

# Belief Context from Language to Logic

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- $\lambda\omicron\gamma\omicron\varsigma$  (word)  $\implies$  logic.
- Tense and aspect
- Negation
- Quantification and anaphora
- Knowledge and Belief
- Mood and modality
- Implicature

# What's wrong?

- $P \rightarrow Q$  and  $Q \rightarrow R$  implies  $Q \rightarrow R$ .
  - 'If it rained hard, it rained.'
  - 'If it rained, it didn't rain hard.'
  - Therefore, 'if it rained hard, it didn't rain hard.'
- $P \rightarrow Q$  implies  $\neg Q \rightarrow \neg P$ .
  - 'If she wrote a letter to Santa Claus, she didn't get an answer.'
  - Therefore, 'if she got an answer from Santa Claus, she didn't write a letter to him.'
- $P \rightarrow Q$  implies  $P \wedge P' \rightarrow Q$ .
  - 'If Betty had been at the party, Bill would have had a good time.'
  - Therefore, 'if Betty had been at the party and Bill had broken his leg, Bill would have had a good time.'

- 'Anna doesn't know who the democrat candidate is.'
- 'Her favorite TV star is the democrat candidate.'
- Therefore, 'Anna doesn't know who her favorite TV star is.'

# Categorial Grammar

$A/B$ : the category becomes  $A$ , biting  $B$ .  
(function  $B \rightarrow A$ )

*John*:  $e$

*Mary*:  $e$

*loves*:  $(t/e)/e$

$$\frac{\text{John: } e \quad \frac{\text{Mary: } e \quad \text{loves: } (t/e)/e}{\text{loves Mary: } t/e}}{\text{John loves Mary: } t}$$

cf. Context-Free Grammar

$S \rightarrow NP VP$

$NP \rightarrow N$

$VP \rightarrow V N$

# Categories

<i>(individual)</i>		$e$
<i>sentence</i>	$S$	$t$
<i>common noun</i>	$N$	$t/e$
<i>verb phrase</i>	$VP$	$t/e$
<i>intransitive verb</i>	$IV$	$t/e$
<i>transitive verb</i>	$TV$	$(t/e)/(t/(t/e))$
<i>noun phrase / proper noun</i>		
	$NP$	$(t/(t/e))$
<i>preposition</i>	$Prep$	$((t/e)/(t/e))/(t/(t/e))$
<i>(verb) adverb</i>	$Adv$	$(t/e)/(t/e)$
<i>sentence adverb</i>	$Adv$	$t/t$
<i>determiner</i>	$Det$	$(t/(t/e))/(t/e)$
<i>conjunction</i>	$Conj$	$(t/t)/t$

# Typed lambda calculus

- $e$  – an entity – a member of  $U$
- $t$  – a sentence – a truth value

$\langle e, t \rangle$  : a type of function, biting  $e$  and returning  $t$  (predicate)

$\langle \langle e, t \rangle, t \rangle$                       from  $\langle e, t \rangle$  to  $t$

$\langle \langle e, t \rangle, \langle e, t \rangle \rangle$                 from  $\langle e, t \rangle$  to  $\langle e, t \rangle$

$\langle \langle e, \langle e, t \rangle \rangle, \langle e, t \rangle \rangle$     from  $\langle e, \langle e, t \rangle \rangle$  to  $\langle e, t \rangle$

⋮

# Lambda conversion

$$\lambda x[p(x)]$$

where  $x$  is an input, an argument, a parameter, a set  $\{x \mid p(x)\}$ , or whatsoever.

- $\alpha$ -conversion

$$\lambda x[p(x)] = \lambda y[p(y)]$$

- $\beta$ -conversion

$$\left\{ \begin{array}{l} \lambda x[p(x)]: \langle A, B \rangle \\ a: A \\ \lambda x[p(x)](a) = p(a): B \end{array} \right.$$

- $\eta$ -conversion

$$\lambda x[p(x)] = p \text{ if } x \text{ does not appear free in } p$$



# Ex. John loves Mary.

John  $\Rightarrow j: e$

Mary  $\Rightarrow m: e$

loves  $\Rightarrow \lambda y \lambda x [\text{love}(y)(x)]: \langle e, \langle e, t \rangle \rangle$

$$\begin{aligned} & [\lambda y \lambda x [\text{love}(y)(x)](j)](m) \\ = & \lambda x [\text{love}(m)(x)](j) \\ = & \text{love}(m)(j) \end{aligned}$$

$$\frac{j: e \quad \frac{\lambda y \lambda x [\text{love}(y)(x)]: \langle e, \langle e, t \rangle \rangle \quad m: e}{\lambda x [\text{love}(m)(x)]: \langle e, t \rangle}}{\text{love}(m)(j): t}}$$

Translation function:  $f_0(A/B) = \langle f_0(B), f_0(A) \rangle$ . (italic: type)

$$f_0((t/e)/(t/(t/e))) = \langle \langle \langle e, t \rangle, t \rangle, \langle e, t \rangle \rangle.$$

natural language	formal language
category	type
category	type
category	type

# Every, some, and no

every  $\Rightarrow \lambda Q \lambda P \forall x [Q(x) \rightarrow P(x)]: \langle \langle e, t \rangle, \langle \langle e, t \rangle, t \rangle \rangle$

man  $\Rightarrow \lambda x [man(x)]: \langle e, t \rangle$

walks  $\Rightarrow \lambda x [walk(x)]: \langle e, t \rangle$

$$\frac{\frac{\lambda Q \lambda P \forall x [Q(x) \rightarrow P(x)] \quad man}{\langle \langle e, t \rangle, \langle \langle e, t \rangle, t \rangle \rangle} \quad \langle e, t \rangle}{\frac{\lambda P \forall x [man(x) \rightarrow P(x)] \quad walk}{\langle \langle e, t \rangle, t \rangle} \quad \langle e, t \rangle}}{\forall x [man(x) \rightarrow walk(x)]} \quad t$$

some  $\Rightarrow \lambda P \lambda Q \exists x [P(x) \wedge Q(x)]: \langle \langle e, t \rangle, \langle \langle e, t \rangle, t \rangle \rangle$

no  $\Rightarrow \lambda P \lambda Q \neg \exists x [P(x) \wedge Q(x)]: \langle \langle e, t \rangle, \langle \langle e, t \rangle, t \rangle \rangle$

# Translation of proper noun

Type raising

$$j: e \longrightarrow \lambda P[P(j)]: \langle \langle e, t \rangle, t \rangle$$

The meaning of John = The whole set of features and actions of John ( $\lambda P$ ).

This type-raising is to make the type same as that with 'every student', 'some woman', 'no person', and so on.

## Ex. John walks.

$$\begin{aligned} \text{John: } e &\Rightarrow j: e \\ \text{walks: } t/e &\Rightarrow \lambda x[\text{walk}(x)]: \langle e, t \rangle \end{aligned}$$

$$\frac{\lambda x[\text{walk}(x)]: \langle e, t \rangle \quad j: e}{\text{walk}(j): t}$$

↓

$$\begin{aligned} \text{John: } t/(t/e) &\Rightarrow j: \langle \langle e, t \rangle, t \rangle \\ \text{walks: } t/e &\Rightarrow \lambda x[\text{walk}(x)]: \langle e, t \rangle \end{aligned}$$

$$\frac{\lambda P[P(j)]: \langle \langle e, t \rangle, t \rangle \quad \lambda x[\text{walk}(x)]: \langle e, t \rangle}{\frac{\lambda x[\text{walk}(x)](j): t}{\text{walk}(j): t}}$$

# Ambiguous scope

“A problem about the environment preoccupies every serious politician.”

$$\exists y[\textit{problem}(y) \wedge \forall x[\textit{politician}(x) \rightarrow \textit{preoccupies}(y, x)]]$$

$$\forall x[\textit{politician}(x) \rightarrow \exists y[\textit{problem}(y) \wedge \textit{preoccupies}(y, x)]]$$

## Ex. A problem preoccupies every politician.

every	$\Rightarrow$	$\lambda P \lambda Q \forall x [P(x) \rightarrow Q(x)]: \langle \langle e, t \rangle, \langle \langle e, t \rangle, t \rangle \rangle$
a	$\Rightarrow$	$\lambda P \lambda Q \exists x [P(x) \wedge Q(x)]: \langle \langle e, t \rangle, \langle \langle e, t \rangle, t \rangle \rangle$
politician	$\Rightarrow$	$\lambda x [pl(x)]: \langle e, t \rangle$
problem	$\Rightarrow$	$\lambda x [pr(x)]: \langle e, t \rangle$
preoccupies	$\Rightarrow$	$\lambda y \lambda x [preoc(y)(x)]: \langle e, \langle e, t \rangle \rangle$

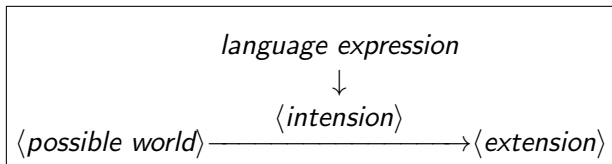
(i) There exists a common problem.

$$\begin{array}{c}
 \frac{\lambda P \lambda Q \exists y [P(y) \wedge Q(y)] \quad \text{pr} \quad \langle e, t \rangle}{\langle \langle e, t \rangle, \langle \langle e, t \rangle, t \rangle \rangle} \\
 \hline
 \lambda Q \exists y [pr(y) \wedge Q(y)] \\
 \langle \langle e, t \rangle, t \rangle \\
 \hline
 \exists y [pr(y) \wedge \forall x [pl(x) \rightarrow preoc(y)(x)]] \\
 t
 \end{array}
 \qquad
 \frac{
 \frac{
 \frac{
 \lambda P \lambda Q \forall x [P(x) \rightarrow Q(x)] \quad \text{pl} \quad \langle e, t \rangle}{\langle \langle e, t \rangle, \langle \langle e, t \rangle, t \rangle \rangle}
 }{
 \lambda Q \forall x [pl(x) \rightarrow Q(x)] \quad \langle \langle e, t \rangle, t \rangle
 }
 }{
 \forall x [pl(x) \rightarrow preoc(y_0)(x)] \quad t
 }
 }{
 \lambda x [preoc(y_0)(x)] \quad \langle e, t \rangle
 }
 }{
 \forall x [pl(x) \rightarrow preoc(y)(x)] \quad \langle e, t \rangle
 }
 }{
 \lambda y \forall x [pl(x) \rightarrow preoc(y)(x)] \quad \langle e, t \rangle
 }
 }{
 \exists y [pr(y) \wedge \forall x [pl(x) \rightarrow preoc(y)(x)]] \quad t
 }$$



(ii) Each politician has his own problem.

$$\begin{array}{c}
 \frac{\lambda P \lambda Q \forall x [P(x) \rightarrow Q(x)] \quad pl}{\langle \langle e, t \rangle, \langle \langle e, t \rangle, t \rangle \rangle} \quad \langle e, t \rangle \\
 \hline
 \lambda Q \forall x [pl(x) \rightarrow Q(x)] \\
 \langle \langle e, t \rangle, t \rangle \\
 \hline
 \forall x [pl(x) \rightarrow \exists y [pr(y) \wedge precoc(y)(x)]] \\
 t
 \end{array}
 \qquad
 \frac{
 \frac{
 \frac{\lambda P \lambda Q \exists y [P(y) \wedge Q(y)] \quad pr}{\langle \langle e, t \rangle, \langle \langle e, t \rangle, t \rangle \rangle} \quad \langle e, t \rangle \quad
 \frac{\lambda y \lambda x [precoc(y)(x)]}{\langle e, \langle e, t \rangle \rangle}
 }{\lambda Q \exists y [pr(y) \wedge Q(y)] \quad \langle \langle e, t \rangle, t \rangle} \quad
 \frac{\lambda y [precoc(y)(x_0)]}{\langle e, t \rangle}
 }{\exists y [pr(y) \wedge precoc(y)(x_0)] \quad t}
 }{\lambda x \exists y [pr(y) \wedge precoc(y)(x)] \quad \langle e, t \rangle}$$



*de re* = extensional = reference (*Bedeutung*)  
*de dicto* = intensional = sense (*Sinn*)

$s$  is an index of a possible world, and the meaning of  $\alpha$  depends upon  $w$ .

$$\alpha: a \leftrightarrow \hat{\alpha}: \langle s, a \rangle \leftrightarrow \check{\alpha}: a$$
$$\gamma\{x\} \equiv \check{\gamma}(x) \text{ (Brace convention)}$$

Translation function  $f_1$ :

$$f_1(t) = t$$
$$f_1(e) = \langle s, e \rangle$$
$$f_1(t/e) = \langle e, t \rangle \text{ (by Bennet)}$$
$$f_1(A/B) = \langle \langle s, f_1(B) \rangle, f_1(A) \rangle$$

# Categories – revised

<i>(individual)</i>		$e$
<i>sentence</i>	$S$	$t$
<i>common noun</i>	$N$	$\langle e, t \rangle$
<i>verb phrase/ intransitive verb</i>		
	$IV$	$\langle e, t \rangle$
<i>transitive verb (find, love, eat)</i>		
	$IV/(t/IV)$	$\langle \langle s, \langle \langle s, \langle e, t \rangle \rangle, t \rangle \rangle, \langle e, t \rangle \rangle$
<i>transitive verb (believe, assert)</i>		
	$IV/t$	$\langle \langle s, t \rangle, \langle e, t \rangle \rangle$
<i>noun phrase/ proper noun</i>		
	$t/IV$	$\langle \langle s, \langle e, t \rangle \rangle, t \rangle$
<i>determiner</i>	$Det$	$\langle \langle s, \langle e, t \rangle \rangle, \langle \langle s, \langle e, t \rangle \rangle, t \rangle \rangle$

# Ex. Anna believes a decmocrat wins.

Anna : t/(t/e)	$\Rightarrow$	$\lambda P[P\{j\}]: \langle\langle s, \langle e, t \rangle \rangle, t \rangle$
believes : (t/e)/t	$\Rightarrow$	$B: \langle\langle s, t \rangle, \langle e, t \rangle \rangle$
a : (t/(t/e))/(t/e)	$\Rightarrow$	$\lambda P \lambda Q \exists x [P\{x\} \wedge Q\{x\}]$ $: \langle\langle s, \langle e, t \rangle \rangle, \langle\langle s, \langle e, t \rangle \rangle, t \rangle \rangle$
dec democrat : t/e	$\Rightarrow$	$d: \langle e, t \rangle$
wins : t/e	$\Rightarrow$	$w: \langle e, t \rangle$

(i) An imaginary decmocrat would win.

$$\begin{array}{c}
 \frac{\lambda P \lambda Q \exists x [P\{x\} \wedge Q\{x\}] \quad \frac{\frac{d}{\langle e, t \rangle}}{\langle s, \langle e, t \rangle \rangle} \quad \frac{w}{\langle e, t \rangle}}{\langle \langle s, \langle e, t \rangle \rangle, \langle \langle s, \langle e, t \rangle \rangle, t \rangle \rangle} \quad \frac{\hat{d}}{\langle s, \langle e, t \rangle \rangle}}{\lambda Q \exists x [d(x) \wedge Q\{x\}] \quad \frac{\hat{w}}{\langle s, \langle e, t \rangle \rangle}} \\
 \frac{\langle \langle s, \langle e, t \rangle \rangle, t \rangle}{\exists x [d(x) \wedge w(x)]} \\
 \frac{\frac{B}{\langle \langle s, t \rangle, \langle e, t \rangle \rangle} \quad \frac{\frac{t}{\exists x [d(x) \wedge w(x)]}}{\hat{\exists x [d(x) \wedge w(x)]}}}{\langle s, t \rangle}}{B(\hat{\exists x [d(x) \wedge w(x)]})} \\
 \frac{\frac{\lambda P [P\{a\}] \quad \frac{\frac{B(\hat{\exists x [d(x) \wedge w(x)]})}{\langle e, t \rangle}}{\hat{B}(\hat{\exists x [d(x) \wedge w(x)]})}}{\langle \langle s, \langle e, t \rangle \rangle, t \rangle} \quad \frac{\hat{B}(\hat{\exists x [d(x) \wedge w(x)]})}{\langle s, \langle e, t \rangle \rangle}}{B(\hat{\exists x [d(x) \wedge w(x)]})(a)} \\
 t
 \end{array}$$

(ii) The democrat on the TV would win.

$$\begin{array}{c}
 \frac{\lambda P \lambda Q \exists x [P\{x\} \wedge Q\{x\}]}{\langle \langle s, \langle e, t \rangle \rangle, \langle \langle s, \langle e, t \rangle \rangle, t \rangle} \quad \frac{d}{\langle e, t \rangle}}{\frac{\lambda Q \exists x [d(x) \wedge Q\{x\}]}{\langle \langle s, \langle e, t \rangle \rangle, t \rangle}} \quad \frac{\frac{\lambda P [P\{a\}]}{\langle \langle s, \langle e, t \rangle \rangle, t \rangle}}{\frac{\frac{\frac{\frac{\frac{\lambda P [P\{x_5\}]}{\langle \langle s, \langle e, t \rangle \rangle, t \rangle} \quad \frac{w}{\langle e, t \rangle}}{\hat{w}}}{\langle s, \langle e, t \rangle \rangle}}{\frac{w(x_5)}{t}}}{\hat{w}(x_5)} \quad \frac{B}{\langle \langle s, t \rangle, \langle e, t \rangle \rangle}}}{\frac{B(\hat{w}(x_5))}{\langle e, t \rangle}}}{\hat{B}(\hat{w}(x_5))}}{\langle s, \langle e, t \rangle \rangle}} \\
 \frac{\frac{\lambda z [B(\hat{w}(z))(a)]}{\langle e, t \rangle}}{\hat{\lambda} z [B(\hat{w}(z))(a)]} \quad \frac{B(\hat{w}(x_5))(a)}{t}}{\frac{\lambda z [B(\hat{w}(z))(a)]}{\langle s, \langle e, t \rangle \rangle}}{\frac{\exists x [d(x) \wedge B(\hat{w}(x))(a)]}{t}}
 \end{array}$$

## Ex. John seeks a friend.

John :  $t/(t/e)$   $\Rightarrow \lambda P[P\{j\}]: \langle\langle s, \langle e, t \rangle \rangle, t \rangle$   
seeks :  $(t/e)/(t/(t/e))$   $\Rightarrow seek: \langle\langle s, \langle\langle s, \langle e, t \rangle \rangle, t \rangle \rangle, \langle e, t \rangle \rangle$   
a :  $(t/(t/e))/(t/e)$   $\Rightarrow \lambda P\lambda Q\exists x[P\{x\} \wedge Q\{x\}]$   
 $: \langle\langle s, \langle e, t \rangle \rangle, \langle\langle s, \langle e, t \rangle \rangle, t \rangle \rangle$   
friend :  $t/e$   $\Rightarrow f: \langle e, t \rangle$



- He needs someone to talk with.

$$\frac{\lambda P[P\{j\}]}{\frac{\text{seek}(\lambda Q\exists x[f(x) \wedge Q\{x\}])}{\frac{\text{seek} \quad \lambda P\lambda Q\exists x[P\{x\} \wedge Q\{x\}] \quad f}{\lambda Q\exists x[f(x) \wedge Q\{x\}]}}(j)}$$

- Where is he hiding?

$$\frac{\lambda P\lambda Q\exists x[P\{x\} \wedge Q\{x\}] \quad f \quad \frac{\lambda P[P\{j\}]}{\frac{\text{seek} \quad \lambda P[P\{x_0\}]}{\text{seek}(\lambda P[P\{x_0\}])}}(j)}}{\frac{\lambda Q\exists x[f(x) \wedge Q\{x\}]}{\exists x[f(x) \wedge \text{seek}(\lambda P[P\{x\}])]}(j)}}$$

- John seeks a wallet/unicorn.

Anna believes that a Democrat would win.

- $B_a \hat{\exists} x [democrat(x) \wedge win(x)]$
- $\exists x [democrat(x) \wedge B_a \hat{win}(x)]$
- $\exists x [B_a \hat{(democrat(x) \wedge win(x))}]$







# Discourse Representation Theory

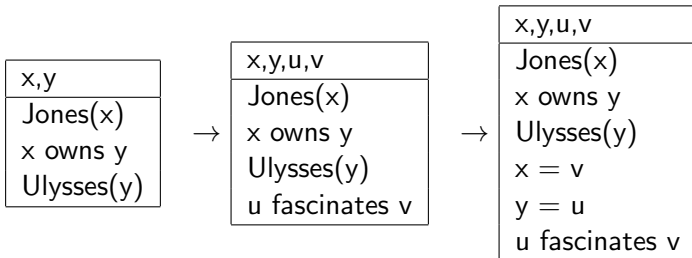
- partiality of information
- dynamics: the succeeding sentence affects on the preceding one.

DRS (Discourse Representation Structure)

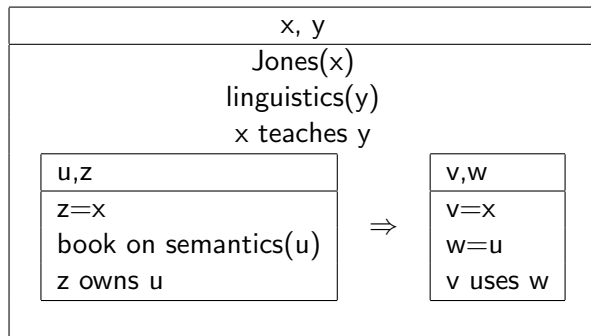
discourse referent
condition <sub>1</sub>
condition <sub>2</sub>
condition <sub>3</sub>
⋮

# Anaphora resolution

“Jones owns Ulysses. It fascinates him.”



“Jones teaches linguistics. If he owns a book on semantics, then he uses it.”



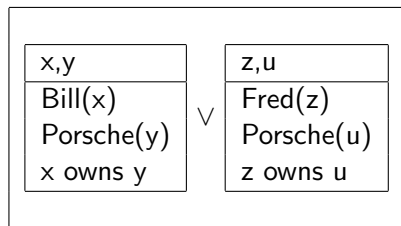
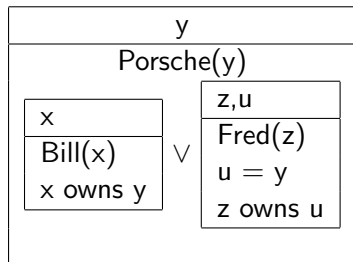
External referents 'x' can be accessible from internal structures. Also, 'u' and 'z' can be referred through ' $\Rightarrow$ '.



# Deictic/anaphoric readings

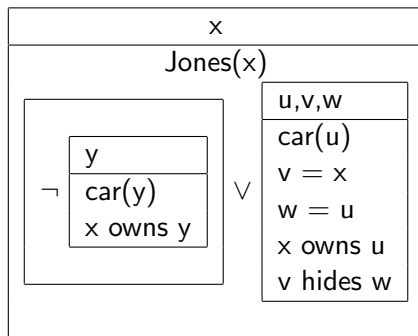
“Bill owns a Porsche or Fred owns it.”

- deictic reading – refers what exists in the world.
- anaphoric reading – refers the preceding word, not necessarily an object in the world.



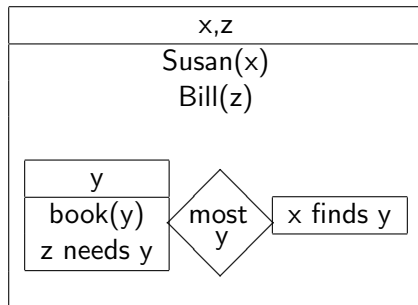
# 'or' and negation

“Either Jones doesn't own a car or else he hides it.”



# Generalized Quantifier

“Susan has found most books which Bill needs.”



left: restrictor, to supply candidate set

mid ( $\diamond$ ) : quantifier

right: scope

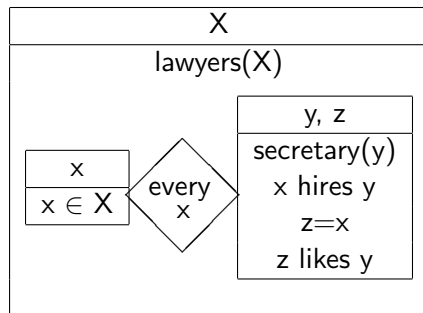
$\llbracket$  restrictor referent  $\rrbracket \supseteq \llbracket$  scope referent  $\rrbracket$ .

'y' can be referred through  $\diamond$ .

# Distributive readings

“The lawyers hired a secretary they liked.”

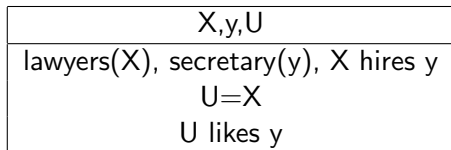
“Each lawyer employed a secretary, respectively.”



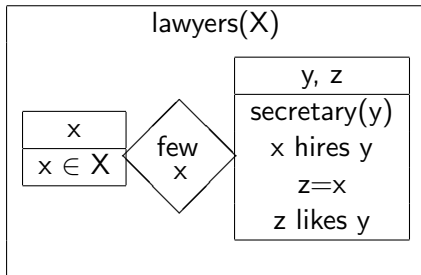
Upper case: abstraction (non-atomic object)

# Collective readings

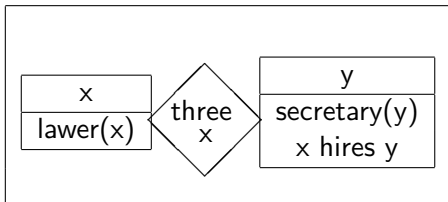
“A group of lawyers employed a common secretary.”



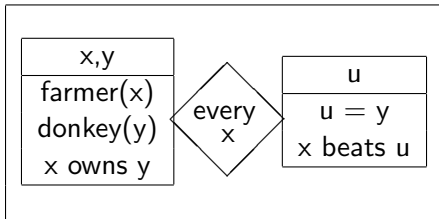
“Few lawyers hired a secretary they liked.” – cannot be read collective.



“Three lawyers hired a new secretary.”

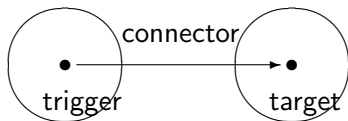


“Every farmer who owns a donkey beats it.”



“Three students drank three bottles of beer.”

We can refer 'target' by 'trigger' if they are mapped by 'connector.'



- “Plato is on the top shelf.”
- “The mushroom omelet left without paying the bill.”
- “Plato is on the top shelf. *It* is bound in leather.”
- “Plato is on the top shelf. *He* is a very interesting author.”  
— Open connector: both target and trigger can be a pronoun.
- \* “The mushroom omelet was too spicy. *It* left without paying.”  
— Closed connector: only the target can be a pronoun.
- “Norman Mailer likes to read himself.”
- \* “Norman Mailer likes to read itself.”
- ‘Norman Mailer is not, in itself, a great dissertation topic.’



Although  $\subset$  is defined in the mother space and the daughter space,  $a \in M$ ,  $M \subset N$  does not necessarily imply  $a \in N$ .

“Max believes<sub>M</sub> that in Len’s picture<sub>M</sub>, the flowers are yellow.”

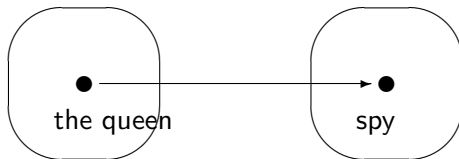
$$R(\text{speaker's real world}) \supset M' \supset M$$

mother	daughter	connector
$R$	“he thinks”	from ‘real world’ to ‘belief’
$R$	“in Len’s picture”	from the model to the picture
$R$	“in that movie”	from the actor to the movie world

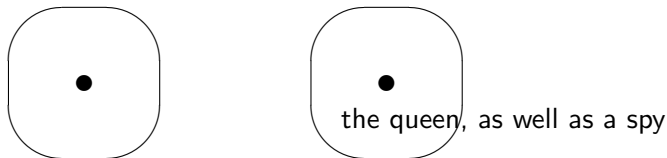
# Opaque/transparent reading

“Oedipus believes that the queen of Thebes is a spy.”

- transparent reading

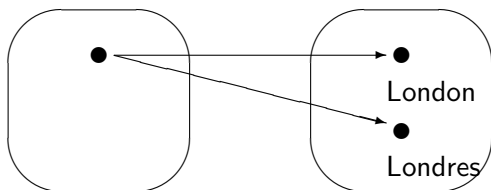


- opaque reading

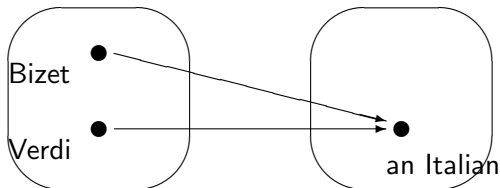


# Pierre's Londres, Vizet and Verdi

“Pierre believes that Londres is pretty but London is ugly.”



“If Bizet and Verdi had been compatriots, Bizet would have been Italian/ Verdi would have been French.”



“George thinks the winner will go to Hong Kong.”

<i>space introduction (M)</i>	<i>“George thinks”</i>
<i>attribute (P)</i>	<i>“will go to Hong Kong.”</i>
<i>role (r)</i>	<i>the winner</i>
<i>connector (F)</i>	<i>maps from R to M</i>

- $P(r)$ : George doesn't know who is the winner. Only he knows the winner will go to HK.
- $P(r(M))$ : Someone George knows is the winner in George's mind, and he will go to HK.
- $P(F(r(R)))$ : George doesn't know if 'he' is the winner, though 'he' is actually the winner.

“In 1961, the president was a baby.”

<i>space introduction (M)</i>	<i>“In 1961”</i>
<i>attribute (P)</i>	<i>“was a baby.”</i>
<i>role (r)</i>	<i>the president</i>
<i>connector (F)</i>	<i>maps from R to M</i>

- $P(r)$ : In 1961, a president was elected from babies.
- $P(r(M))$ : In 1961, a certain baby was the president.
- $P(F(r(R)))$ : The current president was a baby in 1961.

A role can be a label/a name used in metonymy while an attribute is not. But, in translation into first-order logic, both of them become predicates.

cf. Anna believes that a Democrat would win.

*attribute (P)*    '*will win.*'  
*role (r)*            '*Democrat*'

$$\begin{aligned} M \Vdash \exists x[\textit{democrat}(x) \wedge \textit{win}(x)] \\ \Rightarrow M \Vdash \exists(x: \textit{democrat})[\textit{win}(x)] \\ \Rightarrow M \Vdash \exists x[\textit{win}(\textit{democrat}(x))] \end{aligned}$$

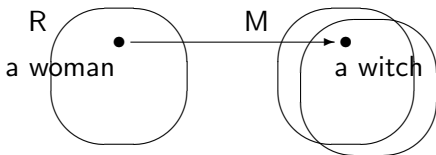
“Hob thinks <sub>$M_1$</sub>  a witch has killed Bob’s horse, and  
Nob believes <sub>$M_2$</sub>  that she killed Cob’s pig.” (Geach 1972)

- transparent reading: a certain person in R killed the pig and the horse.
- there exists a certain person in  $M_1$ , and the correspondent person exists in  $M_2$
- a person whose role is ‘witch’ exists in  $M_1$ , and a person of the same role exists also in  $M_2$ .

“Everybody believes that a witch killed the horse.”

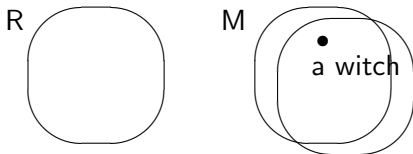
- whether ‘witch’ is in belief or not.
- whether is ‘every’ collective or distributive.
- whether is ‘witch’ a role or a person, while the role is common in every mental space.

(a) A woman exists, and everyone believes that she is a witch. The person who killed the horse is she.

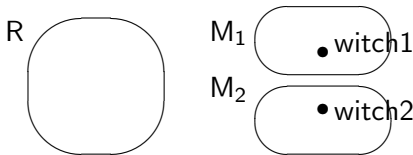




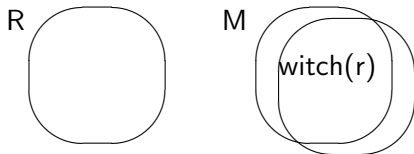
(b) Everyone believes that there exists a witch, whose image and features are common among them. The witch killed horses.



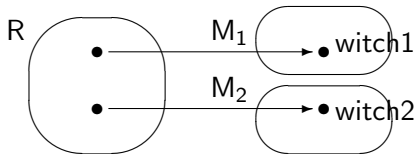
(c) Hob believes that a witch is a cute girl with short hair. He believes that the girl killed the horse. Nob believes that a witch is an ugly old woman. She committed the crime.



(d) Everyone believes in witch; but none has seen her, and it is an abstract existence. Everyone just regards that the ominous incident is caused by a witch.



(e) There are two women called Hilda and Brünhilde. Hob believes that Hilda killed the horse, and Nob believes that Brünhilde did it.



- Default Logic & Extension [R. Reiter (1980). A logic for default reasoning. Artificial Intelligence, 13:81-132]
- Predicate Completion & Circumscription [J. McCarthy (1980). Circumscription - A form of non-monotonic reasoning. Artificial Intelligence, 13:27-39.]
- Belief Revision [P. Gardenfors (1988). Knowledge in Flux. The MIT Press.]
- Defeasible reasoning [H. Prakken(1997). Logical Tools for Modelling Legal Argument. Kluwer Academic Press.]

$K_a\varphi$  agent  $a$  knows  $\varphi$

$B_a\varphi$  agent  $a$  believes  $\varphi$

## Logic of $K$

- 1  $K_a\varphi \rightarrow \varphi$  (T)
- 2  $K_a\varphi \rightarrow K_aK_a\varphi$  (4)
- 3  $\neg K_a\varphi \rightarrow K_a\neg K_a\varphi$  (5)

## Logic of $B$

- 1  $B_a\varphi \rightarrow \neg B_a\neg\varphi$  (D)
- 2  $B_a\varphi \rightarrow B_aB_a\varphi$  (4)
- 3  $\neg B_a\varphi \rightarrow B_a\neg B_a\varphi$  (5)

- $B_a \forall x [\text{bordeaux}(x) \rightarrow \text{mellow}(x)]$
- $B_a B_b [\text{bordeaux}(c) \wedge \text{mellow}(c)]$
- $B_a \forall j [\text{snob}(j) \rightarrow B_j \forall y [\text{bordeaux}(y) \rightarrow \text{mellow}(y)]]$
- $B_a \forall j D_j \neg I_a \text{president}(a)$
- $B_a \forall j \neg D_j I_a \text{president}(a)$
- $B_a \exists x [\text{bordeaux}(x) \wedge \text{mellow}(x)]$
- $\exists x [\text{bordeaux}(x) \wedge B_a \text{mellow}(x)]$
- $\exists x B_a [\text{bordeaux}(x) \wedge \text{mellow}(x)]$

- Noam Chomsky: Generative Grammar
- Statistical method: machine learning via the Internet
- Exodus from the Galapaos Islands
- Logic of Name, Label, and Individual constants