



Project C08

The semantics of derivational morphology:

A frame-based approach

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### The problem



- Affixes (or morphological processes) are frequently semantically underspecified
- Polysemy and meaning extensions of various sorts (Bauer, Lieber & Plag 2013)

Table 1: Readings of English nominalizations (Kawaletz and Plag, 2015)

Semantic category	paraphrase	examples
Result	'the outcome of V-ing'	acceptance, alteration
Product	'the thing that is created by V-ing'	pavement, growth
Instrument	'the thing that V-s'	seasoning, advertisement
Location	'the place of V-ing'	dump, residence
Agent	'people or person who V-s'	$administration,\ cook$
Measure	'how much is V-ed'	pinch, deceleration
Path	'the direction of V-ing'	decline, direction
Patient	'the thing affected or moved by V-ing'	catch, acquisition
State	'the state of V-ing or being V-ed'	alienation, disappointment
Instance	'an instance of V-ing'	belch, cuddle

-er nominalizations:

fryer Agent, Instrument, Patient (Anderson & Andreou 2018)



### Research questions



- Which kinds of readings or meaning extensions are possible and which ones should be impossible for a given derivative?
- What is the role of the bases?
- What is the role of encyclopaedic knowledge?
- How can the semantics of derivational morphology be formally modelled?





#### Lieber's theory of word-formation semantics (2004)

- Highly restricted set of semantic features ('skeleton')
- Conceptual knowledge representations ('body')

#### **Problems**

Not clear how polysemy of affixes (or derivatives) comes about



### Derivation as unification

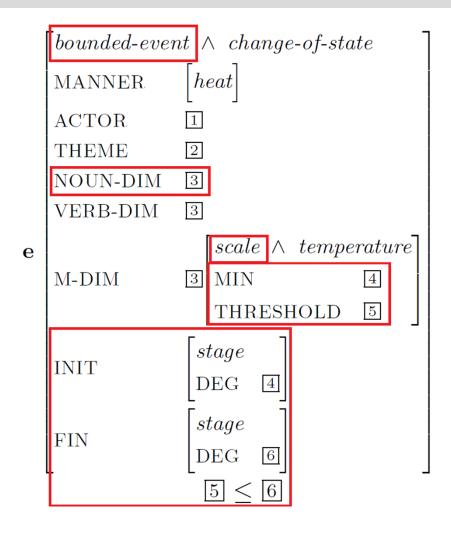


	NOUN-DIM VERB-DIM	$\boxed{3}$ $\boxed{scale}$			$     \begin{bmatrix} change\text{-}of\text{-}st \\ \text{MANNER} \end{bmatrix}   $	$tate \ ig[heatig]$
e	M-DIM INIT FIN	$ \begin{array}{c c} \hline 3 & MIN \\ THRESHOLD \end{array} $ $ \begin{bmatrix} stage \\ DEG & \boxed{1} \end{bmatrix} $ $ \begin{bmatrix} stage \\ DEG & \boxed{4} \end{bmatrix} $ $ \boxed{2} \leq \boxed{4} $	1 2	e	ACTOR THEME VERB-DIM M-DIM	1         2         3 [temperature]         3
Na-			<i>Gret</i> 'to	o heat'		



#### Derivation as unification





Nagret' 'to warm up'





- Model the interaction of the semantics of the morphological process and the semantics of the base.
- Reduce redundancy
- Capture generalizations in the lexicon (see among others, Bresnan 1982; Pollard and Sag 1994; Briscoe and Copestake 1999; Sag 2012; Bonami and Crysmann 2016).



### Lexical rule for -ment (Plag et al. 2018)

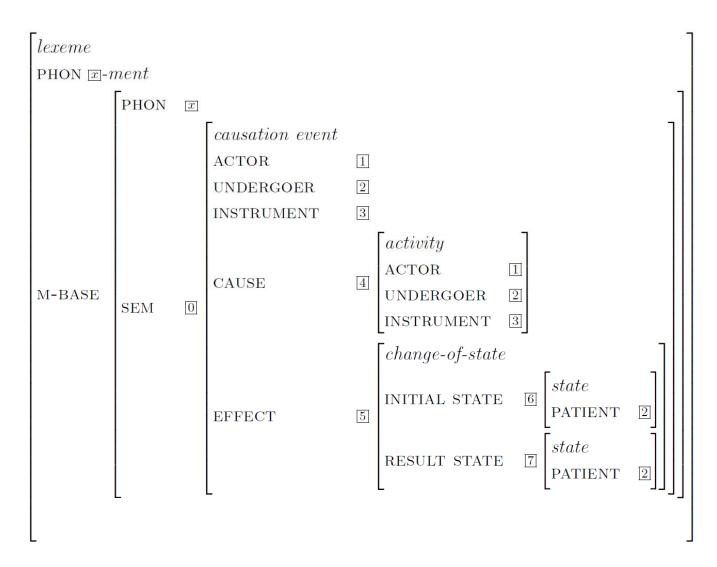


lexeme		( <del>-1</del>
PHON x-	ment	
M-BASE	PHON Z	



#### Lexical rule for -ment (Plag et al. 2018)

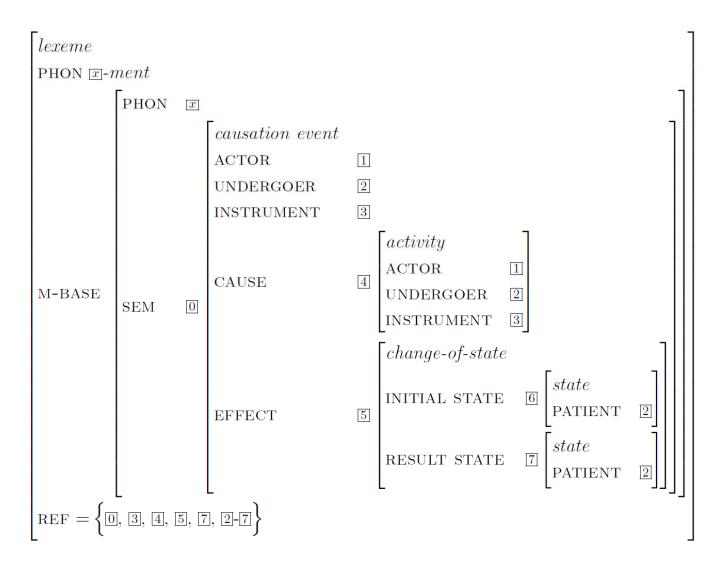






#### Lexical rule for -ment (Plag et al. 2018)

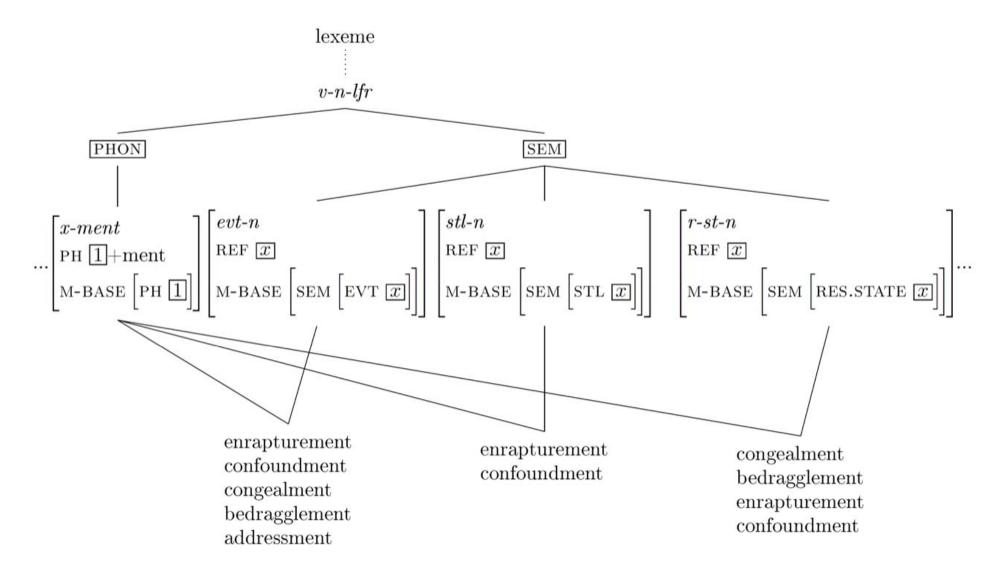






#### Inheritance hierarchy







#### This talk: Overview of our work



Introduction

#### **Mechanisms**

- Shift of reference through derivation:
   Polysemy of -ment
- Manipulating attribute values through derivation:
   Stereotype negation

#### **Computational implementaion**

- Implementing derivational polysemy:
  XMG
- Distributional semantic approach to disambiguation



### Polysemy in derivation: -ment



- Affix polysemy in deverbal nominalization with –ment
- Input semantics → Output semantics
- Neologisms taken from corpora
- Four input classes based on Levin 1993/VerbNet
  - Change of state verbs
  - Psych verbs
  - Putting verbs
  - Force verbs





#### PATIENT

I set down the scrap of doll's dress, a bedragglement of loose lace hem (COCA FIC Bk:MournersBench 1999)

#### PRODUCT

■ There is an obvious **embrittlement** and cracking on the nonwoven fabric (Figure 6.5b). (GoogleBooks ACAD Cellulose Based Composites 2014)

#### EVENTUALITY

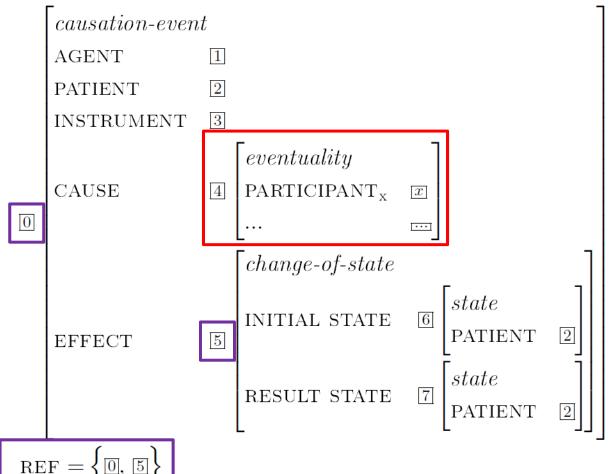
 Hydrides then form and can limit the fuel lifetime due to their embrittlement of the cladding. (Google WEB imperial.ac.uk 2014)



## Change-of-state verbs as bases



(causative/inchoative)



- Underspecified first subevent
- Reference: complex event or change of state
- Constraints

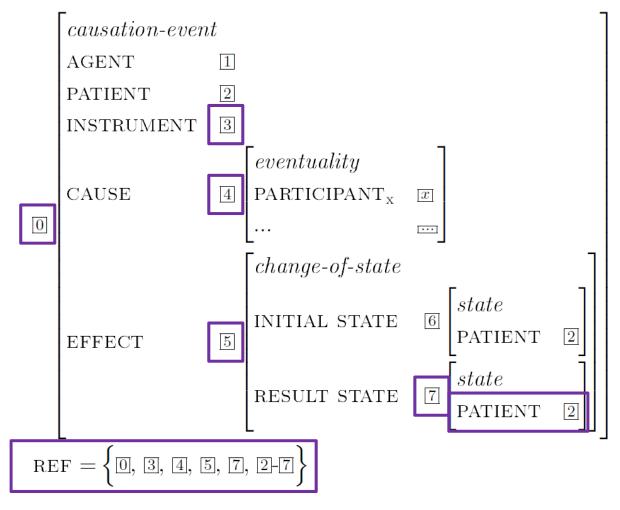
There exists at least one participant P in 4.

Every P in 4 may or may not be co-indexed with 1, 2, or 3.



#### Derived nouns (e.g. embrittlement)





Reference: range of possible readings

There exists at least one participant P in 4.

Every P in 4 may or may not be co-indexed with 1, 2, or 3.



#### Psych verbs as bases

#### (causative)



psych-causation-event Event type and participants STIMULUS reflect verb class EXPERIENCER 2 eventualityReference: only complex CAUSE  $PARTICIPANT_{x}$ event change-of-psych-state psych state INITIAL STATE EFFECT  $psych\ state$ RESULT STATE EXPERIENCER  $REF = \langle$ 

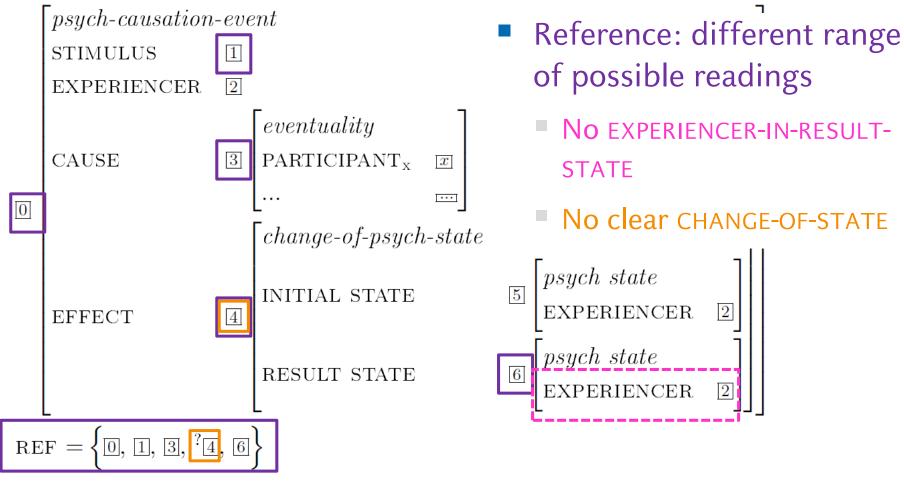
There exists at least one participant P in 3.

Every P in 3 may or may not be co-indexed with 1 or 2.



#### Derived nouns (e.g. annoyment)





There exists at least one participant P in 3.

Every P in 3 may or may not be co-indexed with 1 or 2.





- Patterns of possible readings can be detected and explained
  - .. By differences between base verb classes
    - UNDERGOER: Attested PATIENT vs. unattested EXPERIENCER
    - Differences in CHANGE-OF-STATE attestations (not alternating? No c-o-s subevent in the first place?)
  - ... By preferences of *-ment* 
    - Animacy constraint (no AGENT, no EXPERIENCER, no animate PATIENT)
  - ... By frame-theoretical considerations
    - No initial-state readings (bidirectional functionality, see e.g. Löbner 2013)





- Shift of reference
- Manipulation of attribute values
  - Stereotype negation as a test case



# Manipulating attribute values: Stereotype negation



- COCA SPOK 1994: Dawn Upshaw has been called the "un-diva" of the opera world, often preferring to perform innovative, relatively obscure works that emphasize words over music in an informal style, often-imagine this-even chatting with an audience at recitals.
- COCA ACAD 2010: In my writing workshops I often meet the equivalent writing hobbyists. They are people who are writing what I term "coffee-break books," simpleminded nonbooks that they turn out in short order.



#### Lexical rule for stereotype negation



```
lexeme
PHON /prefix-1/
CAT N
      IND i
     S-FRAME 2! REF ATTRIBUTE<sub>j</sub>
SEM
         lexeme
         PHON 1
         CAT N
              [IND i
M-BASE
```



### Lexical rule for non-



```
lexeme
PHON /nanbok/
CAT N
    -
IND i
SEM
     S-FRAME CONTENT ¬complex
        lexeme
        PHON /bok/
        CAT N
             IND i
M-BASE
                     REF
        SEM
            S-FRAME CONTENT complex
```





- Highlights the importance of structured information of perceptual aspects of meaning (i.e. functional attributes that assign properties to referents and the values these attributes take).
- Shows that the "absence" of a characteristic of the base lexeme can be treated as a change in the value of an attribute of the base lexeme and not as absence of the attribute (i.e. the general characteristic) itself.



### Computational implementations



- XMG (in collaboration with Simon Petitjean)
- Distributional semantics (in collaboration with CRC Stuttgart)



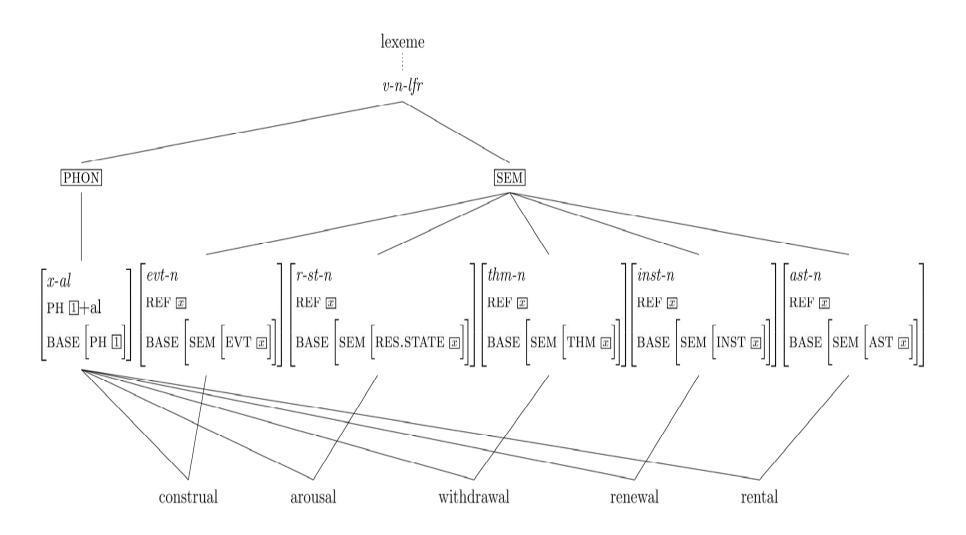


- Andreou and Petitjean (2017, forthcoming) used corpus extracted data to
  - Identify the range of readings of -al derivatives (e.g. rental) and
  - Identify prominent constraints on the types of situations and entities -al targets (e.g. animacy).
- Constraints are given in the form of type constraints and specify which arguments in the frame of the verbal base are compatible with the referential argument of the derivative.



#### Inheritance hierarchy





#### Frame to XMG



```
causation event
   AGENT 1
   PATIENT 2
   INSTRUMENT 3
                      activity
                      AGENT 1
   CAUSE
                      PATIENT 2
0
                      INSTRUMENT 3
                      change-of-state
                                       state
                      INITIAL STATE 6
                                       PATIENT 2
                   5
   EFFECT
                                       state
                      RESULT STATE [7]
                                      PATIENT 2
```

```
class renew
export ?X0
declare ?X0 ?X1 ?X2 ?X3 ?X4 ?X5 ?X6 ?X7
{<frame>{
 ?X0[causation,
       agent: ?X1[entity, animacy:[animate]],
       patient: ?X2,
       instrument: ?X3[entity],
       cause: ?X4[activity,
                   agent:?X1,
                   patient:?X2,
                  instrument:?X3[entity, animacy:[animate]]
       effect: ?X5[change_of_state,
                  initial -state: ?X6[initial state, patient:?X2],
                  result -state: ?X7[result state, patient:?X2]]]
```



### XMG rule application



```
class al_nominal
import rent[]
declare ?Ref
  <frame>{
    [al-lexeme,
     m-base: [event,
            sem:?X0]
     ref:?Ref
                                    2X0 > * 2Ref;
   2X0 > * 2Ref;
                                     { ?Ref[result_state] | ?Ref[causation]
                                      ?Ref[entity, animacy:[inanimate]] }
```





- The introduction of constraints into the semantics of an affix allows one to predict and generate
  - Readings which are possible for a given derivative and,
  - Rule out those readings which are not possible.
- As a proof of concept, the output resulting of the XMG description was consistent with the range of readings observed in the corpus.



### **Distributional Semantics**



- Problem: Disambiguating newly derived words in context
- Can a Distributional Semantics model do the job?
- Co-occurrence vectors: a toy example

	Target	t-shirt	tie	lawyer	judge
Context wear		9	7	2	4
law		1	3	7	9



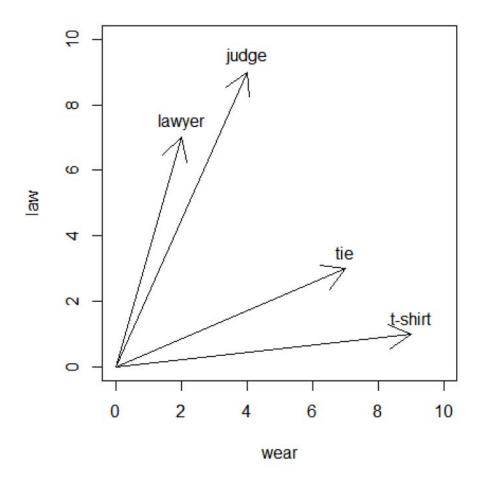
#### **Distributional Semantics**

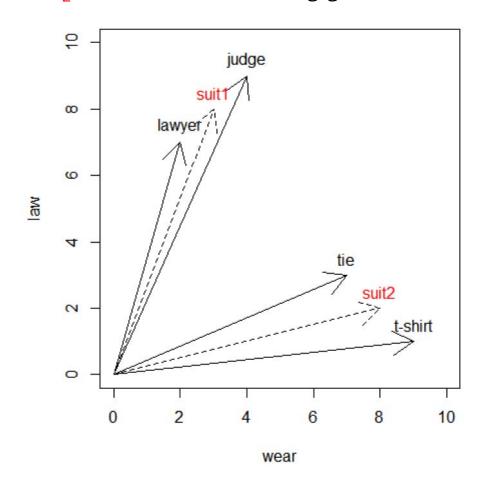


Context	t-shirt	tie	lawyer	judge
wear	9	7	2	4
law	1	3	7	9

# Disambiguation: suit<sub>1</sub> 'process in a law court'

suit<sub>2</sub> 'ensemble of matching garments'









- Low frequency deverbal -ment nominalizations (55 types, 406 tokens)
- Manually annotated: eventive, non-eventive, ambiguous
- Disambiguation by comparing
  - vectors of training nouns

TRAINING NOUNS

accident → EVENT

bike → NOT EVENT

with vectors of nominalizations in their context

ANNOYMENT.1:?

"Such an annoyment already happened"

ANNOYMENT.2:?

"Fix this annoyment!"

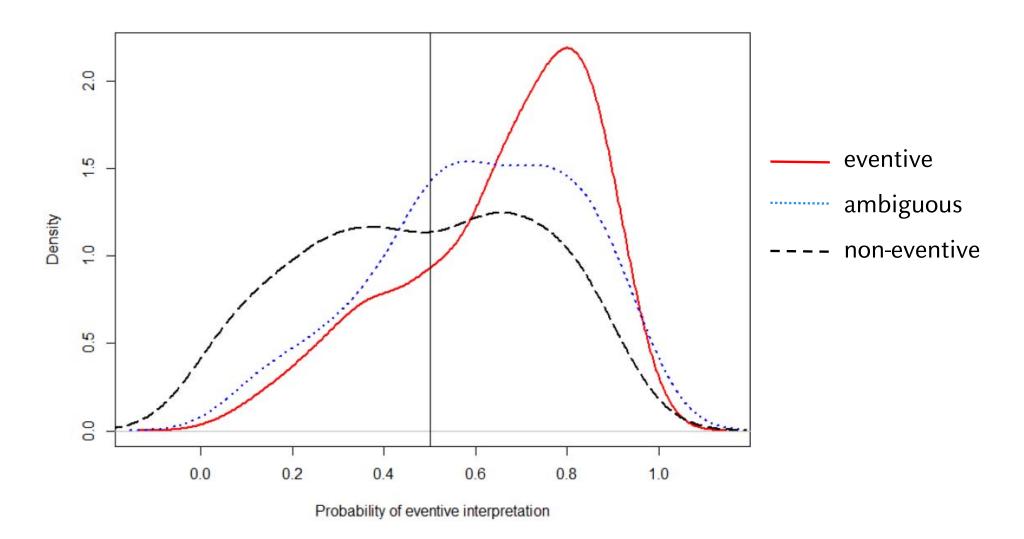




Predictions Annotations	eventive	non-eventive	ambiguous
eventive	0.78	0.47	0.73
non-eventive	0.22	0.53	0.27



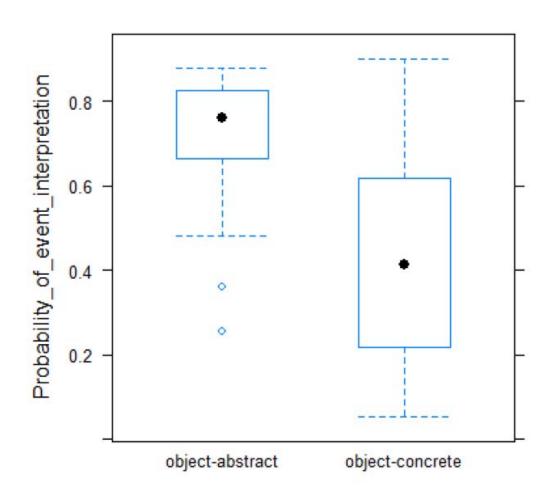






### Non-eventive nominalizations







#### Summary disambiguation



- It is possible to use distributional semantics to disambiguate the meaning even of newly formed words.
- This demonstrates the usefulness of the context in disambiguation.
- A window with two content words on each side suffices to make good predictions.
- Non-eventive derivatives are hard to classify as such.
- Non-eventive **abstract nouns** and **eventive nouns** are not only similar in their semantic properties, they may also occur in the same contexts. Both facts make disambiguation of such nouns a hard task.
- There are quite a few cases (15%) in which the interpretation of new words remains unclear, even for humans.



### Summary and outlook



- A framework for the analysis of derivational semantics
- Analyses of individual morphological categories
- Computational implementations

#### The future

- Analyses of more categories
- Eventive interpretations without verbal bases
- Scalar interpretations
- Computational modeling (XMG and Analogy)





#### Thank you very much for your attention!



#### **Publications**



#### a) Peer-reviewed publications and books

Arndt-Lappe, Sabine & Ingo Plag (eds.). 2015. The semantics of derivational morphology: Special issue of Morphology 25.4

Andreou, Marios. 2017a. Lexical Semantic Framework for Morphology. In Mark Aronoff (ed.), Oxford research encyclopedias: Linguistics, vol. 1, Oxford: Oxford University Press. doi: \url{10.1093/acrefore/9780199384655.013.255}

Andreou, Marios. 2017c. Stereotype negation in Frame Semantics. *Glossa* 2(1). 79, 1–30. doi: \url{10. 5334/gigl.293}

Andreou, Marios & Simon Petitjean. 2017. Describing derivational polysemy with XMG. In Iris Eshkol & Jean-Yves Antoine (eds.), *Actes de TALN 2017, 24e Conférence sur le Traitement Automatique des Langues Naturelle: Volume 2*, 94–101

Kawaletz, Lea & Ingo Plag. 2015. Predicting the semantics of English nominalizations: A frame-based analysis of -ment suffixation. In Laurie Bauer, Pavol Stekauer & Livia Kortvelyessy (eds.), *Semantics of Complex Words*, 289–319. Dordrecht: Springer

Lapesa, Gabriella, Lea Kawaletz, Ingo Plag, Marios Andreou, Max Kisselew & Sebastian Padó. 2018. Disambiguation of newly derived nominalizations in context: A Distributional Semantics approach. *Word Structure* (11.3)

Lieber, Rochelle & Marios Andreou. 2018. Aspect and modality in the interpretation of deverbal -er nominals in English. *Morphology* 28(3). 9. doi: \url{10.1007/s11525-018-9321-7}

Plag, Ingo, Marios Andreou & Lea Kawaletz. 2018. A frame-semantic approach to polysemy in affixation. In Olivier Bonami, Gilles Boyé, Georgette Dal, Hélène Giraudo & Fiammetta Namer (eds.), *The lexeme in descriptive and theoretical morphology*, 546–568. Berlin: Language Science Press

#### b) Other publications

Arndt-Lappe, Sabine, Ingo Plag, Kai Koch & Mikalai Krot. 2018. Transparent Analogical Modeling of Language (TrAML). Software package

Andreou, Marios. 2017a. Lexical Semantic Framework for Morphology. In Mark Aronoff (ed.), Oxford research encyclopedias: Linguistics, vol. 1, Oxford: Oxford University Press. doi: \url{10.1093/acrefore/9780199384655.013.255}.

Andreou, Marios. 2017b. Review of Pius ten Hacken (ed.) The semantics of compounding. *Morphology* 27(4). 721–725. doi: \url{10. 1007/s11525-017-9311-1}.

Andreou, Marios. 2018. A frame-based approach to evaluative morphology. Submitted to Glossa.

Kawaletz, Lea. 2015. Review of Tanja Säily, Sociolinguistic Variation in English Derivational Productivity. Studies and Methods in Diachronic Corpus Linguistics. *Morphology* 25(3). 345–347. doi: \url{10.1007/s11525-015-9263-2}.

Kawaletz, Lea. in prep. *The semantics of English -ment nominalizations: A frame-based approach*. Düsseldorf: Heinrich-Heine-Universität Düsseldorf PhD dissertation.