# Something from nothing

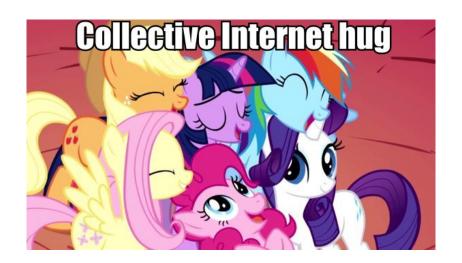
Arne Skjærholt



LTG seminar









#### THE GOAL

- Integrating linguistic and data-driven methods
- Use linguistic knowledge to guide data-driven methods
- ► Leverage data-driven approaches to inform linguistic and rule-driven methods?

## WHAT TO DO?

- ► Focus on syntax
- ► Focus on languages with little resources up-front

## WHAT TO DO?

- ► Focus on syntax
- ► Focus on languages with little resources up-front
- Norwegian
  - ► Decent resources at word-level
  - ► No syntactic resources

## WHAT TO DO?

- ► Focus on syntax
- ► Focus on languages with little resources up-front
- ▶ Norwegian
  - Decent resources at word-level
  - ► No syntactic resources
- Latin
  - ► Long tradition of linguistic inquiry
  - ► Quality and quantity of annotated data extremely variable

#### **PLANS**

- ► Dependency corpus adaptation
- ► Constrained CRF models
- Annotation studies

# CURRENT PROJECT

- 1. Take a large corpus
- 2. Remove 90% of the information in it

# CURRENT PROJECT

- 1. Take a large corpus
- 2. Remove 90% of the information in it
- 3. ???

# CURRENT PROJECT

- 1. Take a large corpus
- 2. Remove 90% of the information in it
- 3. ???
- 4. Profit!

# THE GENERAL IDEA

1. Delexicalise source language corpus

#### THE GENERAL IDEA

- 1. Delexicalise source language corpus
- 2. Train language model over target language PoS sequences
- 3. Filter source corpus with LM

#### THE GENERAL IDEA

- 1. Delexicalise source language corpus
- 2. Train language model over target language PoS sequences
- 3. Filter source corpus with LM
- 4. Train model, parse target

#### **CORPORA**

- ► Prague Dependency Treebank (PDT)
  - ▶ 1.5M tokens
  - ► Dependency syntax and complex morphological annotation

#### **CORPORA**

- ► Prague Dependency Treebank (PDT)
  - ▶ 1.5M tokens
  - ► Dependency syntax and complex morphological annotation
- ► Latin Dependency Treebank (LDT)
  - ▶ 53,143 tokens
  - Annotation scheme based on PDT

#### PARSING LATIN

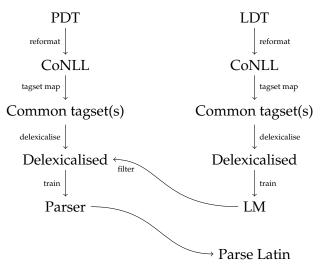
- ► Previous baseline: MSTParser, 65% unlabelled, 53% labelled accuracy (Bamman & Crane 2008)
- ► New baseline: MSTParser, 64% unlabelled, 54% labelled

## PARSING LATIN

- ► Previous baseline: MSTParser, 65% unlabelled, 53% labelled accuracy (Bamman & Crane 2008)
- ► New baseline: MSTParser, 64% unlabelled, 54% labelled

Prose 40,884
Poetry 12,259
Prose/poetry distribution

# Workflow



#### **TAGSETS**

- ► LDT annotation guidelines derived from PDT
- ► PoS mappings:
  - ► LDT has a participle tag
  - ► Czech has particles, Latin doesn't

#### **TAGSETS**

- ► LDT annotation guidelines derived from PDT
- ► PoS mappings:
  - ► LDT has a participle tag
  - ► Czech has particles, Latin doesn't
- ► Deprel mappings:
  - ► Reflexive tantum
  - ► Reflexive passive
  - ► Emotional dative

## DATA SPLITS

- ► PDT:
  - ► 8 training folds
  - ▶ development fold
  - evaluation fold

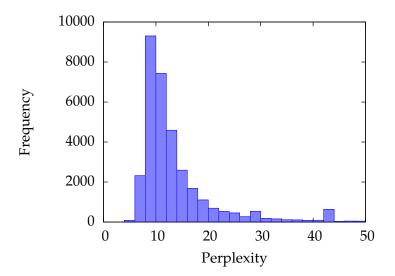
#### DATA SPLITS

- ► PDT:
  - ► 8 training folds
  - development fold
  - ▶ evaluation fold
- ► LDT:
  - ► Distributed as one file/author
  - ► Round-robin split into 10 folds
  - ► Fold 10 held out for evaluation

#### LANGUAGE MODELLING

- ► LM over LDT PoS sequences
- ► Best order: trigrams
- ▶ Best smoothing: constant discounting (D = 0.1)

#### PDT PERPLEXITY



## PARSER OPTIMISATION

► Do parameter tuning on the Czech development set

## PARSER OPTIMISATION

- ▶ Do parameter tuning on the Czech development set
- ► Numbers forthcoming...

#### FUTURE WORK

- ► Further analysis of Latin baseline
  - ► Per author/genre performance
  - ► Why is MaltParser so bad?
- Feature engineering
- ► Learning curve: performance vs. perplexity cutoff

#### FURTHER FORWARD

- ► Extend workflow to Talbanken/Norwegian Dependency Treebank
- ► Evaluate impact of preprocessing data for annotation
  - Annotation speed?
  - ► Annotator agreement?
  - ► Annotator error?