# Toward an Integrated Semantic Framework for Lexical and Structural Semantics

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DELPH-IN 2014, Tomar



- > We are developing rich multilingual meaning representations
- > Currently mainly sense annotation, about to start treebanking
- ≻ Goals
  - Scientific inquiry into how languages differ
  - Speeding up development of non-English by comparing analyses to English
  - > Reference corpus for our Integrated Semantic Framework  $(MRS+WN+\alpha)$
- Spiral model: annotate; improve model; re-annotate (update);

wordnet needs one or two more cycles of revision

. . .

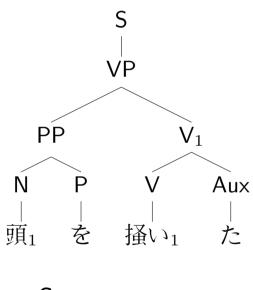


(1) 頭 を 掻いた

atama wo kaita

head ACC scratched

"I scratched my head."



$atama_{n:1}$	is-a	bodypart
$oldsymbol{kaku}_{v:1}$	is-a	change
$m{kaku}_{v:1}$	ARG1	Speaker
$m{kaku}_{v:1}$	ARG2	$atama_{n:1}$
$m{kaku}_{v:1}$	TENSE	past
Speaker	POSS	$atama_{n:1}$

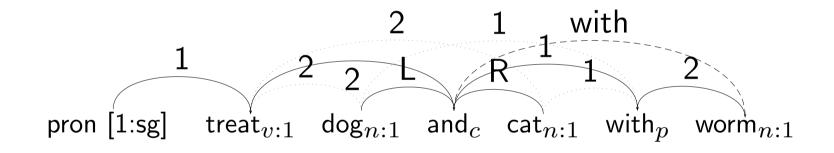
Syntax

Semantics



I treat dogs and cats with worms.

HPSG grammars give us dependencies between (contentful) predicates (DMRS) and some information about MWEs.



Dashed lines show Preposition (P) features Dotted lines show Conjunction (LR) features Arc labels show the roles: 1 is ARG1, 2 is ARG2, ....



- Trivial for single words  $\mathsf{cat}_{n:1} o oldsymbol{cat}_{n:1}$
- ➤ Harder for MWEs

not always the same choice in the two systems and the coverage is patchy in both

➤ ERG sometimes decomposes, wordnet doesn't
here → in<sub>p</sub> DEF<sub>q</sub> here<sub>a</sub> place<sub>n</sub>
here → in<sub>p</sub> this<sub>q</sub> place<sub>n</sub>; no need for ADV

We have added decomposed pronouns here<sub>n:1</sub> has-hypernym location<sub>n:1</sub>; quantified-by this<sub>a:1</sub> this<sub>a:1</sub> has-hypernym proximal<sub>a:1</sub>

#### NANYANG TECHNOLOGICAL UNIVERSITY English Resource Grammar vs Wordnet

Mapping Type	#	%	ERG	WN
unknown no match	48	0.3	comedians/nns	comedian
MWE	114	0.7	a+little	a_little
unknown match	136	0.9	flannel/nn	flannel
morphy	239	1.6	animate	animated
lemma+sense	274	1.8	look_v_like	look_like
ADJ+ly-ADV	405	2.6	usual	usually
mismatch	636	4.1	foul	foul-smelling
exact (ignore sense)	3,603	23.4	story_n_of	story
exact	9,948	64.6	depravity	depravity
Total	15,403	100		

> Not trivial to match lemmas (6% not matched at all)

Mismatches: A long and lovely tail

V	of-i	take_advantage
V	1	rest_on
n	1	steps
V	1	join_forces
V	1	hold_out
V	1	come_off
Х	deg	well-kept
n	1	troops
n	1	stairs
V	cause-to	unfasten
а	1	gray
n	1	morals
V	go-of	let_go_of
а	for	later
	v n v v v x n v a n v	<ul> <li>v 1</li> <li>n 1</li> <li>v 1</li></ul>

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 $\succ$  create a representation that gets the best of ERG+WN

## ➤ tackle hard MWEs

- $\succ$  Linus <u>coppers his bets</u>.
- > Sherlock knocked her up.
- > They are <u>few and far between</u>.
- > They <u>spilled</u> the government <u>beans</u>.
- Have a tool to parse automatically and rank to get the preferred reading: for Chinese, English, Indonesian and Japanese



## Compare treebank and sense annotation

- $\succ$  Cathedral and the Bazaar
- $\succ$  Speckled Band
- $\succ$  Dancing Man
- Decide how to annotate senses:
  - > Ambiguate MRS?
  - > Map MRS to concept table and then tag?
- > First attempt:

> Text  $\rightarrow$  DMRS  $\rightarrow$  synsets (ntume tagger)  $\rightarrow$  tagged (UKB)



- ➤ Mapping MWEs
  - compound nouns suddenly become hard :-)
- ➤ Solution(s)?
  - Add non-compositional MWEs to the ERG hot-dog; knock up; copper one's bets
  - Match with MT rules
  - ≻ ?



- Assign MRS to all wordnet entries parse (expecting fragments) should parse the glosses/examples too, just for fun
  - > Find the **head** and see if it is a hypernym
  - $\succ$  use the parse to make the LHS of the MT rule
- Do this in CEJI (at least) encourage Bulgarian, Spanish, Norwegian, . . . automate and cross link



## Consistent Granularity

- ERG (DELPH-IN) aims to only differentiate when there is a syntactic difference.
- > We want to have the same distinctions made consistently
  - \* Argument structure of nominals
  - \* Cross-POS links in wordnet
- The ontology/SEM-I is part of the model
  - We don't need to replace *destruction* with *destroy* It is linked already (derivation)
     So we can sidestep the granularity consistency problem of AMR



Cross lingual ISF matching (DMRS matching but with synset nodes) gives us MT rules; multilingual treebanking; MT same technique can be used for symptom/guideline matching

## > Various paraphrases

- ➤ The literalizer: replace idioms/MWEs with literal paraphrases She knocked Holmes up → She woke Holmes
- ➤ The generalizer: replace concepts with hypernyms She knocked Holmes up → A woman changed the state of the fictional character → An entity changed an entity have a slider to change the depth



## ➤ The Joke generator

➤ When is a job not a job?
When it is a nose job.



- We have a pipeline to build them automatically although the mapping needs to be refined
- Some expectation that our semantics will be more consistent under the assumption that the ERG/Wordnet are consistent
- > We have less money but more existing work in multiple languages
- ➤ We don't do (yet)
  - Semantic Role Labeling
  - > Named Entities (although if we use Babelnet we can)
  - ➤ Co-reference resolution
- We need to make time to do the shared task annotate the same text with different representations



➤ How to represent idioms?

- (2) bite one's tongue "refrain from speaking"
- (3) bite the dust "die"
- What is the correct syntactic representation? pretty much the same as non-idiomatic — different lexical items
- What is the correct wordnet representation bite the dust is in the die<sub>v:1</sub> synset? bite one's tongue is a hypnonym of silent<sub>a:2</sub> (or see-also)?
- > What about ISF?

one predicate for bite the dust

multiple for *bite one's tongue*? = "remain silent"

bite one's foolish tongue need somewhere to link it



- Have a packed structure in which both parts are simultaneously true
  bite<sub>v:i-bite-ones-tongue</sub> tongue<sub>n:i-bite-ones-tongue</sub>
  A keep<sub>v:1</sub> silent<sub>n:i1</sub>
  - mark them as being in the same group
- > For e.g. generation, make sure you only generate from one
- The same predicate may take part in two deep things
   Poisson and Gaussian distributions
   Poisson distribution<sub>n:1</sub> and Gaussian distribution<sub>n:1</sub>



> to be able to make knowledge available in any language

- machine translation
- cross-lingual information retrieval
- > to exploit translations to bootstrap learning
  - > translation sets can pinpoint concepts
  - > translations can disambiguate structure
  - > different languages pick out different things



- > When do translations differ (translation shift)?
- > How do we measure it?
- ≻ Resources
- ≻ Results
- > Discussion
- ≻ Future work



- > Transposition: syntactic change  $scared A \rightarrow びびる bibiru$  "feel frightened" V.
- ➤ Modulation: semantic change thumb →指 finger "finger"
- **Equivalence**: different expression, but the meaning is still apparent have no umbrella  $\rightarrow$ 傘かない kasa ga nai "not have umbrella"
- ➤ Adaptation: change of situation due to disparities in culture all one's Christmases come at once → お盆とお正 月がいっぺんに来る obon-to oshougatu-ga ippenni kuru "Summer Festival and New Year come together"
- Loose Translation: possibly unmotivated change



- The amount of translation shift determines the difficulty of translation
- What kinds of phenomena occur (and why) are studied in Translation Studies
  - > Often with fine grained analysis
- > Strategies for translating developed in Machine Translation
- > Which phenomena are more common and why?
  - > Depends on the language pair and genre



- > Mark the meanings of open class words
  - > Tag them with senses from wordnet
  - > Plus pronouns and interrogatives
- Link them between the languages
  - > Add new entries to wordnet as needed
  - > Text, ontology and grammar are all linked
- Categorize the unlinked concepts
- > Eventually link this to full semantic representations (MRS)

#### Still working out what we need to represent.



(4) Jpn: 大臣1 が <u>離党2</u> した<br/>daijin ga ritou shita<br/>minister SBJ leave-party did

- (5) Eng: The <u>minister\_4 left\_8</u> the <u>party\_1</u>
- (6) Cmn: 宜员1离开3 了政党1guanyuanlikailezhengdangministerleavealreadypolitical-party



## How are meanings linked?

	Туре	Example
=	same concept	$say \leftrightarrow 言う iu$ "say"
$\supset$	hypernym	$wash \leftrightarrow$ 洗い落とす $araiotosu$ "wash out"
$\supset^2$	2nd level	$dog \leftrightarrow$ 動物 $doubutsu$ "animal"
$\subset$	hyponym	$sunlight \leftrightarrow$ 光 $hikari$ "light"
$\subset^n$	nth level	
$\sim$	similar	$notebook \leftrightarrow メモ帳 memochou "notepad"$
		$dull_a \leftrightarrow $ くすむ $kusumu$ "darken"
$\approx$	equivalent	be content with my word $\leftrightarrow$
		ゎ <u>たくし</u> の 言葉 を 信じ-て "believe in my words"
ļ	antonym	$hot \leftrightarrow $ 寒く=ない $samu=ku \ nai$ "not cold"
#	weak ant.	not propose to invest $\leftrightarrow$
		思いとどまる $\overline{omoi}=todomaru}$ "hold back"



# **NTU Multilingual Corpus**

Genre	Text	Sentences Word				Words	Concepts
		Eng	Cmn	Jpn	Ind	Eng	Eng
Story	Dancing Men	599	606	698	_	11,200	5,300
	Speckled Band	599	612	702	—	10,600	4,700
Essay	Cathedral and the Bazaar	769	750	773	—	18,700	8,800
News	Mainichi News	2,138	2,138	2,138	—	55,000	23,200
Tourism	Your Singapore (web site)	2,988	2,332	2,723	2,197	74,300	32,600

- > All redistributable (except Mainichi: the WSJ of Japan)
- > All fun to read (except Mainichi)
- > Many translations exist (mainly public domain)

#### ➤ Different genres



## ➤ Corpus: The Adventure of the Dancing Men

- English source, Chinese and Japanese translations all public domain
- > Has both dialogue and narrative
- > Widely studied

## Lexicons

- > English Wordnet (Fellbaum, 1998)
- Chinese Open Wordnet (Wang and Bond, 2013)
- ➤ Japanese Wordnet (Isahara et al., 2008)



	English	Chinese	Japanese
Sentences	599	680	698
Words	11,198	11,325	13,483
Concepts	6,842	5,148	5,246

POS tagged, segmented and aligned as part of the NTU Multilingual Corpus.



Language	Synsets	Words	Senses
English	117,659	155,287	206,941
Japanese	57,238	93,834	158,058
Chinese	111,045	115,136	168,824

- $\succ$  English is by far the most mature
- > Japanese has more coverage of common words
- > Chinese has more coverage of concepts



- Monolingual annotation already done for each language although OK to do automatically
- > Automatically match synonym, hypernym and hyponym  $(=, \supset, \subset)$
- Link remaining concepts by hand (if possible) around 4 person-weeks/pair (30 sentences/day)
- Extend the wordnet/monolingual annotation as necessary
- Single annotator for each pair (Eng-Jpn, Eng-Cmn); NTU undergraduate with monolingual annotation experience



## Analysis of links

Туре	Eng-Jpn		Eng	g-Cmn
linked	2,542		2,535	
=	1,416	51.58	1,712	60.07
$\sim$	990	36.07	862	30.25
$\approx$	186	6.78	128	4.49
$\supset$	75	2.73	94	3.30
$\supset^2$	8	0.81	13	1.51
$\subset$	63	2.30	39	1.37
$\sub{2}$	10	1.01	18	2.09
!	1	0.04	2	0.07
#	14	0.51	13	0.46
unlinked	2,583		1,898	



## Analysis of $\sim$

Туре		Eng-Jpn	Eng-Cmn	
Pronomilisation	0	0.00	7	0.81
Depronominalisation	86	8.69	22	2.55
Holonymy	12	1.12	0	0.00
Derivation	56	5.66	30	3.48

> We can find these automatically using wordnet relations



- > 67% and 72% have the same part of speech
- ≻ Eng-Jpn:
  - 7.9% adj-noun7.4% verb-noun
- ► Eng-Cmn:
  - ➤ 7.3% noun-verb
  - ➤ 3.9% noun-adj



## (7) Said he suddenly

- a. ホームズが 突然 口 を 開く ho-muzu ga totsuzen kuchi wo hiraku Holmes NOM suddenly mouth ACC open Holmes opens his mouth suddenly
- > kuchi wo hiraku is lexicalized but not (yet) in wordnet
- > or in Jacy (and should it be?)



- (8) I gave a start of astonishment.

I shook my body (due to) much astonishment

- *give a start* is lexicalized but not (yet) in wordnet (*start* is: *wake with a start*)
- ▶ 身を 震わせる is lexicalized but not (yet) in wordnet



(9) get to the bottom of it
a. 暴く こと が できます
abaku koto ga deki-masu
expose NMLZ NOM can-POL
able to expose
b. 彻底 弄 清楚

chèdǐ nòng qīngchǔ completely make clear

to make clear completely



- sift the matter to the bottom (10)a. 最後 まで 調べ-たい saigo made shirabe-tai end until investigate-want "want to investigate until the end" 弄 清楚 b. 彻底 chèdĭ nòng qīngchǔ completely make clear "to make clear completely"
- > sift the matter/get to the bottom  $\rightarrow$  chèdǐ nòng qīngchǔ
- > not a direct translation: how can we represent this?



- (11) his long, thin back curved over
  a. 他 弯 着 瘦长 的身子
  tā wān zhe shòucháng de shēnzi
  3SG curve PROG lanky de body
  "he curved (his) lanky body"
- > lanky "tall and thin" (wn)
- > shòucháng lit: thin+tall
- > We should link these somehow in wordnet



- (12) <u>She</u><sub>i</sub> shot <u>him</u><sub>j</sub> and then <u>herself</u><sub>i</sub>
  - a. 奥-さん が 旦那-さん を 撃って oku-san ga danna-san wo utte wife-HON NOM husband-HON ACC shoot-CONJ 、それから 自分 も 撃った , sorekara jibun mo utta , and+then self too shoo-PST <u>Wife<sub>i</sub> shot husband<sub>j</sub> and then shot self<sub>i</sub> too</u>



(13) <u>She</u><sub>i</sub> shot <u>him</u><sub>j</sub> and then <u>herself</u><sub>i</sub>

 a.
 她
 拿
 枪
 打
 丈夫
 , 然后

 tā
 ná
 qiāng xiān dǎ
 zhàngfū
 , ránhòu

 3SG
 take gun
 first
 shoot
 husband
 , and+then

 打
 自己
 tit
 tit
 tit
 tit
 tit

 ná
 zìjí
 tit
 tit
 tit
 tit
 tit

shoot self

<u>She</u><sub>*i*</sub> took the gun to first shoot <u>husband</u><sub>*j*</sub>, and then shot <u>self</u><sub>*i*</sub>

## NANYANG TECHNOLOGICAL UNIVERSITY Not linkable with our current model

## (14) I am sure that I shall say nothing of the kind.

- a. いやいや 、 そんな こと は iyaiya , sonna koto wa by+no+means , that+kind+of thing TOP 言わ-ん よ iwa-n yo say-NEG yo "no no, I will not say that kind of thing"
- > sonna in our wordnet & negation makes it hard to link
- $\succ$  iyaiya  $\leftrightarrow$  I am sure that I shall ???
- Decomposing pronouns gives us a lot of this, but the equivalence requires some inference



(15) Now, Watson, confess yourself utterly taken aback, said he.(16) I am

- a. まったく だ。 mattaku da absolutely COP Absolutely
- Perfect in context
- > We don't model the discourse at all



- > Still many predicates not matched
  - > we need more general matching
  - > the wordnets are missing many idiomatic expressions
  - > translations are not always faithful to the original
- Wordnet structure enables automatic links hypernym, meronym, derivation, . . .
- > But there are interesting gaps in wordnet's representation
  - > Negation
  - > MWEs/Phrases
  - > Decomposable predicates
- The HPSGs are helpful here



> We have annotated 600 sentences in three languages

- > Only 27-40% of predicates translated directly
- Many small shifts
- Many large shifts
- > Wordnets are missing many MWEs (maybe as many as 80%)
- > We do not handle some common relations
  - > decomposable meaning
  - ➤ negation
  - > flexible idioms



- > Add missing entries to the wordnets
- Improve the automatic annotation
  - link nth level hypernyms; link derivations
  - link pronouns and interrogatives
- Improve the annotation tool
- Tag and release more text: Essay, News, Tourism (Funding for 6,000 sentences (CEJ) + 2,000 Indonesian)
- > Use the data to improve machine translation
- > This is Open Data: Anyone can build on this (not quite out yet)



- > Planning to add Spanish, German, Russian, Vietnamese, . . .
- > Coordinating with wordnet projects
- > Will use the data to add sense-frequencies for wordnets
- Annotating Dancing Men in a new language is a perfect size for an undergraduate thesis
  - > We hope to make our software available to do this
- > Actually shifting to *Speckled Band* (less meta-text)
  - have tagged all sentences with three and checked by me
  - potential joint text with AMR, Meaning Bank, . . .



## > Discuss annotation in teaching

> Show off the new OMWx web site



## > We would like to thank:

- The Creative Commons Catalyst Grant: Assessing the effect of license choice on the use of lexical resources
- The JSPS-NTU grant: Revealing Meaning Using Multiple Languages
- > The NTU Tier 1 grant: *Shifted in Translation*
- The MOE Tier 2 grant: That's what you meant: A Rich Representation for Representing Meaning
- > NTU URECA projects
- ➤ HG2002 students





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