

Foundations of Language Science and Technology

Semantics 4a

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Example



P: *Several airlines polled saw costs grow more than expected.*

H: *Some companies reported cost increases.*

Atomic Edit		Lexical entailment		Sentence-level e.
SUB(<i>several, some</i>)	→	⊆	→	⊆
SUB(<i>airlines, companies</i>)	→	⊆	→	⊆
DEL(<i>polled</i>)	→	⊆	→	⊆
SUB(<i>saw, reported</i>)	→	≡ ?	→	≡
SUB(<i>costs, cost</i>)	→	≡	→	≡
SUB(<i>grow, increase</i>)	→	≡	→	≡
DEL(<i>more than expected</i>)	→	⊆	→	⊆

Textual Inference and Logical Inference



P: *Several airlines reported cost increases*

H: *Several companies reported cost increases*

The effect of context: Monotonicity properties



P: *John bought a new convertible.*

H: *John bought a new car.*

P: *John didn't buy a new convertible.*

H: *John didn't buy a new car.*

P: *All airlines reported cost increases.*

P: *All companies reported cost increases.*

P: *All airlines reported extreme cost increases.*

P: *All airlines reported cost increases.*

What we need



- A method to find the best or most appropriate **alignment/sequence of edit steps** between P and H.
- A **general definition for entailment** between expressions of arbitrary type.
- A method to **identify the specific lexical entailment relations** induced by specific SUB edits; DEL and INS induce \sqsubset and \sqsupset , respectively.
- A method to **determine monotonicity properties** of contexts
- A **compositional method to project entailment relations** to the sentence level, taking monotonicity properties of context into account.
- A full **specification of the join operation** between entailment relations.

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General definition of entailment



- For sentences $A, B \in WE_t$:
 $A \sqsubset B$ iff $A \models B$
- For proper nouns $a, b \in WE_n$:
 $a \sqsubset b$ iff $a \sqsupset b$ iff $[[a]] = [[b]]$
- For functional expressions $\alpha, \beta \in WE_{\langle \sigma, \tau \rangle}$:
 $\alpha \sqsubset \beta$ iff for all $d \in D_\tau$: $[[\alpha]](d) \sqsubset [[\beta]](d)$

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Lexical Entailment



- Assignment of lexical entailment uses features such as
 - WordNet synonymy (\sqsubset and \sqsupset), hyponymy (\sqsubset), antonymy (neither \sqsubset nor \sqsupset)
 - distributional similarity
 - part of speech (in particular: proper noun/ common noun/ pronoun)
 - string similarity (for pairs of proper nouns)
 - special logically fixed relations (*all* \sqsubset *some*, *and* \sqsubset *or*)
- Concrete assignment of entailment relations is done with a (decision tree) classifier.

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Monotonicity



- $\alpha \in WE_{\langle \sigma, \tau \rangle}$ is upward monotonic, iff α denotes a function f such that
for all $d, d' \in D_\sigma$: $f(d) \sqsubset f(d')$ iff $d \sqsubset d'$.
- $\alpha \in WE_{\langle \sigma, \tau \rangle}$ is downward monotonic, iff α denotes a function f such that
for all $d, d' \in D_\sigma$: $f(d) \sqsubset f(d')$ iff $d \sqsupset d'$.

Monotonicity, Examples



- Most verbs and common nouns are upward monotonic.
red:
upward monotonic, e.g.: *convertible* \sqsubset *car*
red convertible \sqsubset *red car*
big:
neither: *flea* \sqsubset *animal*
big flea $\not\sqsubset$ *big animal*
doesn't:
downward monotonic: *walk* \sqsubset *move*
doesn't walk \sqsupset *doesn't move*

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Monotonicity, Examples



- Upward monotonic context: $\sqsubset \Rightarrow \sqsubset, \sqsupset \Rightarrow \sqsupset, \# \Rightarrow \#$
- Downward monotonic context: $\sqsubset \Rightarrow \sqsupset, \sqsupset \Rightarrow \sqsubset, \# \Rightarrow \#$
- Neither: $\sqsubset \Rightarrow \#, \sqsupset \Rightarrow \#, \# \Rightarrow \#$

What we need

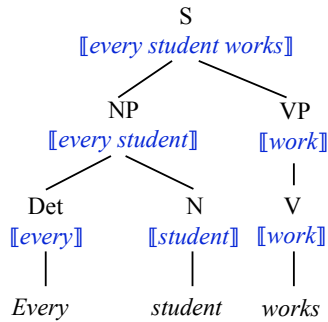


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The join operation



- $\sqsubset + \sqsubset = \sqsubset$
- $\sqsupset + \sqsupset = \sqsupset$
- All other combinations of \sqsubset , \sqsupset , and $\#$ yield $\#$



Every student works.

every-student': ((e.t).t) work': (e.t)
 every-student'(work'): t

'Every student' denotes a second-order predicate that is true of a first-order predicate, if all students are in the denotation of that predicate.

More technically speaking, for $A \subseteq U_M$:

$\llbracket \text{every-student}' \rrbracket^{M,g}(A) = 1$ iff $\forall_M \llbracket \text{student}' \rrbracket \subseteq A$

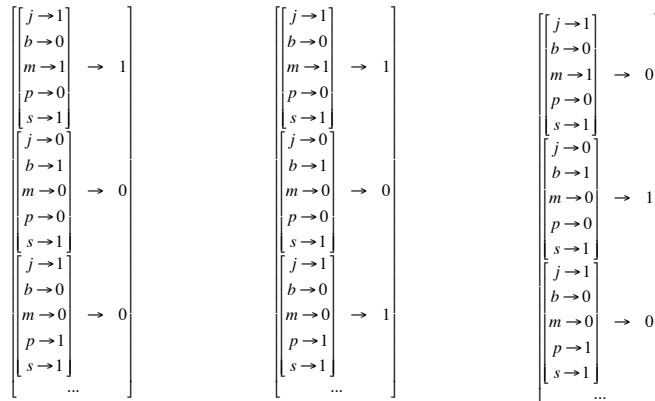
Similarly for 'a student' and 'no student'



every student

some students

no student



under the assumption that the denotation of student is {j, m}



Determiners denote functions from first-order predicates („student“) to second-order predicates („every student“); in other words: functions from first-order predicates to functions from first-order predicates to truth values.

every: ((e.t).((e.t).t)) student: (e.t)
every(student): ((e.t).t) work: (e.t)
 every(student)(work): t

Semantically, every is a two-place second-order relation that takes two predicates as arguments and returns “true” if the denotation of the first is a subset of the denotation of the second predicate.

“every student works” is true iff the set of students is a subset of the set of working individuals.



- Other determiners, like „no“ or the indefinite article can be interpreted accordingly:

$$V_M(\text{every})(A)(B) = 1 \text{ iff } A \subseteq B$$

$$V_M(\text{a})(A)(B) = 1 \text{ iff } A \cap B \neq \emptyset$$

$$V_M(\text{no})(A)(B) = 1 \text{ iff } A \cap B = \emptyset$$

- From these interpretations we can read off the monotonicity properties:
 - *a* is upward monotonic, *every* and *no* are downward monotonic (in their first argument).
 - *a student* and *every student* are upward monotonic, *no student* is downward monotonic.



- Refinement and compositional treatment of vector-space semantics
- Automatic acquisition of semantic resources (lexica, frame structures, scripts) from corpora
- Automatic acquisition of inference paraphrase and inference patterns from corpora
- Supervised, semi-supervised, unsupervised semantic processing
- Combining logic-based and distributional semantic methods