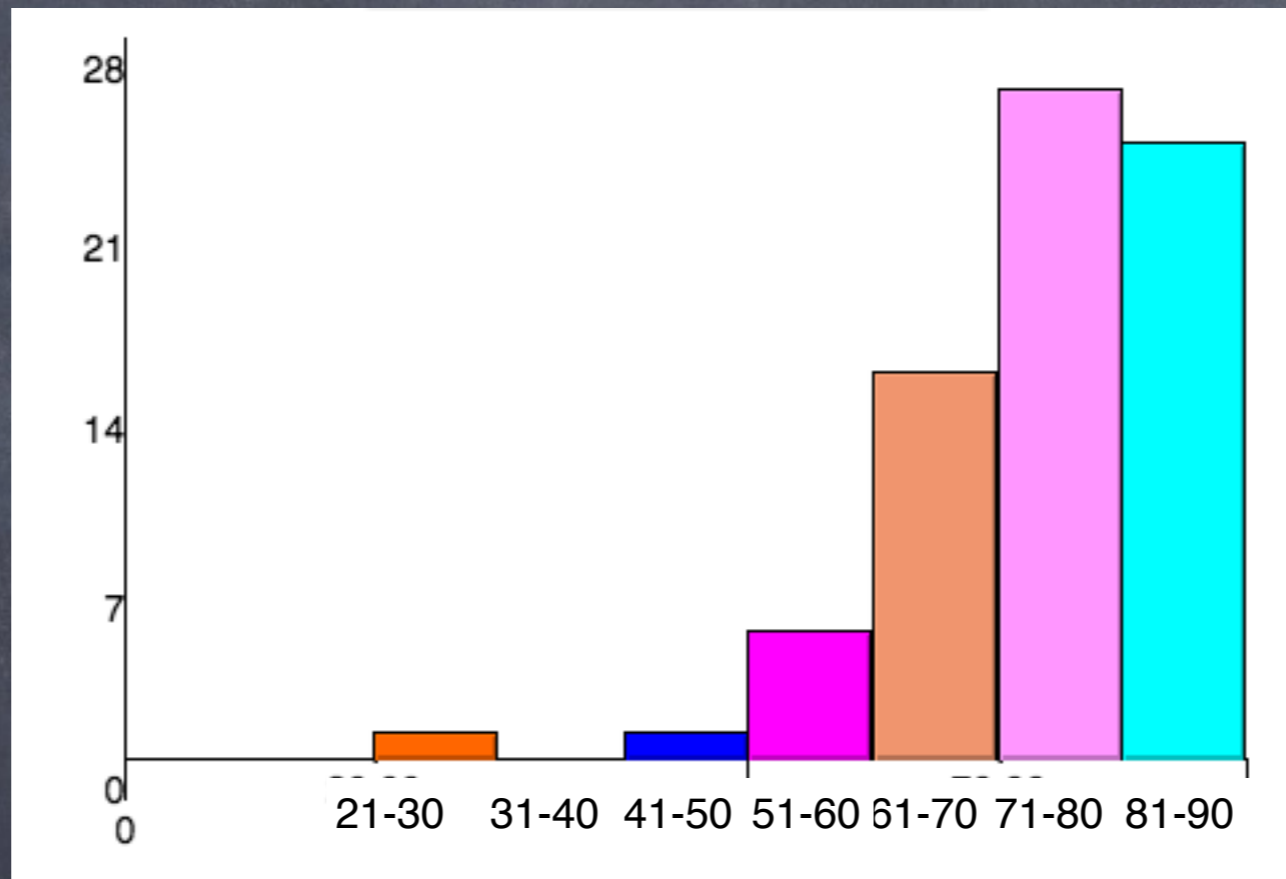


# CSC242: Intro to AI

Lecture 10



# Exam 1





# ULW

- Detailed outline due March 4
  - **HARD DEADLINE!**
- One full page
- Include citations to at least 3 sources

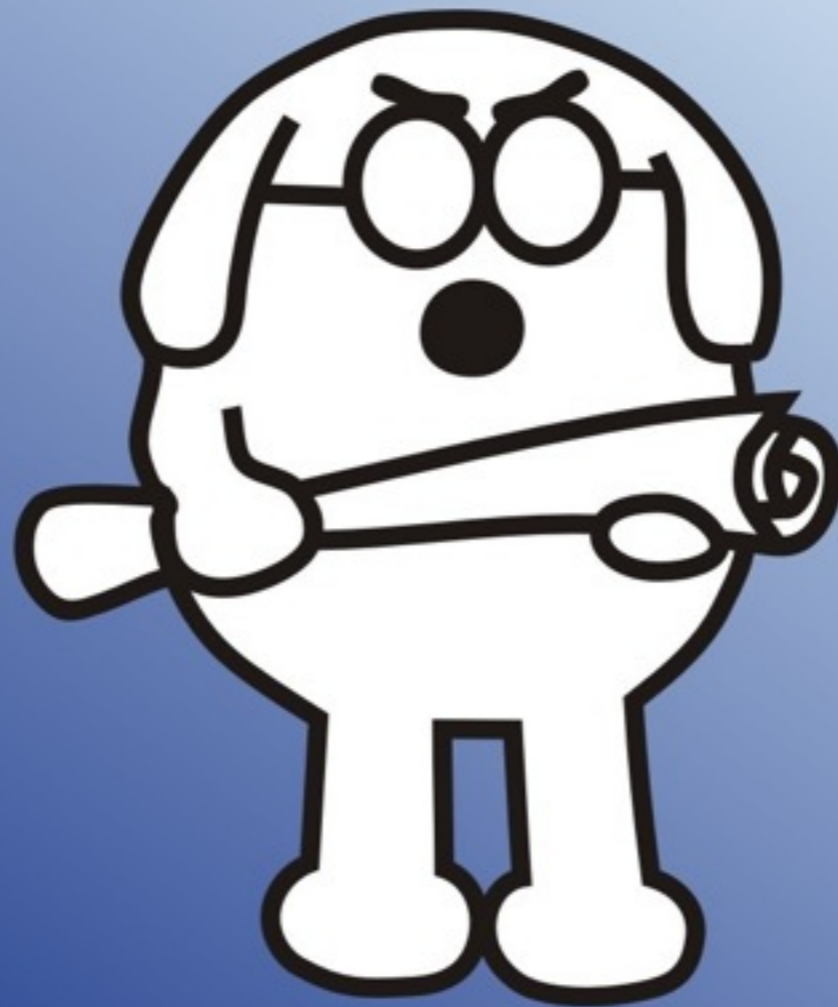


# Othello

- Thursday Feb 27 by 11:59pm:
- One member of team (either one) upload via Blackboard zip file containing
  - Single directory, name of the form **screaming-banjoes-tim-kopp-henry-kautz**
  - Source code
  - Compiled code (linux)
  - Report (pdf, doc, docx)



# First-Order Logic



I'M WRITING A BOOK  
THAT DEBUNKS THE  
EFFECTIVENESS OF  
BUSINESS CONSULTANTS.



S. Adams E-mail: SCOTTADAMS@AOL.COM

BUT COMMON SENSE  
WOULD SAY THAT  
YOU'RE BEING A  
CONSULTANT YOURSELF,  
SO YOUR OPINION IS  
LOGICALLY  
FLAWED.



6/26/97 © 1997 United Feature Syndicate, Inc.

ONLY PEOPLE WITH NO  
COMMON SENSE WILL  
BUY YOUR BOOK.



I PREFER TO  
CALL THEM THE  
MASS MARKET.

- Rooms adjacent to pits will have breezes
- Socrates is a person  
All people are mortal
- Anybody's grandmother is either their mother's or their father's mother

# Logic 2.0

- Define a language based on propositional logic that will allow us to say all these things
- Define entailment (“follows from”)
- Find inference rules that will allow us to compute the consequences of our knowledge (entailments)



“Socrates is a person”

P          socrates\_is\_a\_person

“Socrates is a person”

P      socrates\_is\_a\_person

“George is a person”

Q      george\_is\_a\_person

“Fido is a dog”

R      fido\_is\_a\_dog

“Dogbert is a dog”

S      dogbert\_is\_a\_dog

“Dogbert is an executive”

T      dogbert\_is\_an\_executive



# Object-Oriented

- Objects: Socrates, George, Fido, Dogbert
- Classes: Person, Dog, Executive, ...

Socrates = new Person()

George = new Person()

Fido = new Dog()

Dogbert = new (Dog() and Executive())?

# Constants

- Symbols denoting objects in the world
- Socrates, George, Fido, Dogbert, ...

denote |di'nōt|

verb [ trans. ]

be a sign of; indicate : *this mark denotes purity and quality.*

- (often **be denoted**) stand as a name or symbol for :  
*the level of output per firm, denoted by  $X$ .*



# Predicates

- Denote relationships between objects
- *Predicate(arg 1, arg2, ..., argn)*
  - Man(Socrates), Dog(Fido)
  - Adjacent(George, Fido)
  - Between(Cheese, Burger, Bun)
  - Dog(Dogbert) and Executive(Dogbert)

“Anybody’s grandmother is either their mother’s or their father’s mother”



# Functions

- Names for objects built out of other objects
- *function(arg 1, arg2, ..., argn)*
  - *boss(George)*
  - *mother(Socrates)*
  - *room(1,2)*

- “George’s father is Dogbert’s boss”  
father(George) = boss(Dogbert)
- “Socrates’ mother is a person”  
Person(mother(Socrates))
- “Room 1,2 is adjacent to to room 1,1”  
Adjacent(room(1,2), room(1,1))

- Constants that denote objects in the world
- Function symbols that denote a mapping from a tuple of objects to another object
- Predicate symbols that denote relations (sets of tuples of objects)
- Term = constant or function+terms

# Connectives

- Negation (not,  $\neg$ )
- Conjunction (and,  $\wedge$ )
- Disjunction (or,  $\vee$ )
- Implication (if-then,  $\Rightarrow$ )
- Biconditional (if and only if,  $\Leftrightarrow$ )



- $\text{Person}(\text{George}) \wedge \text{Dog}(\text{Fido})$
- $\text{Cat}(\text{Dogbert}) \wedge \text{Dog}(\text{Dogbert})$
- $\neg \text{Mouse}(\text{Dogbert})$
- $\text{Adjacent}(\text{room}(2,1), \text{room}(1,1)) \wedge$   
 $\text{Adjacent}(\text{room}(2,1), \text{room}(2,2)) \wedge \dots$
- $\text{Dog}(\text{Dogbert}) \Rightarrow \text{Mammal}(\text{Dogbert})$
- $\text{Dog}(\text{Dogbert}) \Rightarrow \text{Barks}(\text{Dogbert})$

- $\text{Dog}(\text{Dogbert}) \Rightarrow \text{Mammal}(\text{Dogbert})$
- $\text{Dog}(\text{Dogbert}) \Rightarrow \text{Barks}(\text{Dogbert})$
- $\text{Dog}(\text{Scooby}) \Rightarrow \text{Mammal}(\text{Scooby})$
- $\text{Dog}(\text{Scooby}) \Rightarrow \text{Barks}(\text{Scooby})$

- “All dogs are mammals”
- “All dogs bark”
- “All people are mortal”
- “All rooms adjacent to pits are breezy”

# Variables

- Denote objects, but we don't know which
- Are terms: can appear wherever a constant or function expression can
  - Dog(x)
  - Happy(father(y))
  - Adjacent(room(x,y), room(+ (x, l), y))



# Quantifiers

- If  $\alpha$  is a sentence, then so are
  - $\forall x \alpha$
  - $\exists x \alpha$

# Universal quantification

- $\forall x \alpha$  is true if  $\alpha$  is true for all possible values of  $x$
- $\forall x \text{Dog}(x) \Rightarrow \text{Mammal}(x)$
- $\forall y \text{Dog}(y) \wedge \text{Mammal}(y)$

# Existential quantification

- $\exists x \alpha$  is true if  $\alpha$  is true for some possible values of  $x$
- $\exists x \text{Manages}(x, \text{Dogbert})$
- $\exists r \text{Room}(r) \wedge \text{In}(\text{Wumpus}, r)$

# First-Order Logic

- Constants and variables that denote objects in the world
- Function symbols that denote a mapping from a tuple of objects to another object
- Predicate symbols that denote relations (sets of tuples of objects)
- Connectives
- Quantifiers



# A Programming Language for Knowledge

- Syntax:
  - What counts as a well-formed statement, formula, sentence, or program
- Semantics:
  - What these statements, formulas, sentences, or programs mean

# Semantics of First-Order Logic

# Models for PL

- Assignment of truth values to propositional variables

# Models for PL

B	P	P	P	B
true	true	true	true	true
false	true	true	true	false
true	false	true	true	true
false	false	true	true	false
true	true	false	true	true
false	true	false	true	false
true	false	false	false	false
false	false	false	false	true

# First-Order Logic

- Constants and variables that denote objects in the world
- Function symbols that denote a mapping from a tuple of objects to another object
- Predicate symbols that denote relations (sets of tuples of objects)
- Connectives
- Variables and Quantifiers

# FOL: Constants

- Refer to objects in the world



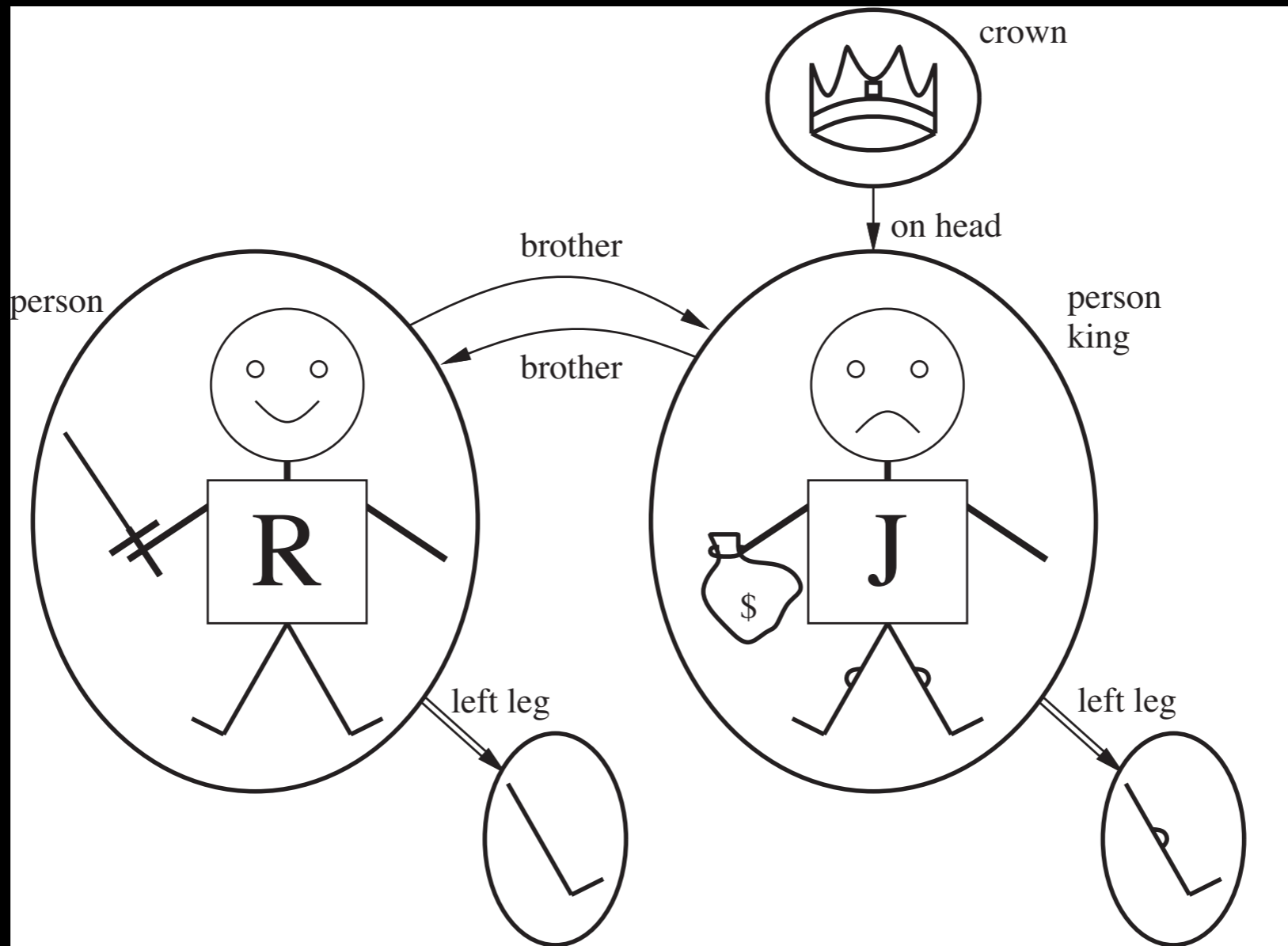


Richard  
(1157-1199)



John  
(1166-1216)





# Models for FOL: Domain

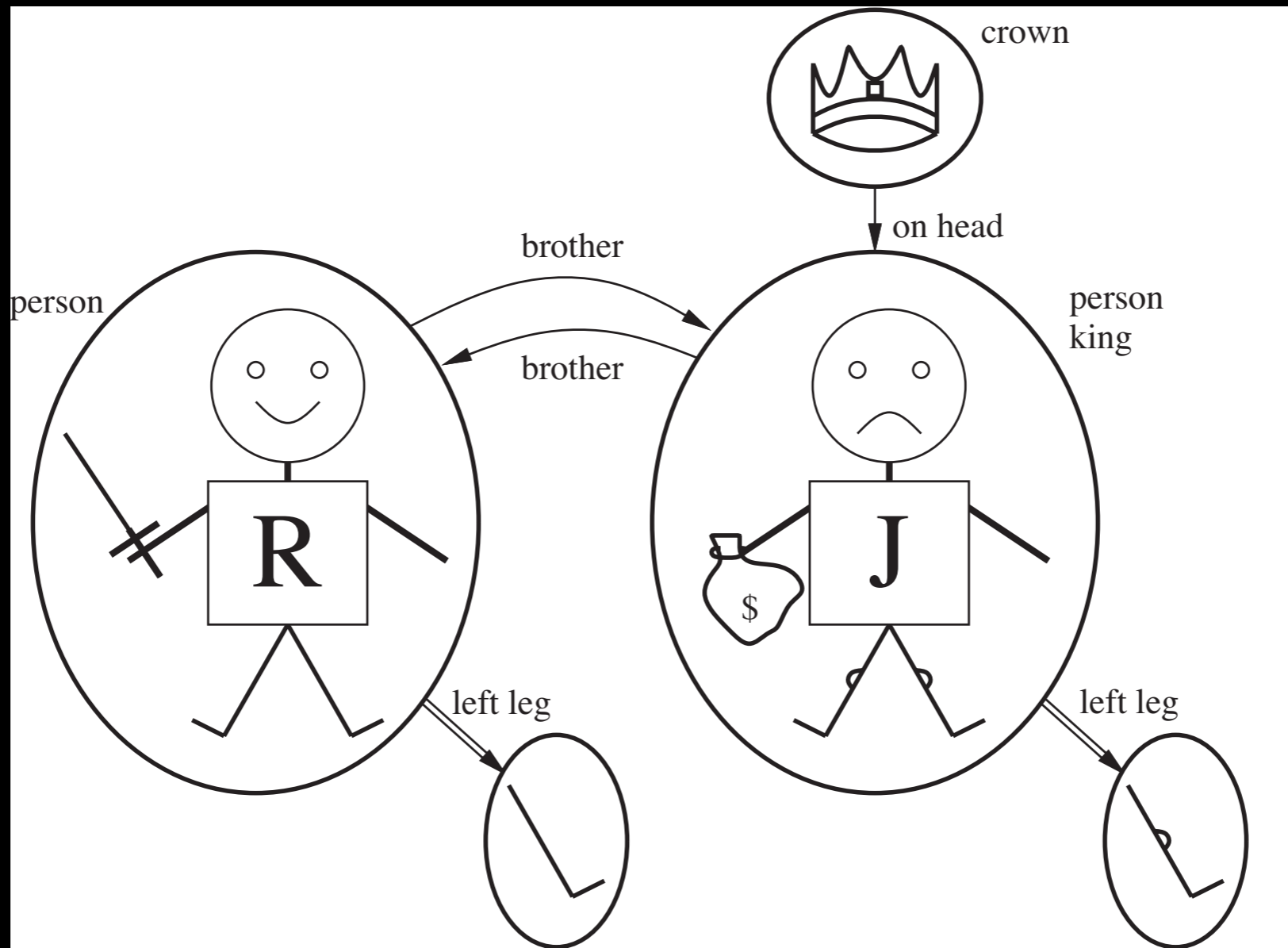
- Non-empty set of objects in the world

# FOL: Constants

- Each constant refers to some element of the domain (some object in the world)

# FOL: Predicates

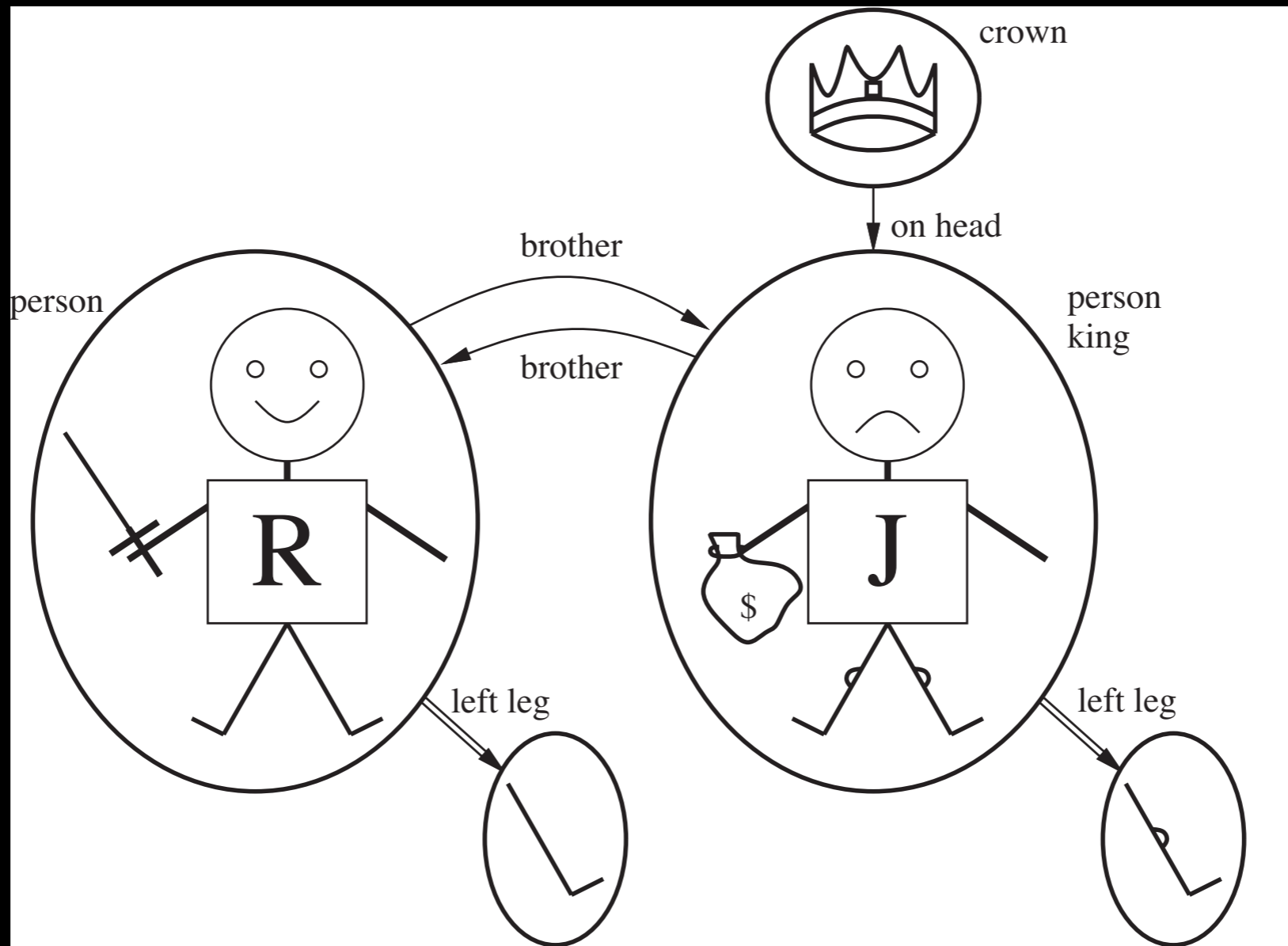
- Refer to relations between objects
- Relations = tuples (ordered sets) of objects that are related



$Person = \{\langle R \rangle, \langle J \rangle\}$

$King = \{\langle J \rangle\}$

$Crown = \{\langle C \rangle\}$



$$Brother = \{\langle R, J \rangle, \langle J, R \rangle\}$$

$$OnHead = \{\langle C, J \rangle\}$$

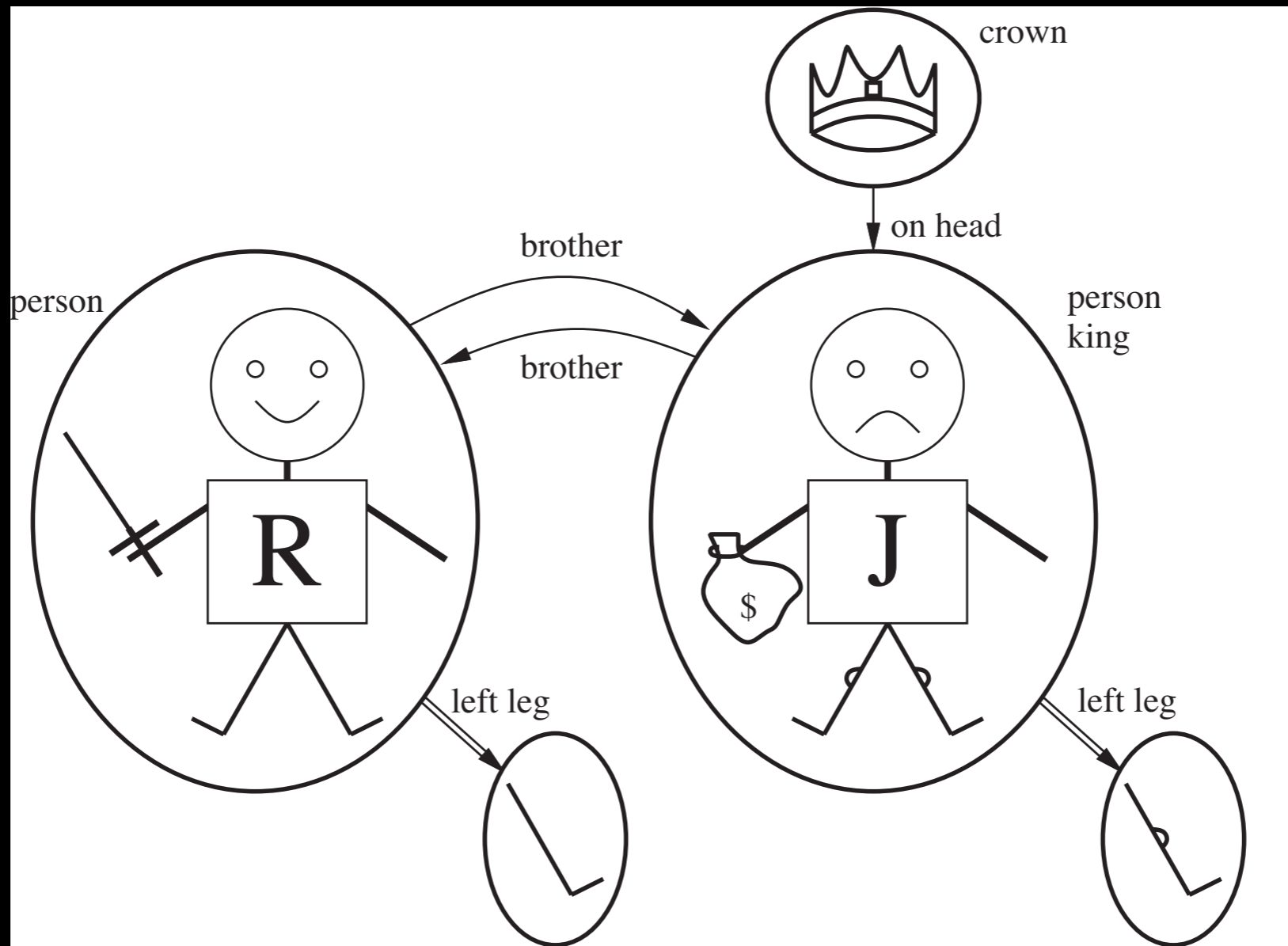
# Models for FOL: Relations

- Sets of tuples of objects
  - Unary: one object
  - Binary: pair of objects
  - Ternary: triple of objects
  - $n$ -ary:  $n$ -tuple of objects



# FOL: Functions

- Refer to objects in terms of other objects
- Functions = Total mapping from tuples of objects to objects



$$LeftLeg = \{ \langle R \rangle \rightarrow LLR, \langle J \rangle \rightarrow LLJ \}$$

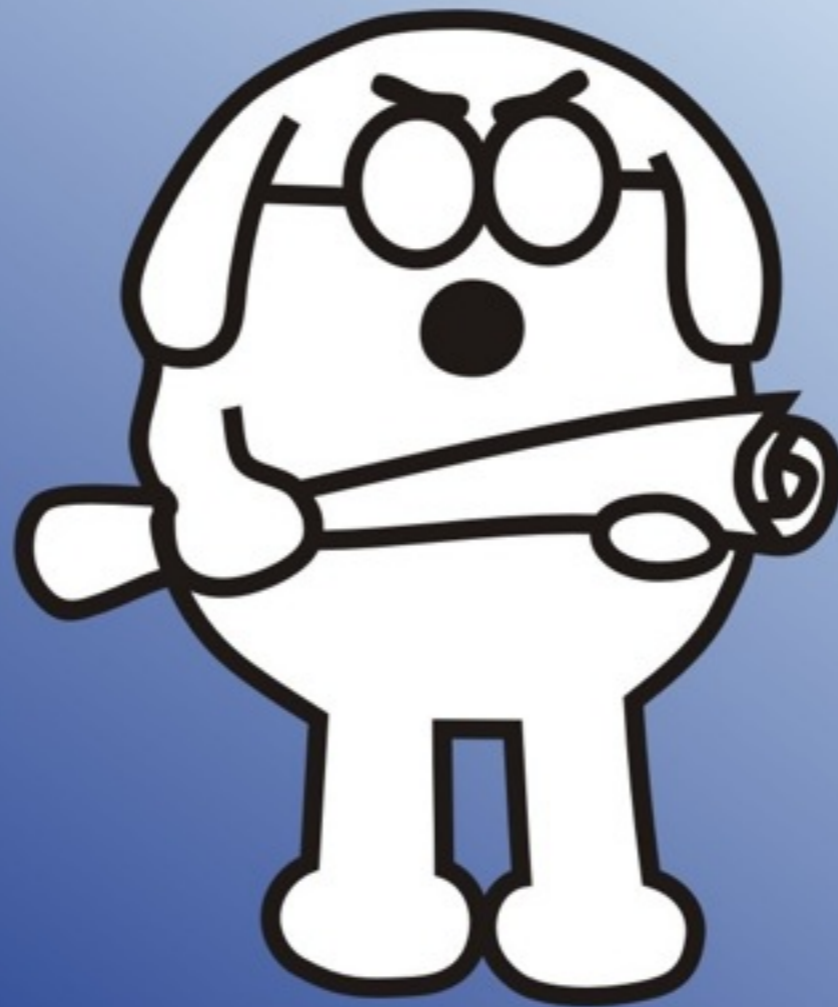
# Models for FOL: Functions

- Total mappings from tuples of objects to objects
  - Unary: one object
  - Binary: pair of objects
  - Ternary: triple of objects
  - $n$ -ary:  $n$ -tuple of objects

# Models for FOL

- Domain: Non-empty set of objects in the world
- Relations: Sets of tuples of objects
- Functions: Total mappings from tuples of objects to objects

# So What?



- Models are possible worlds
- We want to be able to compute whether a sentence is true in a model
- From that we can define entailment
- And then we can do inference (“follows from”)!

# Interpretation

- Mapping from elements a sentence to elements of a model
- Specifies exactly which objects, relations, and functions are referred to by the constant, predicate, and function symbols



# Interpretation

- *R* refers to Richard the Lionheart
- *J* refers to evil King John
- *Brother* refers to the brotherhood relation (that is, the set of tuples we saw before); similarly *OnHead*, *Person*, *King*, and *Crown*
- *LeftLeg* refers to the “left leg of” function (that is, the mapping we saw before)

# Models for FOL

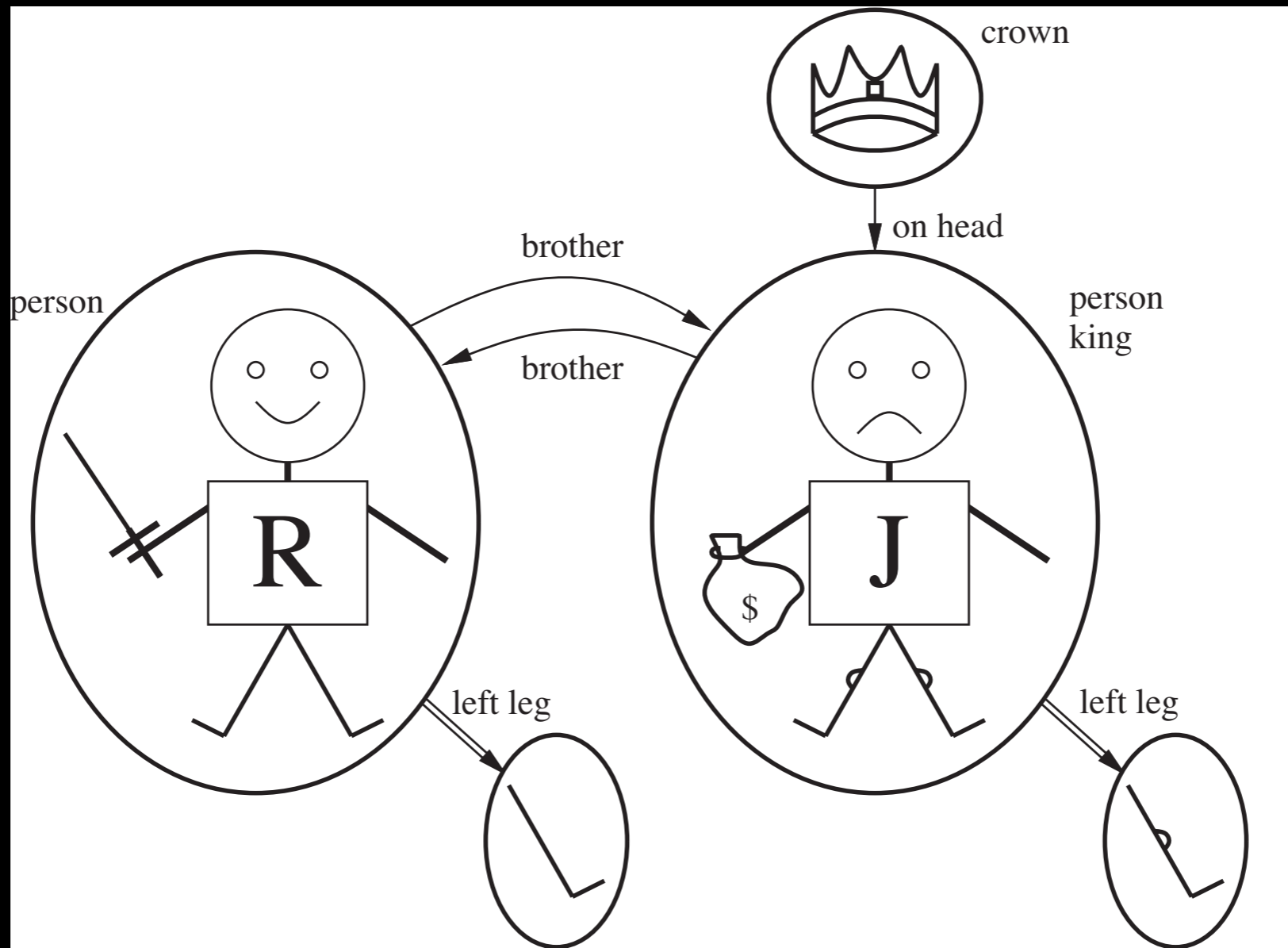
- Domain: Non-empty set of objects in the world
- Interpretation that maps:
  - Constants to objects
  - Predicate symbols to relations between objects
  - Function symbols to total functions on objects

# Atomic Sentences

- Predicate symbol + list of terms (arguments)
  - *Brother(R, J)*
  - *Married(Father(Richard), Mother(John))*
- True in a model if the relation referred to by the predicate symbol holds among the objects referred to by the arguments

# Interpretation

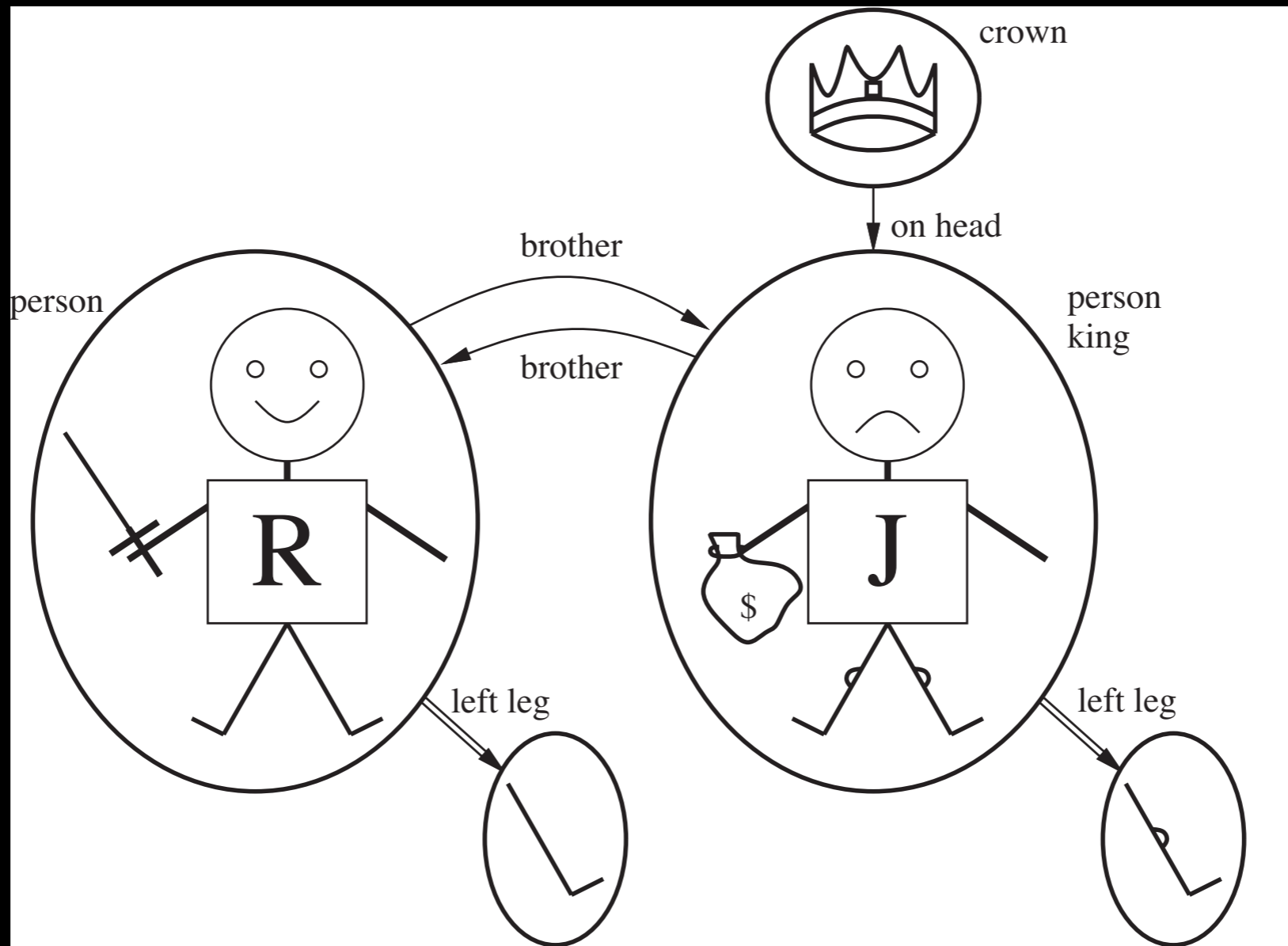
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- *LeftLeg* refers to the “left leg of” function (that is, the mapping we saw before)



$Brother = \{\langle R, J \rangle, \langle J, R \rangle\}$

$OnHead = \{\langle C, J \rangle\}$

Brother(R, J) ✓



$Brother = \{\langle R, J \rangle, \langle J, R \rangle\}$

$OnHead = \{\langle C, J \rangle\}$

Brother(C, J) ✗

# Atomic Sentences

- Predicate symbol + list of terms (arguments)
  - *Brother(R, J)*
  - *Married(Father(Richard), Mother(John))*
- True in a model if the relation referred to by the predicate symbol holds among the objects referred to by the arguments

# Complex Sentences

- Connectives combine sentences
  - $\neg \text{Brother}(\text{LeftLeg}(R), J)$
  - $\text{Brother}(R, J) \wedge \text{Brother}(J, R)$
  - $\neg \text{King}(R) \Rightarrow \text{King}(J)$
- Same semantics as propositional logic!
  - True in a model if truth values of arguments satisfies truth table for connective



# First-Order Logic

- Constants and variables that denote objects in the world
- Function symbols that denote a mapping from a tuple of objects to another object
- Predicate symbols that denote relations (sets of tuples of objects)
- Connectives

# First-Order Logic

- Constants and variables that denote objects in the world
- Function symbols that denote a mapping from a tuple of objects to another object
- Predicate symbols that denote relations (sets of tuples of objects)
- Connectives
- Variables and Quantifiers

- “All dogs are mammals”
- “All dogs bark”
- “All people are mortal”
- “All rooms adjacent to pits are breezy”
- “Some room contains the wumpus”

# Quantifiers

- If  $\alpha$  is a sentence, then so are
  - $\forall x \alpha$  (universal quantifier)
  - $\exists x \alpha$  (existential quantifier)

# Universal Quantifier

- $\forall x P$  says that  $P$  is true for every object  $x$
- $\forall x P$  is true in a model if  $P$  is true in all possible extended interpretations of the interpretation in the model
- Each extended interpretation maps  $x$  to an object in the domain of the model

- $\forall x \text{ King}(x) \Rightarrow \text{Person}(x)$
- Intended interpretation:
  - Domain: Richard, John, crown, Richard's left leg, John's left leg
- Extended interpretations:
  - $x \rightarrow \text{Richard}$
  - $x \rightarrow \text{John}$
  - $x \rightarrow \text{the crown}$
  - $x \rightarrow \text{Richard's left leg}$
  - $x \rightarrow \text{John's left leg}$

- $\forall x \text{ King}(x) \Rightarrow \text{Person}(x)$
- Extended interpretations:
  - Richard is a king  $\Rightarrow$  Richard is a person
  - John is a king  $\Rightarrow$  John is a person
  - The crown is a king  $\Rightarrow$  The crown is a person
  - Richard's left leg is a king  $\Rightarrow$  Richard's left leg is a person
  - Richard's left leg is a king  $\Rightarrow$  Richard's left leg is a person

# Universal Quantifier

- $\forall x P$  says that  $P$  is true for every object  $x$
- $\forall x P$  is true in a model if  $P$  is true in all possible extended interpretations of the interpretation in the model
- Each extended interpretation maps  $x$  to an object in the domain of the model



# Existential Quantifier

- $\exists x P$  says that  $P$  is true for some object  $x$
- $\exists x P$  is true in a model if  $P$  is true in at least one possible extended interpretation of the interpretation in the model
- Each extended interpretation maps  $x$  to an object in the domain of the model

- $\exists x \text{Crown}(x) \wedge \text{OnHead}(x,J)$
- Intended interpretation:
  - Domain: Richard, John, crown, Richard's left leg, John's left leg
- Extended interpretations:
  - $x \rightarrow \text{Richard}$
  - $x \rightarrow \text{John}$
  - $x \rightarrow \text{the crown}$
  - $x \rightarrow \text{Richard's left leg}$
  - $x \rightarrow \text{John's left leg}$

- $\exists x \text{Crown}(x) \wedge \text{OnHead}(x,J)$
- Extended interpretations:
  - Richard is a crown  $\wedge$  Richard is on John's head on John's head
  - John is a crown  $\wedge$  John is on John's head
  - The crown is a crown  $\wedge$  The crown is on John's head
  - Richard's left leg is a crown  $\wedge$  Richard's left leg is on John's head
  - Richard's left leg is a crown  $\wedge$  Richard's left leg is on John's head

# Existential Quantifier

- $\exists x P$  says that  $P$  is true for some object  $x$
- $\exists x P$  is true in a model if  $P$  is true in at least one possible extended interpretation of the interpretation in the model
- Each extended interpretation maps  $x$  to an object in the domain of the model

# Nested Quantifiers

- “Brothers are siblings”
  - $\forall x \forall y \text{ Brother}(x,y) \Rightarrow \text{Sibling}(x,y)$
- “Everybody loves somebody”
  - $\forall x \exists y \text{ Loves}(x,y)$
- “Somebody is loved by everybody”
  - $\exists y \forall x \text{ Loves}(x,y)$

# Models for FOL

- Domain: Non-empty set of objects in the world
- Interpretation that maps:
  - Constants to objects
  - Predicate symbols to relations between objects
  - Function symbols to total functions on objects

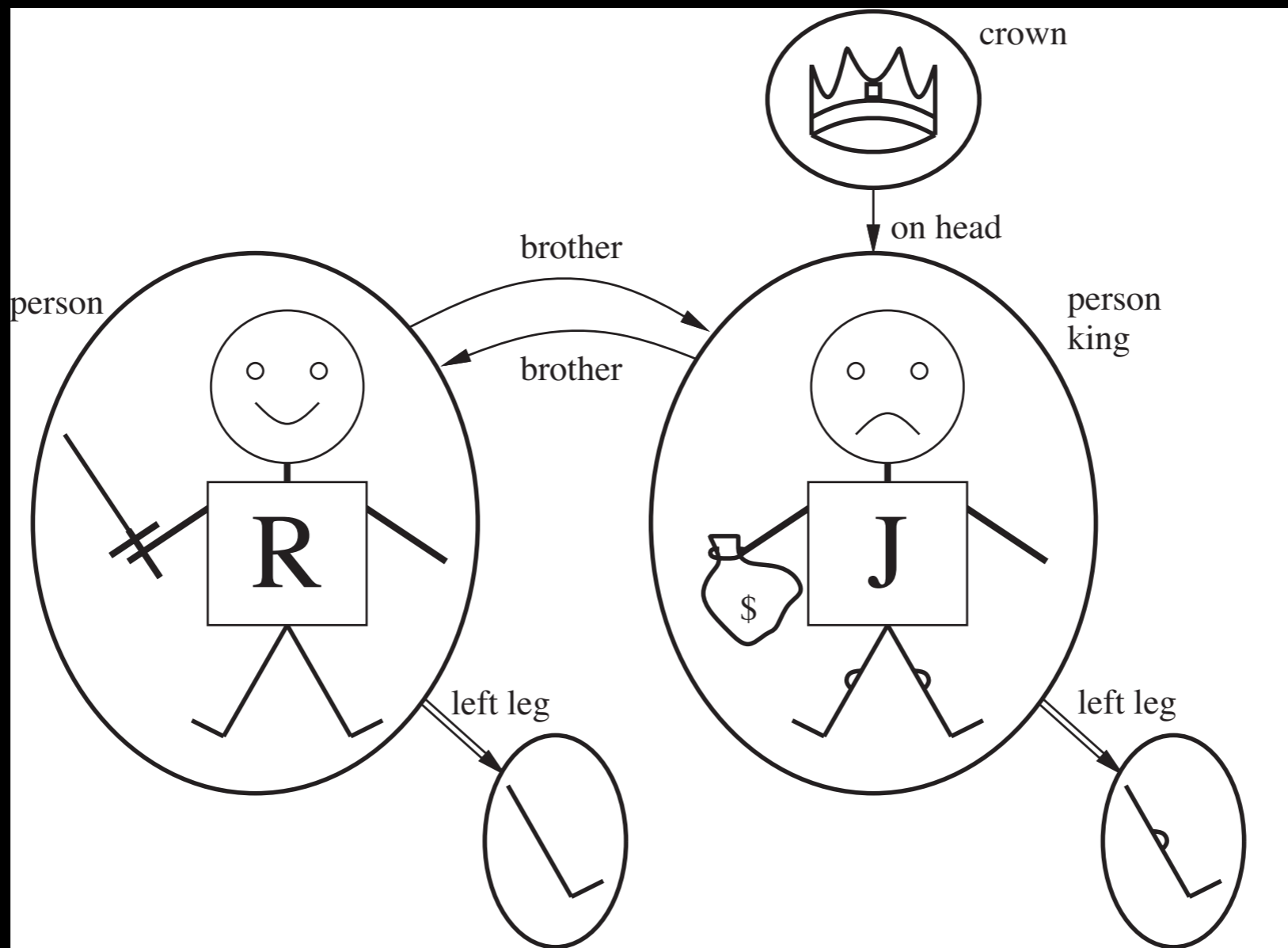
# Entailment

- $\alpha$  entails  $\beta$  when:
  - $\beta$  is true in every world considered possible by  $\alpha$
  - Every model of  $\alpha$  is also a model of  $\beta$
  - $Models(\alpha) \subseteq Models(\beta)$

# All Possible Models

- # of objects from 1 to  $\infty$
- Some constants refer to the same object
- Some objects are not referred to by any constant (“unnamed”)
- Relations and functions defined over sets of subsets of objects
- Variables range over all possible objects in extended interpretations





137,506,194,466 models with  $\leq 6$  objects!

# Computing Entailment

- Number of models (probably) unbounded
  - And anyway hard to evaluate truth in a model
- Can't do model checking
- Look for inference rules, do theorem proving

For Next Time  
AIMA Ch. 9