

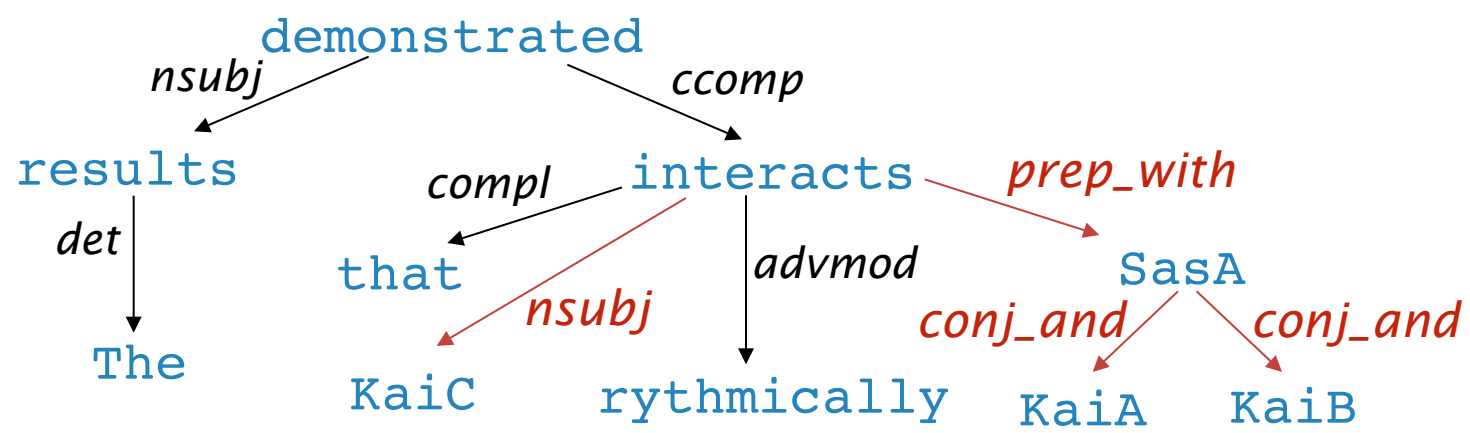
# Dependencies encode relational structure

# Relation Extraction with Stanford Dependencies



# Dependency paths identify relations like protein interaction

[Erkan et al. EMNLP 07, Fundel et al. 2007]



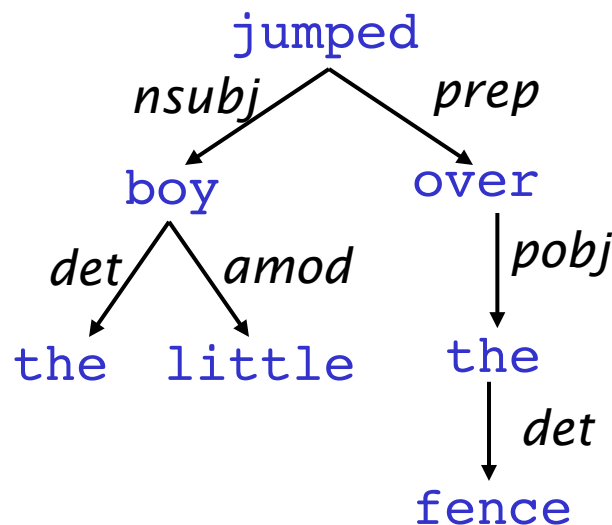
- KaiC ←*nsubj* interacts *prep\_with*→ SasA
- KaiC ←*nsubj* interacts *prep\_with*→ SasA *conj\_and*→ KaiA
- KaiC ←*nsubj* interacts *prep\_with*→ SasA *conj\_and*→ KaiB



# Stanford Dependencies

[de Marneffe et al. LREC 2006]

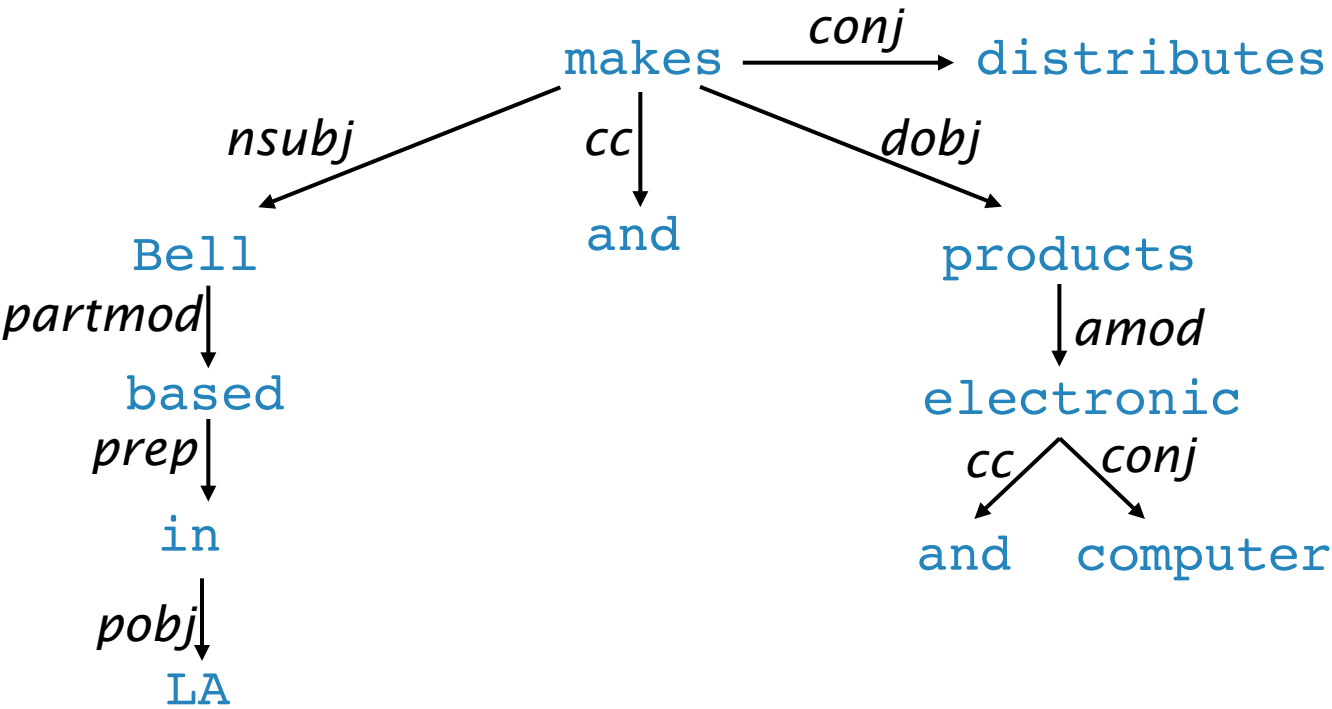
- The basic dependency representation is projective
- It can be generated by postprocessing headed phrase structure parses (Penn Treebank syntax)
- It can also be generated directly by dependency parsers, such as MaltParser, or the Easy-First Parser





# Graph modification to facilitate semantic analysis

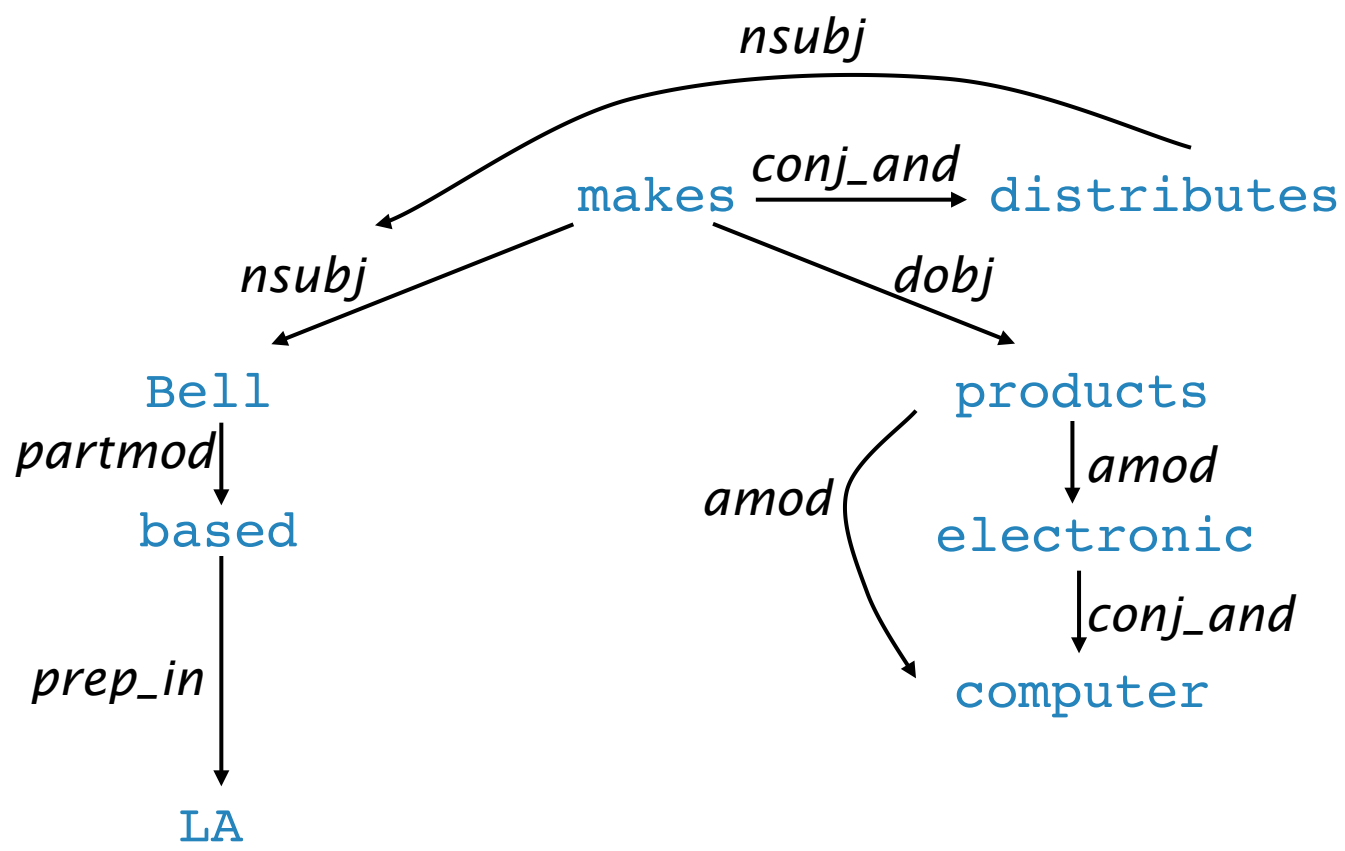
Bell, based in LA, makes and distributes electronic and computer products.





# Graph modification to facilitate semantic analysis

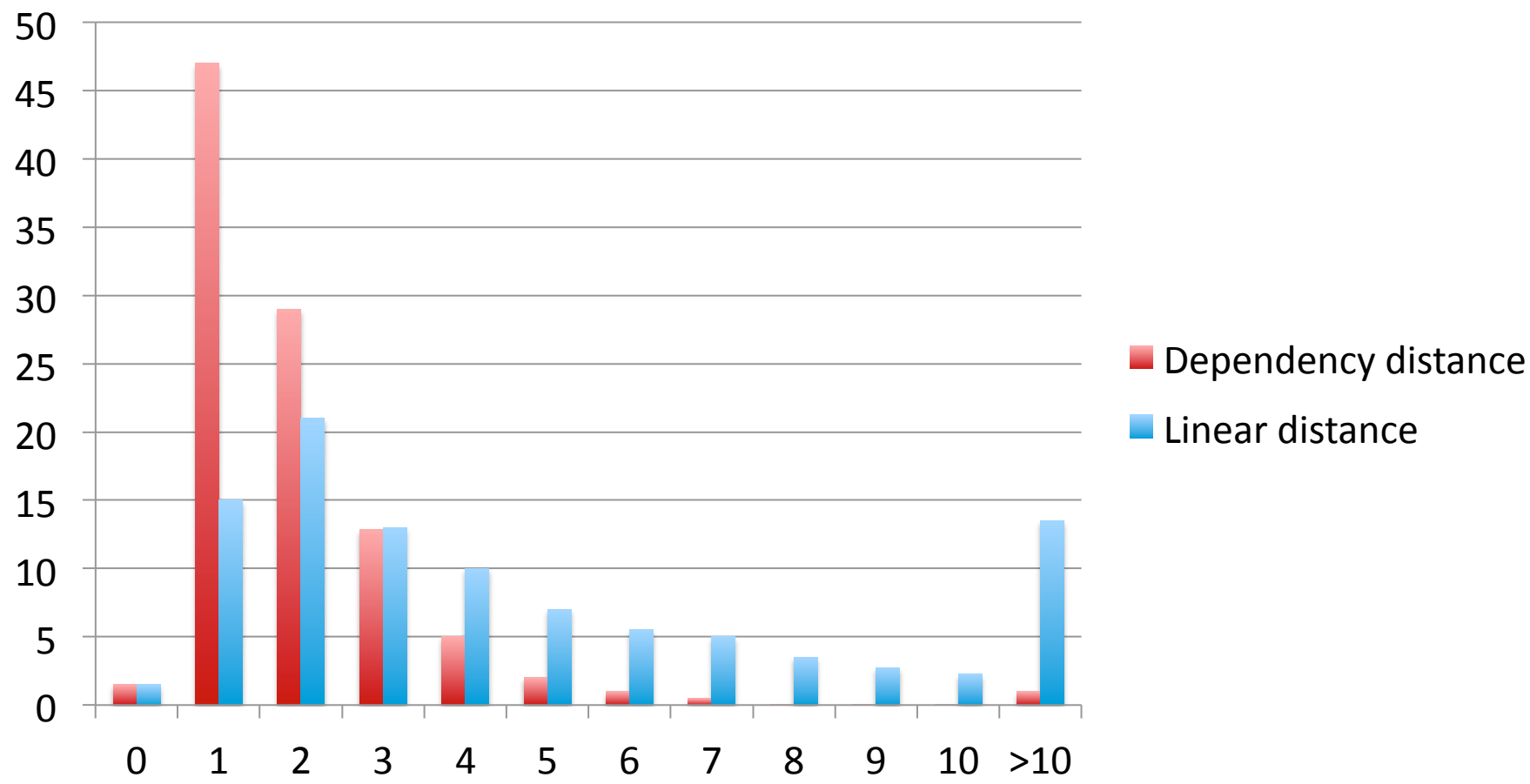
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# BioNLP 2009/2011 relation extraction shared tasks

[Björne et al. 2009]



# Dependencies encode relational structure

# Relation Extraction with Stanford Dependencies