# Computational Linguistics

Computational Semantics
Questions and gap threading

Any respectable natural language understanding system has to be able to process questions.

- Who did the male suspect meet?  $?x(person(x), the_y(suspect(y) \land male(y), meet(y, x)))$
- What did the female suspect buy?  $?x(location(x), the_y(suspect(y) \land female(y), go(y, x)))$
- Was there an explosion in the peer?  $\exists x (explosion(x) \land the_y (peer(y) \land in(x,y)))$
- $?_x(\phi) = \text{the } g(x) \text{ that makes } \exists x(\phi) \text{ true}$

## Yes-No Questions (polar questions)

- (1) a. Did the flight depart?
  - b. Will the letter mention Robin?

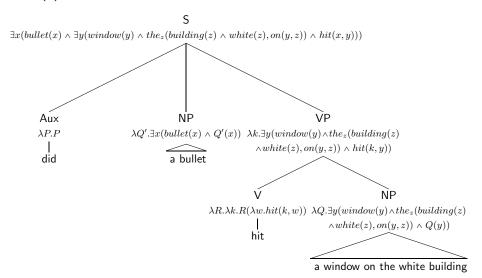
### General syntactic-semantic pattern:

(S; 
$$(\theta)((\phi)(\psi))$$
)  $\rightarrow$  (Aux;  $\theta$ ) (NP;  $\phi$ ) (VP;  $\psi$ ) (Aux;  $\lambda P.(\lambda e.future(e) \land P(e)) \rightarrow will$ 

(Aux; 
$$\lambda P.(\lambda e.past(e) \land P(e)) \rightarrow did$$

Let's simplify things and ignore tense: (Aux ;  $\lambda P.P$ )  $\rightarrow$  will  $\mid$  did  $\mid$  ...

(2) Did a bullet hit a window on the white building?



#### The verb 'to be' is trickier

Predicative AP complements:

(3) a. Is Robin single? (Adj<sub>med.</sub>  $\lambda y.single(x) \land x = y) \rightarrow single$ 

The above predicative adjective licenses (3a):

$$(\lambda Q.Q(robin))(\lambda y.single(x) \land x = y) = (\lambda y.single(x) \land x = y)(robin) = single(x) \land x = robin$$

b. Is the boy single?

$$(\lambda Q.the_k(boy(k) \land Q(k)))(\lambda y.single(x) \land x = y) = the_k(boy(k) \land (\lambda y.single(x) \land x = y)(k)) = the_k(boy(k) \land single(x) \land x = k)$$

### Predicative NP complements:

- (4) a. Is Robin a criminal?  $(\lambda Q.Q(robin))(\lambda y.criminal(x) \land x = y) = criminal(x) \land x = robin$ 
  - b. Is the man a criminal?

$$(\lambda Q.the_k(boy(k) \land Q(k)))(\lambda y.criminal(x) \land x = y) = the_k(man(k) \land criminal(x) \land x = k)$$

c. Is Robin at the house?

$$(\lambda Q.Q(robin))(\lambda y.\exists x(house(x) \land at(y,x) \land x = y) = \exists x(house(x) \land at(y,x) \land x = robin)$$

### We have therefore several patterns:

- $S \rightarrow BE NP AP$
- $S \rightarrow BE NP PP$
- $S \rightarrow BE NP NP$
- $BE \rightarrow is \mid was \mid are$

### Wh-questions are the most interesting cases:

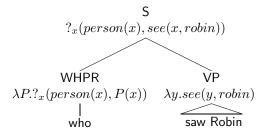
- Subject interrogatives:
  - (5) a. Who died?
    - b. Which suspect punched the guard?
    - c. Who sent this letter to Robin?
  - (6) a. Who do you think won the game?
    - b. Which suspect was it that \_punched the guard?
    - c. Who did you say \_sent this letter to Robin?

#### Complement interrogatives

- (7) a. Who did Robin hug \_?
  - b. What did you say that Robin bought \_?
  - c. Which book did you say Kim wanted us to read \_?

### Non-embedded subject interrogatives are easy

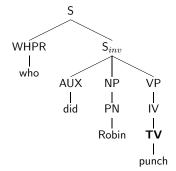
(S; 
$$(\phi)(\psi)$$
)  $\rightarrow$  (WHPR;  $\phi$ ) (VP;  $\psi$ )  
(WHPR;  $\lambda P.?_x(person(x), P(x))$ )  $\rightarrow$  who  
(WHPR;  $\lambda P.?_x(thing(x), P(x))$ )  $\rightarrow$  what



 $?_x(\phi)$  means 'provide the value of g(x) such that  $\exists x(\phi)$  is true'.

### Other interrogatives involve long-distance dependencies

- We must record the presence of the missing phrase
- Revise the  $\lambda$ -term accordingly
- Link the variable of the missing phrase to the wh-word variable
- (8) a. Who did Robin punch?
  - b.  $?_x(person(x) \land punch(robin, x))$



#### Lexical rules + a third slot for wh-variables

(assuming the simplified  $\lambda-$ terms used in the Prolog implementation)

- All verbs are listed as having an empty wh-variable slot, e.g. (IV;  $\lambda x.sneeze(x)$ , [])  $\rightarrow$  sneezed (TV;  $\lambda x.\lambda y.sneeze(x,y)$ , [])  $\rightarrow$  punched
- One rule for complement interrogatives (IV;  $\lambda x.\phi$ , [y])  $\rightarrow$  (TV;  $\lambda x.\lambda y.\phi$ , [])

### Example:

(TV;  $\lambda x. \lambda. y. punch(x, y)$ , []) becomes (IV;  $\lambda x. punch(x, y)$ , [y])

• One rule for subject interrogatives (TV;  $\lambda y.\phi$ , [x])  $\rightarrow$  (TV;  $\lambda x.\lambda y.\phi$ , [])

### Example:

(TV;  $\lambda x.\lambda y.punch(x,y)$ , []) becomes (TV;  $\lambda y.punch(x,y)$ , [x])

#### Revised verbal rules

- vrule(vp(X^K,[]),[tv(X^Y,[]),np(Y^K)])
- ② rule(vp(X,WH),[iv(X,WH)])
- rule(s(Y,WH),[np(X^Y),vp(X,WH)])

#### New verbal rules

- 1 rule(vp(K,[WH]),[tv(Y,[WH]),np(Y^K)])
- Prule(s(X,[WH]),[vp(X,[WH])])

### Wh-question rules:

- 1 rule(Y,[whpr(X^Y),vp(X,[])])
- vule(ynq(Y),[aux, np(X^Y),vp(X,[])])
- oule(Z,[whpr((X^Y)^Z), inv\_s(Y,[X])])
- rule(inv\_s(Y,[WH]),[aux, np(X^Y),vp(X,[WH])])



### Now our system can cope with questions:

```
1 ?- parse([who,saw,tom]).
q(_G18,and(person(_G18),see(_G18,tom)))
3 true.
  ?- parse([who,did,tom,see]).
6 q(_G20,and(person(_G20),see(tom,_G20)))
7 true.
8
  ?- parse([who,tom,see]).
  false.
  ?- parse([who,tom,saw]).
13 false.
```

### **PP Complements**

- (9) a. Who did John rely on?  $?_x(person(x), rely(john, x))$ 
  - b. What did John dispose of?  $?_x(thing(x), dispose(john, x))$
  - c. Who did John talk to?  $?_x(person(x), talk(john, x))$
  - d. What is John looking at?  $?_x(thing(x), look(john, x))$

## Such case-marking prepositions add no semantics

(P; 
$$\lambda P.P$$
, [])  $\rightarrow$  on  $|$  of  $|$  to  $|$  at  $|$  ...  
(PP;  $\lambda P.P(x)$ ,  $[x]$ )  $\rightarrow$  on  $|$  of  $|$  to  $|$  at  $|$  ...

**New rules** (PV= verbs that require PP complements):

(PV; 
$$\lambda x.\lambda y.rely(x,y)$$
, [])  $\rightarrow$  rely  
(VP; ..., WH)  $\rightarrow$  (PV; ...) (PP; ... WH)  
(semantics left out as an exercise)

### The wh-store allows us to capture other patterns:

- (10) a. Who did Robin [[punch \_] and [kick \_]]?
  - b. Who did Robin say [[John punched \_] and [Sue kicked \_]]?
  - c. What do most geneticists [[think about \_] but [never consider the implications of \_]]?

#### **Generalization:** coordination unifies wh-slots!

$$(X ; ((\phi)(\psi))(\theta); WH) \rightarrow (X; \theta ; WH) (Coord; \phi) (X; \psi ; WH)$$

Where Xs are variables over categories: NP, VP, S, PP, etc.

(Coord ; 
$$\lambda P.\lambda Q.P \wedge Q$$
)  $\rightarrow$  and | but

(Coord ;  $\lambda P.\lambda Q.P \vee Q$ )  $\rightarrow$  or

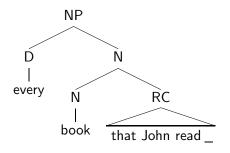
#### Relative clauses also make use of the slot:

- (11) a. The man [[who] [John punched \_]] sued the restaurant.
  - b. A spy intercepted the book [[which] [the Canadian agent gave \_]] the Mexican ambassador.
  - c. The informant knows [[who] [the email accused \_]].
- (12) a. The man [[who] [punched John]] sued the restaurant.
  - b. The informant knows [[who] [wrote the email to the ambassador]].

### RCs syntax and semantics:

- (RC;  $\phi$ , [x])  $\rightarrow$  REL (S;  $\phi$ , [x])
- REL → that | what | who | which

## Let us simplify things and assume that RCs combine with N:



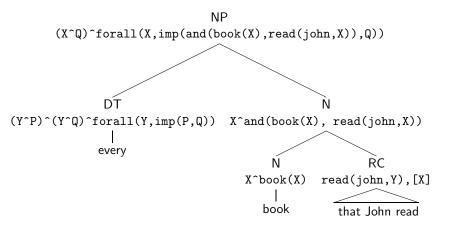
### Should yield:

$$\lambda Q. \forall x ((book(x) \land read(john, x)) \Rightarrow Q(x))$$

### We can achieve this with the following rules:

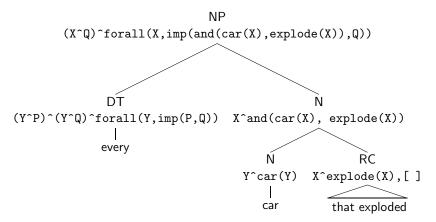
- 1 rule(n(X^and(Y,Z)),[n(X^Y),rc(X^Z,[])])
- vule(n(X^and(Y,Z)),[n(X^Y),rc(Z,[X])])

Example 1: 'every book that John read'
rule(n(X^and(Y,Z)),[n(X^Y),rc(Z,[X])])



### **Example 2**: 'every car that exploded'

$$rule(n(X^and(Y,Z)),[n(X^Y),rc(X^Z,[])])$$



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### Deeper RC gap embeddings:

- (13) a. Chelsea and David are two of the most amazing people that [we have ever had [the chance to work with \_]]. (http://eventsbykristin.blogspot.com/2012\_06\_01\_archive.html)
  - b. That is a good question [that I don't have [an answer for \_]]. (http://www.recumbentriders.org/forums/showthread.php?t=44440)