



Relation Extraction

Using patterns to
extract relations



Rules for extracting IS-A relation

Early intuition from **Hearst (1992)**

- “Agar is a substance prepared from a mixture of red algae, such as *Gelidium*, for laboratory or industrial use”
- What does *Gelidium* mean?
- How do you know?



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Hearst's Patterns for extracting IS-A relations

(Hearst, 1992): Automatic Acquisition of Hyponyms

"Y such as X ((, X)* (, and|or) X)"

"such Y as X"

"X or other Y"

"X and other Y"

"Y including X"

"Y, especially X"



Hearst's Patterns for extracting IS-A relations

Hearst pattern	Example occurrences
X and other Y	...temples, treasuries, and other important civic buildings.
X or other Y	Bruises, wounds, broken bones or other injuries...
Y such as X	The bow lute, such as the Bambara ndang...
Such Y as X	... such authors as Herrick, Goldsmith, and Shakespeare.
Y including X	...common-law countries, including Canada and England...
Y , especially X	European countries, especially France, England, and Spain...



Extracting Richer Relations Using Rules

- Intuition: relations often hold between specific entities
 - **located-in** (ORGANIZATION, LOCATION)
 - **founded** (PERSON, ORGANIZATION)
 - **cures** (DRUG, DISEASE)
- Start with Named Entity tags to help extract relation!



Named Entities aren't quite enough. Which relations hold between 2 entities?



Drug

Cure?
Prevent?
Cause?



Disease



What relations hold between 2 entities?



PERSON

Founder?
Investor?
Member?
Employee?
President?



ORGANIZATION



Extracting Richer Relations Using Rules and Named Entities

Who holds what office in what organization?

PERSON, POSITION of ORG

- George Marshall, Secretary of State of the United States

PERSON (named | appointed | chose | *etc.*) PERSON Prep? POSITION

- Truman appointed Marshall Secretary of State

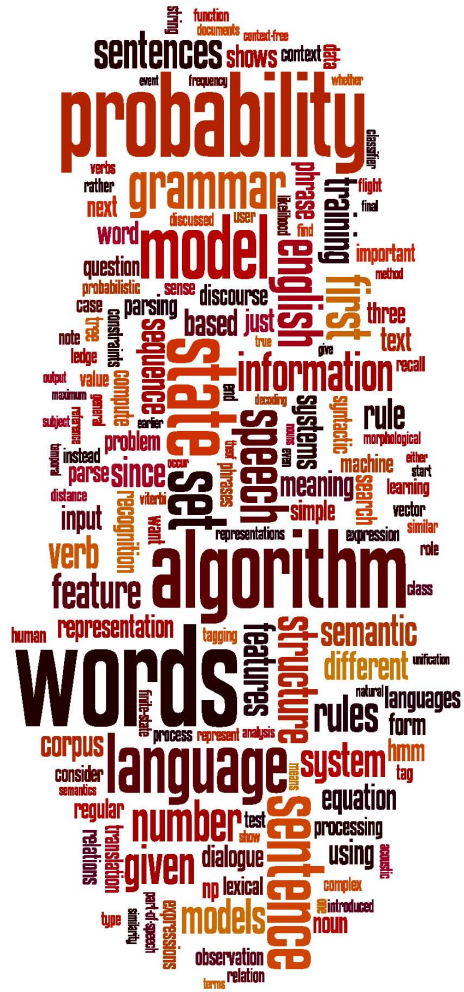
PERSON [be]? (named | appointed | *etc.*) Prep? ORG POSITION

- George Marshall was named US Secretary of State



Hand-built patterns for relations

- Plus:
 - Human patterns tend to be high-precision
 - Can be tailored to specific domains
- Minus
 - Human patterns are often low-recall
 - A lot of work to think of all possible patterns!
 - Don't want to have to do this for every relation!
 - We'd like better accuracy



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