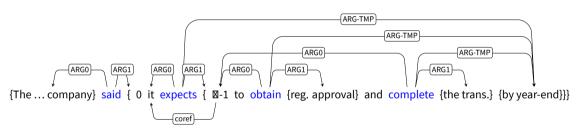


Daniel Zeman (ÚFAL MFF UK)

## Functional Generative Description (Prague Tectogrammatics)

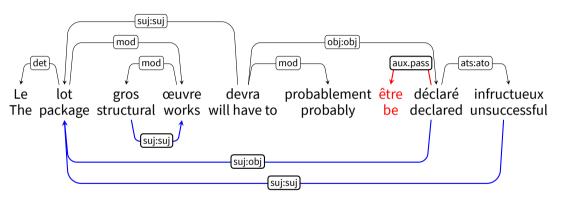


## **Proposition Banks**



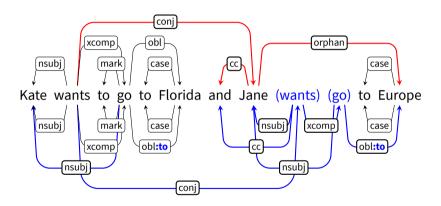
"The thrift holding company said it expects to obtain regulatory approval and complete the transaction by year-end."

## Sequoia



"The structural system package should probably be declared unsuccessful."

## **Universal Dependencies**



## **Multilingual Annotation**

- MTT: Russian, 器 English, Spanish, French
- FGD: Czech, English

- Sequoia: III French

## **Multilingual Annotation**

- MTT: Russian, K English, D Spanish, T French
- **FGD:** Czech, **English**

- Sequoia: III French
- Enhanced UD: ☐ Arabic, ☐ Bulgarian, ☐ Czech, ☐ Dutch, ☒ English, ☐ Estonian,
   ☐ Finnish, ☐ Italian, ☐ Latvian, ☐ Lithuanian, ☐ Polish, ☐ Russian, ☐ Slovak,
   ☐ Swedish, ☐ Tamil, ☐ Ukrainian

# Basic Universal Dependencies: 82 Languages and Growing

- I.-E.: Armenian, ≦ Ancient Greek, Greek, ≦ Breton, I Irish, ≦ Welsh
  - ▶ Germanic: ➤ Afrikaans, ➡ Danish, ➡ Dutch, ☒ English, ➡ Faroese, ➡ German,
     ➡ Gothic, ➡ Norwegian, ➡ Swedish

  - Balto-Slavic: Belarusian, Bulgarian, Croatian, Czech, Church Slavonic,
     Old Russian, Polish, Russian, Serbian, Slovak, Slovenian, Ukrainian,
     Upper Sorbian, Latvian, Lithuanian
  - 🕨 Indo-Iranian: 🚾 Kurmanji, 🔤 Persian, 🔤 Hindi, Marathi, Sanskrit, 📧 Urdu
- 💿 Uralic: 🚃 Erzya, 💳 Estonian, 🎛 Finnish, 🚍 Hungarian, 💳 Karelian, 💻 Komi, 💶 Sámi
- Dravidian: Tamil, Telugu
- Turkic: Kazakh, Turkish, Turkish
- Af.-As.: Akkadian, Amharic, Arabic, Assyrian, Coptic, Abelian, Maltese
- Sino-Tibetan: 🔼 Cantonese, 🛌 Classical Chinese, 🍱 Chinese; Aus.-As.: 🔼 Vietnamese
- Other: Buryat, Japanese, Korean, Basque, Sw. Sign, Naija, Bambara,
   Wolof, Yoruba, Warlpiri, Mbyá Guaraní

## Two-Speed Approach

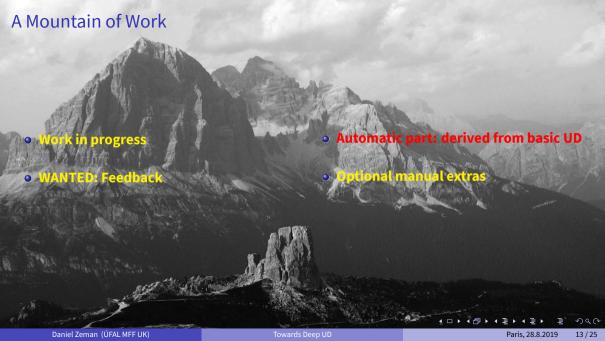
- Automatic part: derived from basic UD
- Optional manual extras



#### A Mountain of Work

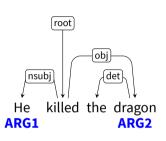
- Work in progress
  - Only the automatic part now

WANTED: Feedback

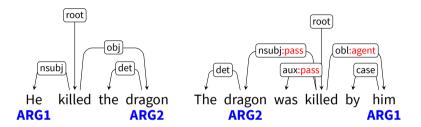


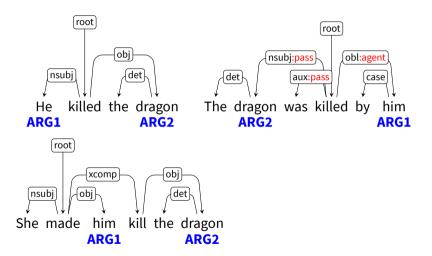
### Automatic vs. Manual Annotation

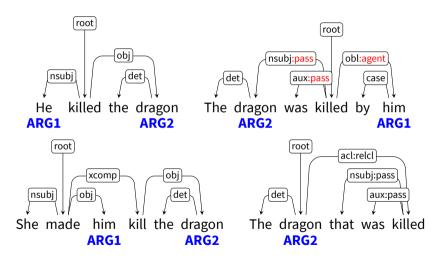
- Automatically derived from UD:
  - Enhanced Universal Dependencies
    - ★ Grammatical coreference (partially)
    - ★ Ellipsis: gapping
  - Normalize syntactic alternations (cf. Candito et al. 2017)
  - ► Ellipsis: pro-drop
- Manual or with extra resources:
  - ► Frames, semantic roles
  - ► Textual coreference
  - ► Everything else...
  - ... and improve the automatic part above











## **Numbered Arguments**

- Like in PropBank. Numbers can be mapped to semantic roles if we have a valency dictionary
- Degree of salience of arguments derived from surface syntax:
  - Subject of active clause ⇒ ARG1
  - ▶ Direct object of active clause ⇒ ARG2
  - ► Indirect object of active clause ⇒ ARG3
  - Subject of passive clause ⇒ ARG2
  - etc...

#### **Predicate Identfiers**

- They could be sense/frame identifiers
- But now we just take lemmas
- Exception:
  - Germanic phrasal verbs: come\_up
  - ▶ Inherently reflexive verbs: [cs] smát\_se "laugh"
  - Other compound verbs (incl. light & serial verb constructions)

### **Enhanced UD: Five Enhancements**

- Null nodes for gapping (12 treebanks)
- Dependency propagation in coordination (22 treebanks)
- External subjects of controlled predicates (12 treebanks)
- Cyclic dependencies to/from relative clauses (9 treebanks)
- Enhanced dependency labels (case information) (10 treebanks)
- All 5 types: 6 treebanks, 3 languages
- At least 1 type: 24 treebanks, 16 languages
- Only basic UD: 122 treebanks

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## We apply Stanford Enhancer to all UD treebanks.

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Daniel Zeman (ÚFAL MFF UK) Towards Deep UD Paris, 28.8.2019

### Our "Enhanced Plus"

- Enhanced UD help us identify more predicate-argument relations
- But some patterns are still not handled...
- Adverbial infinitives
  - They will meet to discuss a contract.
  - ▶ But not ccomp infinitives: *He recommended to replace the tyres.*

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19 / 25

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  - Terrorists detonated a bomb killing five people.
- Attributive participles
  - ► The shares reflected on your statement.

19 / 25

Daniel Zeman (ÚFAL MFF UK) Towards Deep UD Paris, 28.8.2019

## **Summary and Next Steps**

- Deep UD 2.4 (http://hdl.handle.net/11234/1-3022)
- 121 treebanks of 73 languages
- Enhanced graphs in all treebanks
- (Enhanced Plus: infinitives, gerunds, participles)
- Normalized active-passive
- Can be regenerated after each UD release

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- 121 treebanks of 73 languages
- Enhanced graphs in all treebanks
- (Enhanced Plus: infinitives, gerunds, participles)
- Normalized active-passive
- Can be regenerated after each UD release
- Evaluate precision and recall (no gold standard yet)
- Test mapping to a valency dictionary
- Oblique arguments?
- Other alternations than passives?
- Non-verbal predicates
- ...

## Future: Link Arguments to Frame Dictionaries

#### kill

#### kill ACT() PAT() ?MEANS()

- . "Kill it," he says.
- "Ford probably would try "trace" to kill the proposal by enlisting support from U.S. takeover-stock speculators and holding out the carrot of a larger bid later, said Stephen Reitman, European auto analyst at London brokers UBS Phillips & Drew.
- · John killed Mary with a lead pipe, in the conservatory,

#### Corpus example(s):

Close [X]

pedt She ACT was untrained and, in one botched job killed a PAT client PAT.

pedt Dallas District Judge Jack Hampton had sparked calls for a judicial inquiry with his remarks to the press last December, two weeks after \*-1 sentencing an 18-year-old defendant to 30 years in state prison **for** \*-2 **killing** two homosexual **men pAT** in a city park.

pedt The judge was quoted \*-1 as \*-4 referring to the victims←paT as ``queers" and \*-4 saying **they paT would**n't **have been killed** \*-2 ``if they hadn't been cruising the streets \*-3 picking up teenage boys."

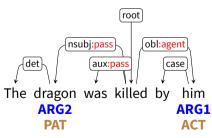
pedt Strong dividend growth, he says \*T\*-1, is ``the black widow of valuation" – a reference to the female  $spiders \leftarrow_{ACT} that_{ACT}$  \*T\*-231 attract  $males \leftarrow_{PAT}$  and then  $kill them_{PAT}$  after matting.

pedt Instead, Mr. Nixon reminded his host, Chinese President Yang Shangkun, that Americans haven't forgiven China's leaders for the military assault—ACT of June 3-4 that ACT "T"-241 killed hundreds PAT, PAT and perhaps thousands PAT, PAT of demonstrators.

#### EngVallex

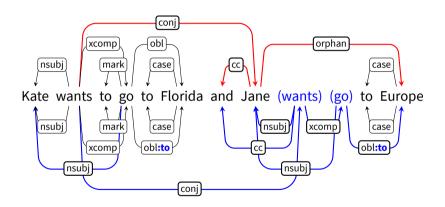
(http://lindat.mff.cuni.cz/services/ EngVallex/EngVallex.html)

- Select the correct frame of the verb
- Map observed arguments to frame slots
  - Use their syntactic function
  - Use their morphological form

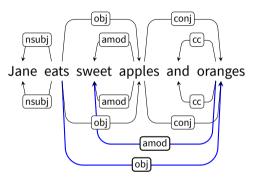


# Thanks! Merci!

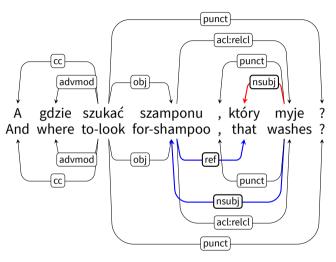
#### **Enhanced UD**



## **Enhanced UD**



#### **Enhanced UD**



"And where to look for shampoo that works?"