# Project Update: WSJ Treebanking with ERG DELPH-IN Summit 2010 Paris

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### Setup

- Started in October 2008
- Multiple annotators (2 on average)
- ▶ Intensive and long initial training period (~ half a year)
- ► Annotation speed peaked at around 35 sentences per hour



## Annotation Iterations





## Current Status

- Done annotating sections 00-12 ( $\sim$  50%)
- Interannotator agreement stable at κ = 0.63 (calculated on derivation trees with ParsEval)
- Currently going through the second major grammar update (0902 → 1007)
- Changing annotators



## Discriminants-Based Treebanking

- Discriminant-based treebanking is efficient
- Observation shows more annotation time is spent on searching for the easily decidable discriminants
- On average ~100 deriviation-tree based syntactic discriminants per 500-tree forest
- Only 6% are manually disambiguated



### A Screenshort Saves A Thousanda Words

Close Previous Next Reject Clear Reset Ordered Concise Full Save Confidence Toggle

(20477004) [500 : 0 @ high] Munich-based Bilianz 's brief explanatory statement said it is acting to protect its own interests as a shareholder of Navigation Hixte .

2	
? ? FILLHEAD_WH_SUBJ_R	munich- based Allianz 's brief explanatory statement II said it is acting to protect its own interests as a shareholder of I
? ? APPOS	munich- based Allianz 's brief explanatory statement said it is acting to protect its own interests as a shareholder of Nav
? ? NABJ_RC_PR	munich- II based Allianz 's brief explanatory statement said it is acting to protect its own interests as a shareholder of I
? ? PROPER_NP	munich- based Allianz 's brief explanatory statement said it is acting to protect its own interests as a shareholder of Nav
2 2 FRAG_NP	munich- based Allianz 's brief explanatory statement said it is acting to protect its own interests as a shareholder of Nav
? ? FRHG_R_HOD_NP_I	munich- based Allianz 's brief explanatory statement said it is acting to protect its own interests    as a shareholder of
? ? FILLHEAD_NON_WH_IG	munich- based    Allianz 's brief explanatory statement said it is acting to protect its own interests as a shareholder of
? ? SUBJH	munich- based Allianz 's brief explanatory statement II said it is acting to protect its own interests as a shareholder of I
? ? HAUJ_S_NPR	munich- based Allianz 's brief explanatory statement said it is acting    to protect its own interests as a shareholder of
? ? NABJ_RC_PR	munich- II based Allianz 's brief explanatory statement said it is acting to protect its own interests as a shareholder of I
? ? PROPER_NP	munich- based Allianz 's brief explanatory statement said it is acting to protect its own interests as a shareholder of Nav
2 2 HAUJ_1_UNS	based Allianz 's brief explanatory statement said it is acting to protect its own interests II as a shareholder of Navigati-
? ? HCOMP	based    Allianz 's brief explanatory statement said it is acting to protect its own interests as a shareholder of Navigati-
? ? FILLHEAD_REL	based II Allianz 's brief explanatory statement said it is acting to protect its own interests as a shareholder of Navigati-
? ? FILLHEAD_REL	based II Allianz 's brief explanatory statement said it is acting to protect its own interests as a shareholder of Navigati-
? ? HSPEC	Allianz 's    brief explanatory statement said it is acting to protect its own interests as a shareholder of Navigation Mix
? ? HABJ_S_NPR	Allianz 's brief explanatory statement said it is acting    to protect its own interests as a shareholder of Navigation Mix
? ? SUBJH_NMC	Allianz 's brief explanatory statement II said it is acting to protect its own interests as a shareholder of Navigation Mix
? ? SUBJH_NHC	Allianz 's brief explanatory statement II said it is acting to protect its own interests as a shareholder of Navigation
? ? HABJ_S_NPR	Allianz 's brief explanatory statement said it is acting    to protect its own interests as a shareholder of Navigation
? ? NAUJ_RC	brief II explanatory statement said it is acting to protect its own interests as a shareholder of Navigation Mixte.
? ? HAUJ_S_NPR	brief explanatory statement said it is acting    to protect its own interests as a shareholder of Navigation Mixte,
? ? IMPER	brief explanatory statement said it is acting to protect its own interests as a shareholder of Navigation Hixte.
? ? SUBJH_NHC	explanatory statement II said it is acting to protect its own interests as a shareholder of Navigation Mixte.
? ? HADJ_S_NPR	explanatory statement said it is acting II to protect its own interests as a shareholder of Navigation Mixte.
2 2 FIN_NON_WH_REL	explanatory statement said it is acting to protect its own interests as a shareholder of Navigation Mixte,
? ? NABJ_RC_PR	munich- II based Allianz 's brief explanatory statement said it is acting to protect its own interests
? ? PROPER_NP	munich- based Allianz 's brief explanatory statement said it is acting to protect its own interests
? ? HCOMP	based II Allianz 's brief explanatory statement said it is acting to protect its can interests
? ? FILLHEAD_REL	based II Allianz 's brief explanatory statement said it is acting to protect its own interests
? ? EXTRASUBJ_F	said it is acting to protect its own interests as a shareholder of Navigation Mixte.
? ? HADJ_S_NPR	said it is acting [] to protect its own interests as a shareholder of Navigation Mixte.
2 2 HAUJ_1_UNS	said it is acting to protect its own interests    as a shareholder of Navigation Hixte,
? ? HCOMP	said II it is acting to protect its own interests as a shareholder of Navigation Mixte.
? ? SUBJH_NMC	Allianz 's brief explanatory statement    said it is acting to protect its own interests
? ? HSPEC	Allianz 's II brief explanatory statement said it is acting to protect its own interests
? ? HAUJ_S_NPR	Allianz 's brief explanatory statement said it is acting    to protect its own interests
? ? HCOMP	said II it is acting to protect its own interests as a shareholder of Navigation
? ? SUBJH_NMC	it II is acting to protect its own interests as a shareholder of Navigation Mixte.
? ? HAUJ_S_NPR	it is acting II to protect its own interests as a shareholder of Navigation Mixte.
? ? SUBJH_NHC	it II is acting to protect its own interests as a shareholder of Navigation
? ? HADJ_1_UNS	is acting to protect its own interests    as a shareholder of Navigation Mixte.
2 ? HOOMP	is II acting to protect its own interests as a shareholder of Navigation Mixte.
ITA A HAR A HAR	and the second



## Discriminant Ranking

- Gather annotation log (decisions either manually made, or inferrred)
- Train a MaxEnt ranking model

$$P(d|Y,D) = \frac{\exp(\sum_{i=1}^{k} \lambda_i f_i(d,Y))}{\sum_{d' \in D} \exp(\sum_{i=1}^{k} \lambda_i f_i(d',Y))}$$
(1)

 Sort discriminants according to their chances of being manually decided



### Features

Feature	Possible Values	Example
discriminant type	RULE/LEX	RULE
edge position	FULL/FRONT/BACK	FULL
edge span	<pre>length(constituent)/length(sentence)</pre>	4/4
edge category	rule or lexical type name	SUBJH
level of discrimination	$\sum_{y \in Y} \delta(y) /  Y $	4/15
branch splitting	<pre>length(left-dtr)/length(constituent)</pre>	2/4



## After Discriminant Ranking ....

Close Previous Next Reject Clear Reset Ordered Concise Full Save Confidence Toggle

(20477004) [500 : 0 @ high] Hunich-based Allianz 's brief explanatory statement said it is acting to protect its own interests as a shareholder of Navigation Hixte .

(1) maria on 24-sep-2009		n 24-sep-2009 23:45: high (3)
	7 7 SUBJH 7 7 HOMP 2 2 NO NIVE CHEND	munich- based Allianz 's brief explanatory statement II said it is acting to protect its own interests as a shareholder of I said II it is acting to protect its own interests as a shareholder of Navigation Hixte.
	? ? PUNCT_PERIOD_ORULE	Nevigetion II mixte. Mixte.
	? ? Adun ? ? Adun	to II protect its own interests as a shareholder of Navigation Mixte, own II interests as a shareholder of Navigation Mixte.
	? ? HCOMP ? ? HADJ I UNS	protect II its can interests as a shareholder of Navigation Mixte. said it is acting to protect its can interests II as a shareholder of Navigation Mixte.
	? ? ADJ_ADJN 2 2 HODI 1 INS	brief    explanatory statement
	? ? FHED_1_UNIC ? ? SUBJH_NINC ? ? SUBJH_NINC	protect its our interests it as a shareholder or manipation mixte. It I is acting to protect its our interests as a shareholder of Navigation Mixte. Ollian: A brief and partout statement I i said it is action to menter its our interests as a shareholder of Navigation Mixt
	? ? HCOMP 2 2 ADIN	is If acting to protect is own interests as a shareholder of Navigation Hixte.
	7 7 HSPEC 2 2 HSPEC	its II on interests as a shareholder of Navigation Mixte, a II shareholder of Navigation Mixte.
	? ? HCONP ? ? N VORA CMPND	as II a shareholder of Navigation Mixte. munich- II based
	? ? NADJ_RR ? ? APPOS	shareholder II of Navigation Hixte. Navigation II Hixte.
	? ? PROPER_NP 2 2 NOTE BR	Mixte.
	? ? HCOMP 2 2 ADIN	of II Navigation Mixte,
	? ? HSPEC ? ? ADIN	wurich- based Allianz 's II brief explanatory statement
	? ? HOOMP 2 2 HOOTS MPR	is II acting muniche based Allianz 'z brief avolanatoru statement zaid it iz actino II to protect itz oan intereste az a skanabolder of I
	7 7 PROPER_MP 7 7 HSPECHC	Navigation Niste, multiche based Allianz II 'n
	? ? HOONP ? ? HOONP	said II it is acting modert II its can interests
	2 2 HEOMP	to II protect its own interests weichs based Bliver 's bolef exploratory statement II said it is active
	??nprit_le	It head
	7 7 ADJN 2 2 FILLHEAD HH SUBT D	brief explanatory    statement 
	? ? PROPER_NP	which based Hilang is the explanatory statement in said it is accing to protect its own interests as a statementation in which based Alliang
	? ? HSPEC	its II our interests
	? ? HEONP	Hillonz s II prior explanatory statement said II it is acting to protect its own interests
	E-1	



![](_page_13_Picture_5.jpeg)

## Evaluation

- Multiple timed annotation sessions with multiple annotators
- Annotating PARC 700
- Using different discriminant ranking models
- Measure both annotation speed and inter-annotator agreement

![](_page_14_Picture_5.jpeg)

## Results

#### Speed

Ranking Model	Speed (s/h)	Speed-up (%)
Baseline	61.9	-
Own-model	96.1	55%
Peer-model	94.6	53%
Joint-model	95.0	53%

![](_page_15_Picture_3.jpeg)

## Results

#### Speed

Ranking Model	Speed (s/h)	Speed-up (%)
Baseline	61.9	—
Own-model	96.1	55%
Peer-model	94.6	53%
Joint-model	95.0	53%

ITA			
	Ranking Model	Cohen's KAPPA $(\kappa)$	
	Baseline	0.5404	
	Own-model	0.5798	
	Peer-model	0.5567	
	Joint-model	0.5536	
DELPH-IN			12/16

## Ranking with Different Models

![](_page_17_Figure_1.jpeg)

13/16

## Ranking with Different Models

![](_page_18_Figure_1.jpeg)

## Availability

http://www.coli.uni-saarland.de/~yzhang/files/ d-rank.tgz

TSNLP(1): (load "lisp/train-discriminants.lsp")
T
TSNLP(2): (train-d '(\${PROFILES}) "\${MODELFILE}")

TSNLP(4): (load "lisp/sort-discriminants.lsp")

![](_page_19_Picture_4.jpeg)

## Conclusion & Future Work

- ► We are making progess . . .
- Treebanking efficiency can be improved significantly by discriminant ranking without hurting annotation quality
- Discriminant ranking models for training new annotators

![](_page_20_Picture_4.jpeg)