

Logic for Knowledge Representation

willie

Announcements

Assignment 0

`outputlog.txt`

Get started on Assignment 1

Assignment 2

Extends Assignment 1

Some code will not be released until after the late period of Assignment 1

Instructions will be released on Monday, as scheduled

Wumpus World

Performance measure

- Gold +100, Death -100

Environment

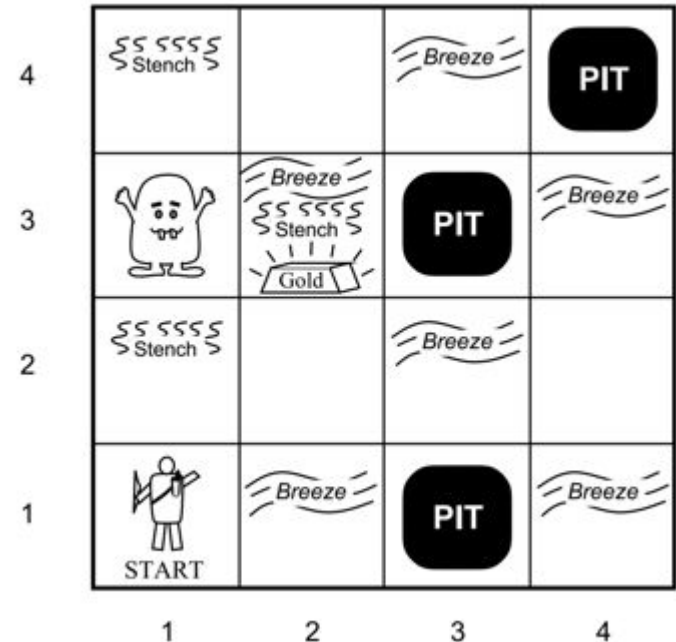
- Squares next to Wumpus are smelly
- Squares next to Pit are breezy

Actuators

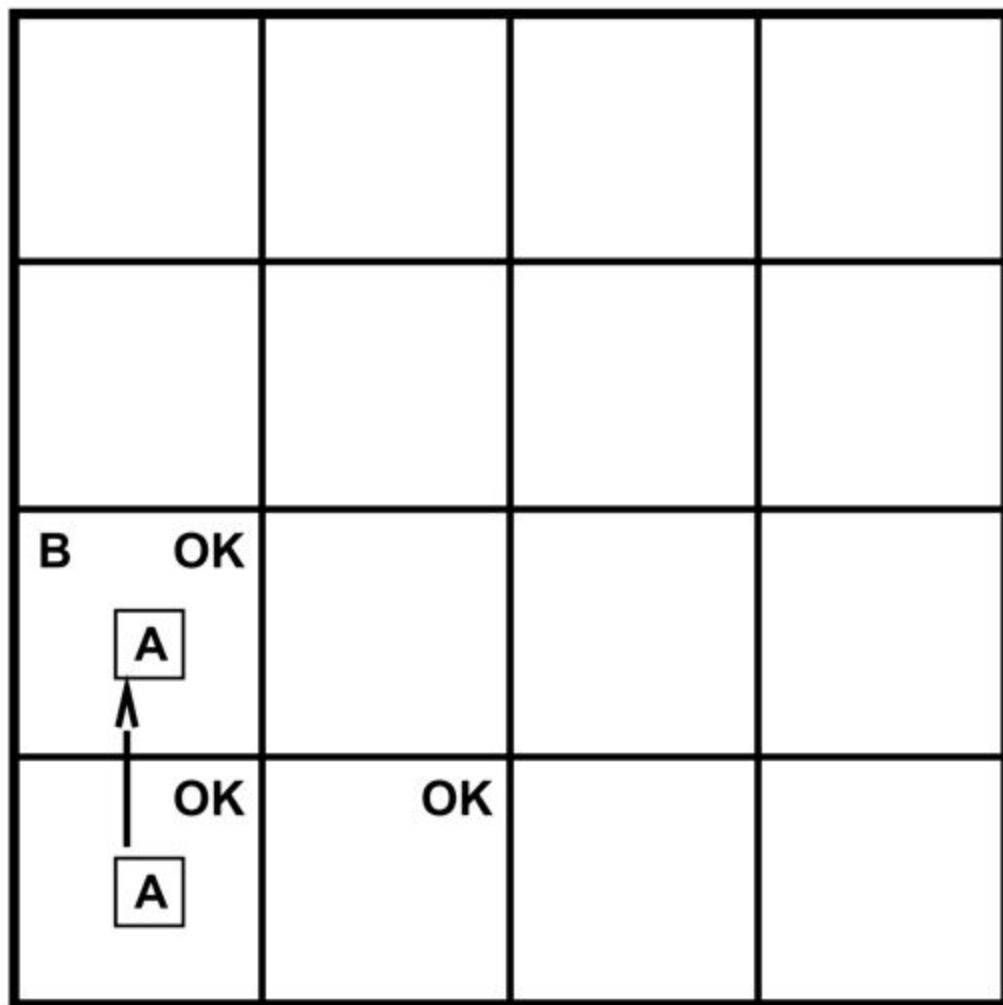
- Move up, down, left, or right
- Grab

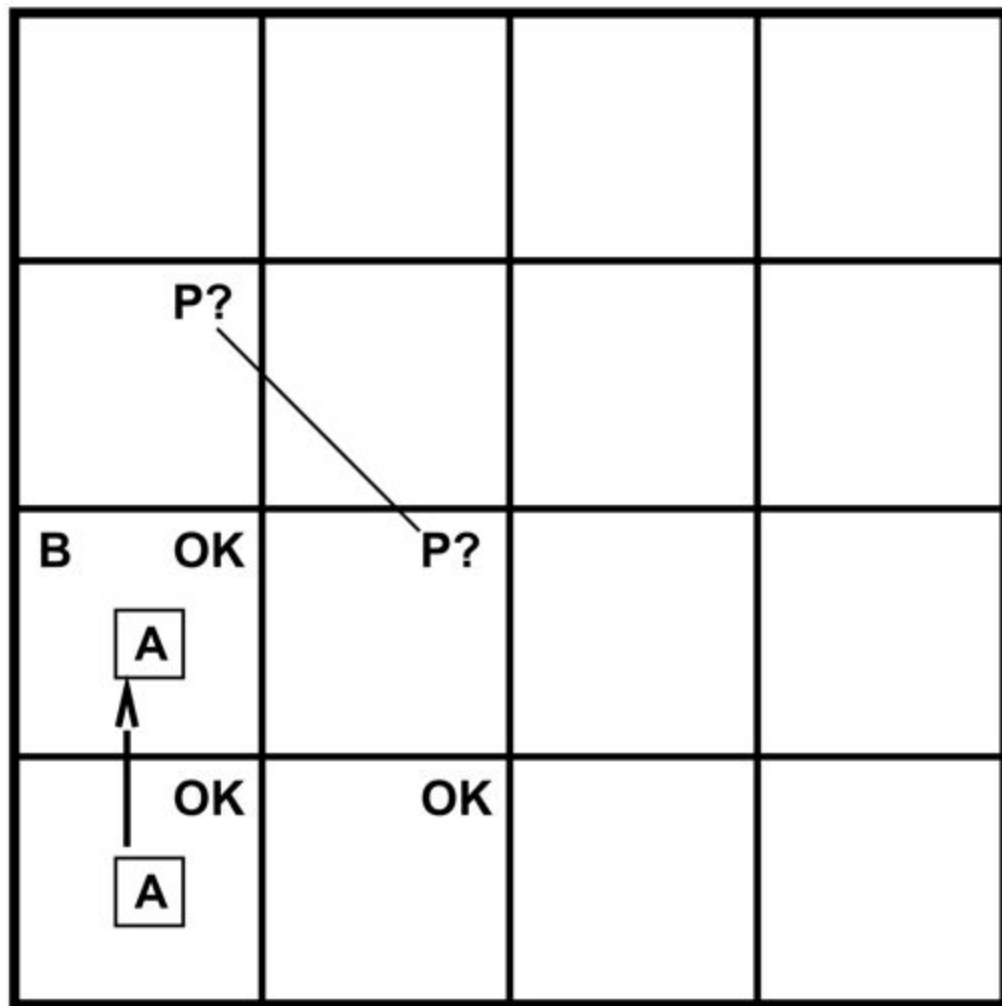
Sensors

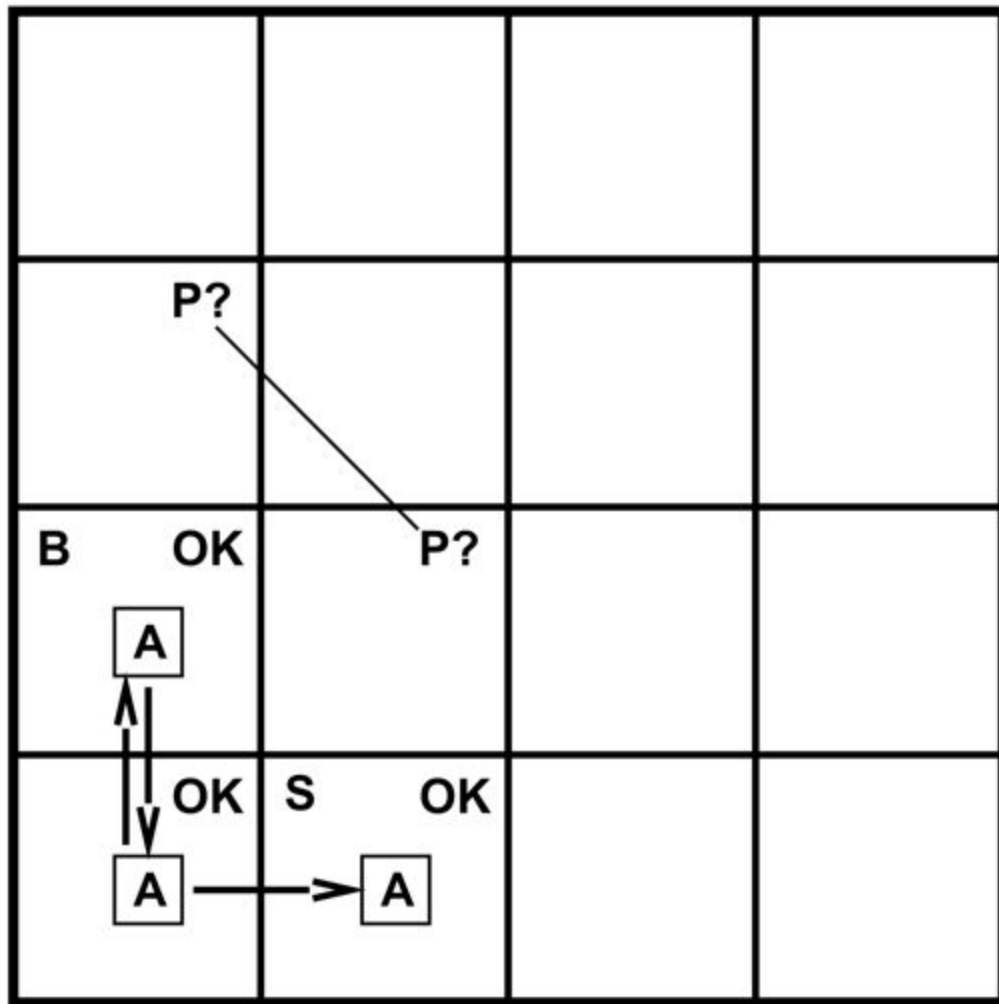
- Breeze, Glitter, Smell

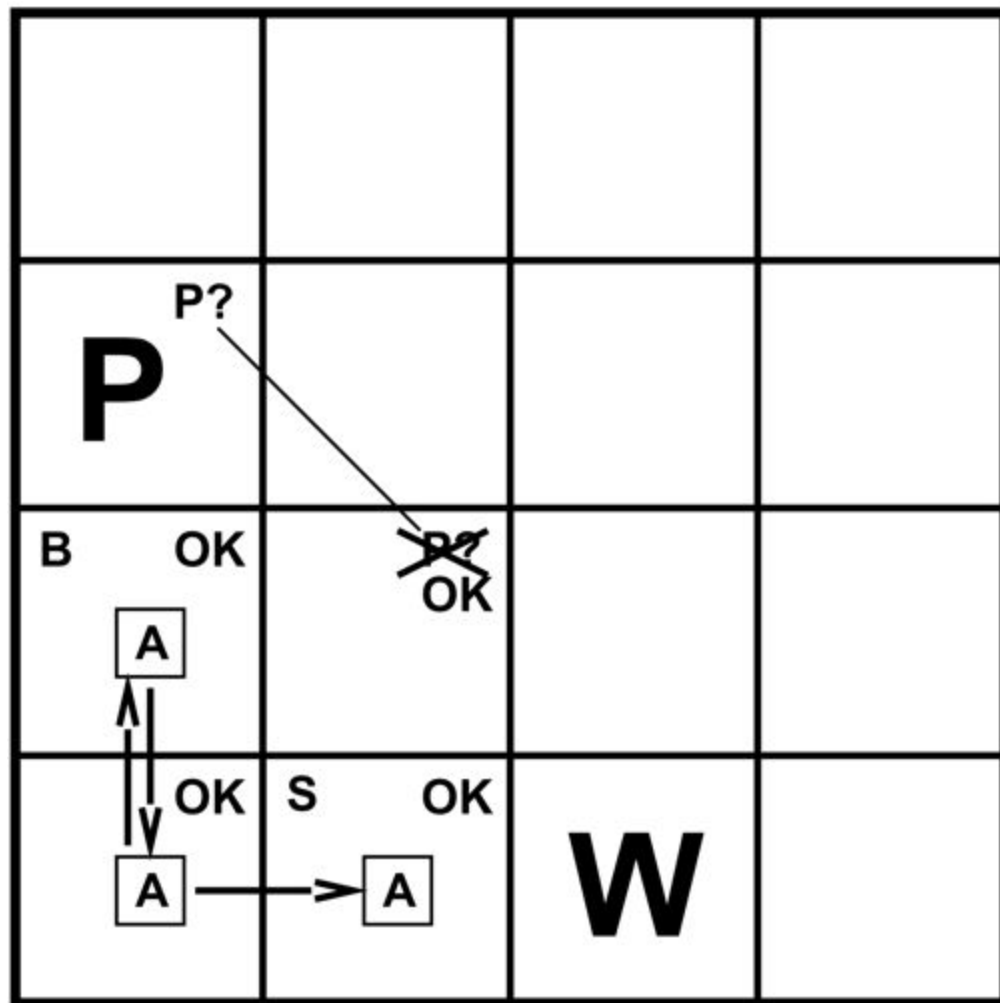


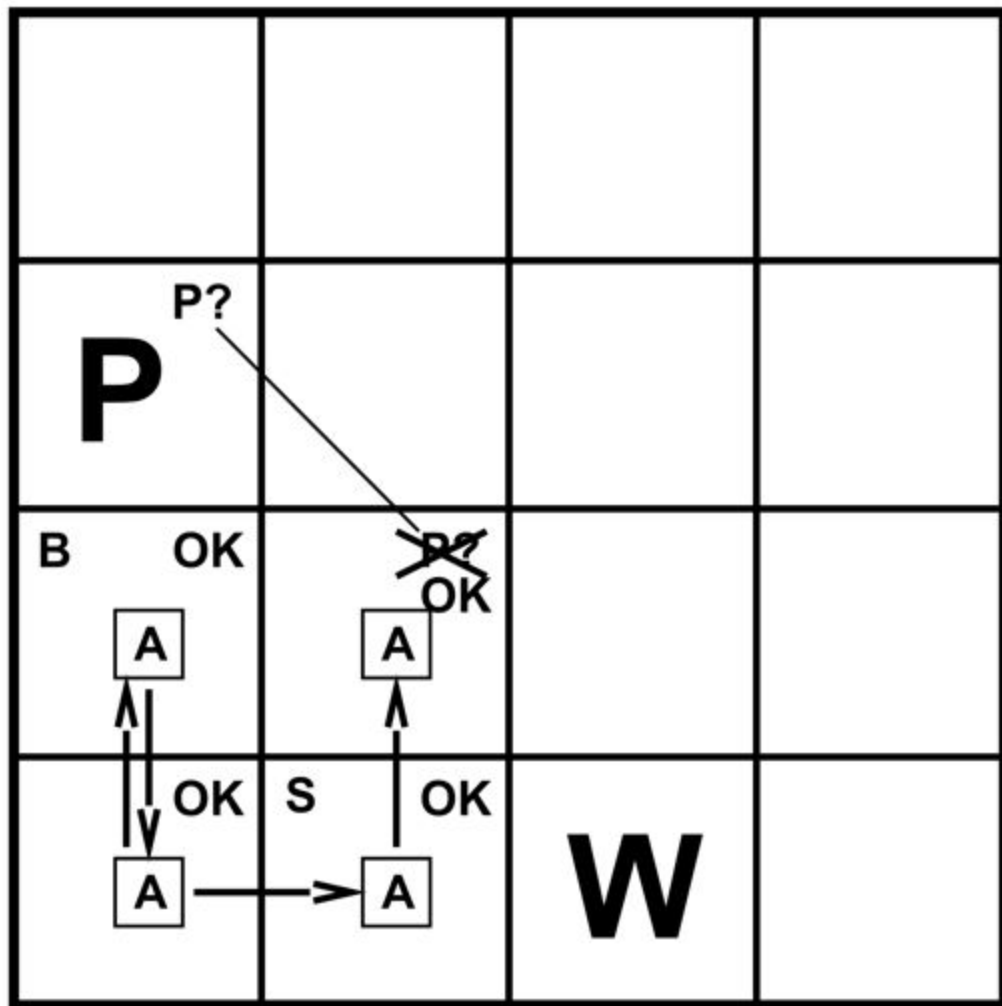
OK			
OK <div>A</div>	OK		

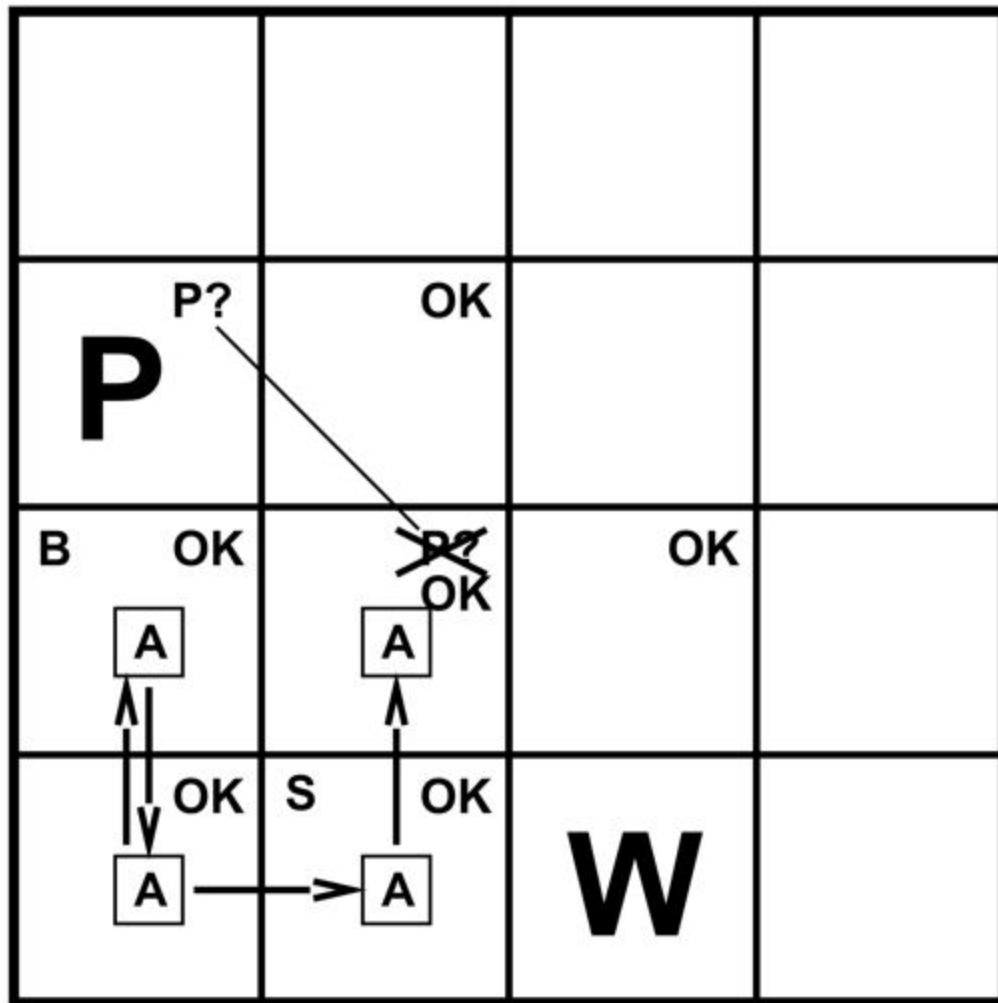


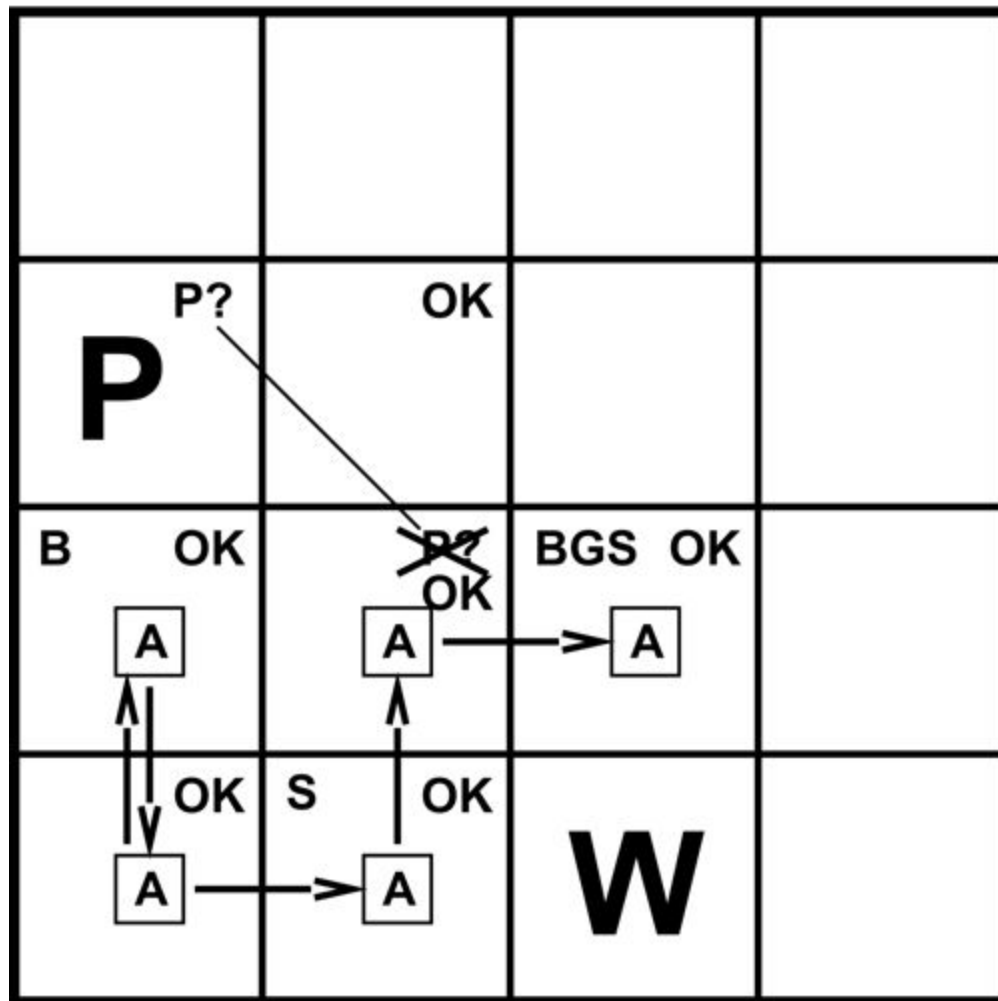




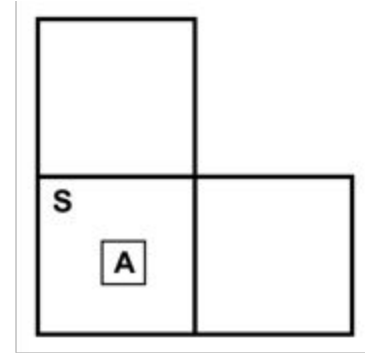
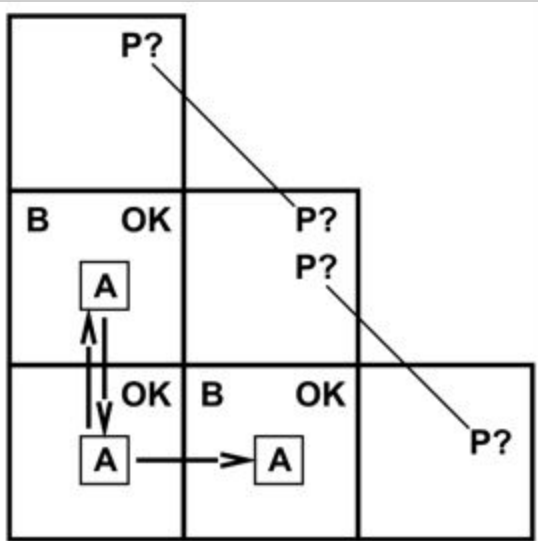








Tight Spots



Entailment

Entailment: One thing follows from another

$a \models b$

a entails b : in every *model* where a is true, b is also true

For example

If a is $x > 4$ and b is $x > 3$, then $a \models b$

If a is “when it rains it is cloudy” and “it is raining” and b is “it is cloudy” then $a \models b$

Propositional Logic

Let's start to formalize this

Symbols to represent elements of the world

Each proposition

A possible condition of the world that may be true or false

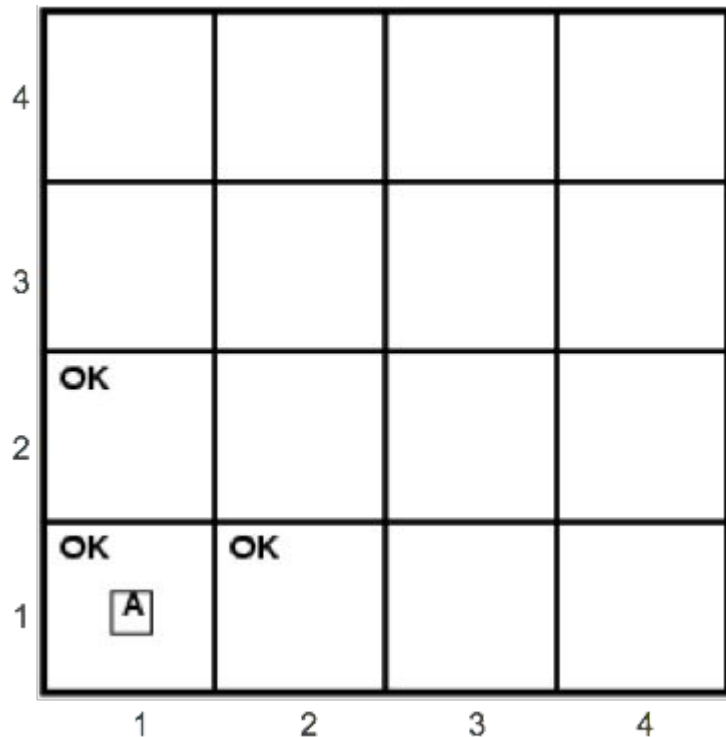
Atomic sentences, single proposition:

`is_raining`

`have_umbrella`

`feel_breeze`

Representing Wumpus World



128 in total,
8 optional symbols per square (16 squares)

Symbol	Meaning
$a_{1,1}$	Agent is at (1,1)
$k_{1,1}$	(1,1) is OK
$e_{1,1}$	Stench at (1,1)
$z_{1,1}$	Breeze at (1,1)
$g_{1,1}$	Glitter at (1,1)
$w_{1,1}$	Wumpus at (1,1)
$p_{1,1}$	Pit at (1,1)
$d_{1,1}$	Gold at (1,1)

Repeat for each position in Wumpus World

Complex sentences

Use operators to turn simple sentences into complex sentences

Operators:

Not	\neg	\sim
-----	--------	--------

And	\wedge	
-----	----------	--

Or	\vee	
----	--------	--

Implies	\Rightarrow	\rightarrow
---------	---------------	---------------

Biconditionals	\Leftrightarrow	\leftrightarrow
----------------	-------------------	-------------------

Examples

It is not raining

\neg raining

It is raining and I have an umbrella

raining \wedge umbrella

It is raining or it is sunny

raining \vee sunny

If it is raining, then I am wet

raining \Rightarrow wet

It is sunny if and only if it is not cloudy

sunny \Leftrightarrow \neg cloudy

Syntax

$S := \langle \text{Sentence} \rangle ;$

$\langle \text{Sentence} \rangle := \langle \text{AtomicSentence} \rangle \mid \langle \text{ComplexSentence} \rangle ;$

$\langle \text{AtomicSentence} \rangle := \text{"TRUE"} \mid \text{"FALSE"} \mid \langle \text{Symbol} \rangle ;$

$\langle \text{Symbol} \rangle := \text{"P"} \mid \text{"Q"} \mid \text{"R"} \mid \dots ;$

$\langle \text{ComplexSentence} \rangle := \text{"("} \langle \text{Sentence} \rangle \text{"}")} \mid$
 $\quad \langle \text{Sentence} \rangle \langle \text{Connective} \rangle \langle \text{Sentence} \rangle \mid$
 $\quad \text{"}\neg\text{"} \langle \text{Sentence} \rangle ;$

$\langle \text{Connective} \rangle := \text{"}\wedge\text{"} \mid \text{"}\vee\text{"} \mid \text{"}\Rightarrow\text{"} \mid \text{"}\Leftrightarrow\text{"} ;$

Complex sentences for Wumpus World

If no stench at (1,1) then adjacent areas do not have the Wumpus

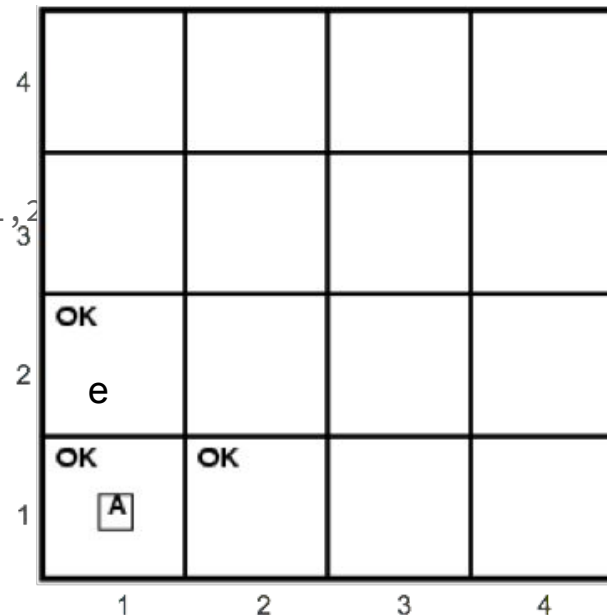
$$\neg e_{1,1} \Rightarrow \neg w_{1,1} \wedge \neg w_{2,1} \wedge \neg w_{1,2}$$

Similarly, if no stench at (2,2)...

$$\neg e_{2,2} \Rightarrow \neg w_{2,2} \wedge \neg w_{2,3} \wedge \neg w_{3,2} \wedge \neg w_{2,1} \wedge \neg w_{1,2}$$

Also

$$e_{1,2} \Rightarrow w_{1,3} \vee w_{1,2} \vee w_{1,1} \vee w_{2,2}$$



Logical Entailment

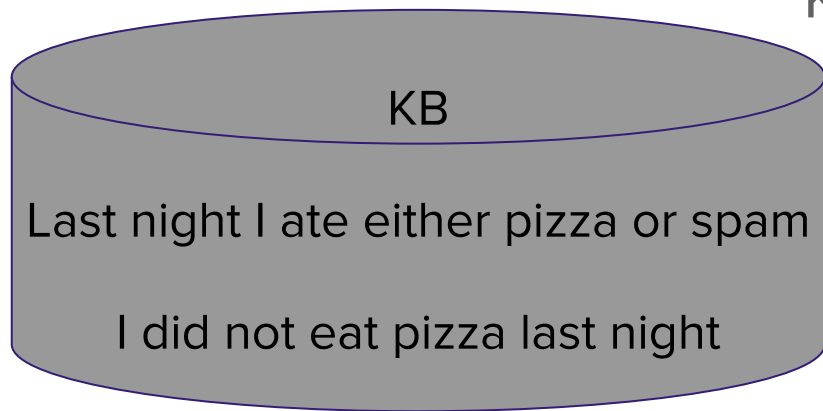
Goal: Deduce new facts using:

Rules about the world (background knowledge)

Information we gather through perception

} KB

$KB \models a$



\models

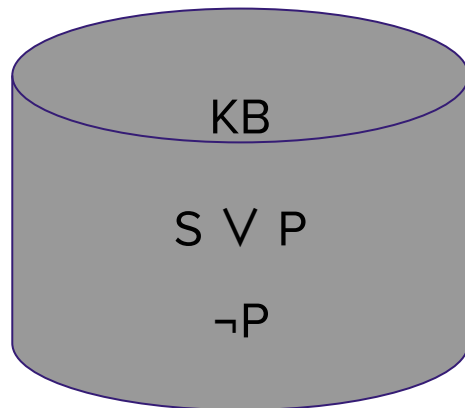
Last night I ate spam

KB entails a : in every *model* where all sentences in KB are true, a is also true

Model

4 possible models b/c
S V P uses both s & p, while s can be T/F and p can be T/F

Assignment of a truth value (true/false) to every atomic sentence



M_1 $S = \text{False}$
 $P = \text{False}$

M_2 $S = \text{False}$
 $P = \text{True}$

M_3 $S = \text{True}$
 $P = \text{False}$

M_4 $S = \text{True}$
 $P = \text{True}$

A Model m is a model of **KB** iff it is a model of all sentences in the **KB**

All sentences in KB are true in m

Satisfiability

A KB is **satisfiable** iff it admits at least one model

Otherwise it is **unsatisfiable**

KB1 is $\{P, \neg Q \wedge R\}$. Satisfiable? Unsatisfiable? ^{yes}

KB2 is $\{\neg P \vee P\}$. Satisfiable? Unsatisfiable? ^{yes}

KB3 is $\{P, \neg P\}$. Satisfiable? Unsatisfiable? ^{no}

$KB \models a$ iff every model of KB is also a model of a

KB entails a iff $\{KB, \neg a\}$ is unsatisfiable

Sound and Complete

Sentence α is derived from KB by algorithm i .

An algorithm i is **sound** (truth preserving) if it derives only entailed sentences

- Highly desirable property

- Doesn't make up facts

An algorithm i is **complete** if it derives all entailed sentences

- Also desirable

Entailment in Wumpus World

Nothing detected in [1,1],

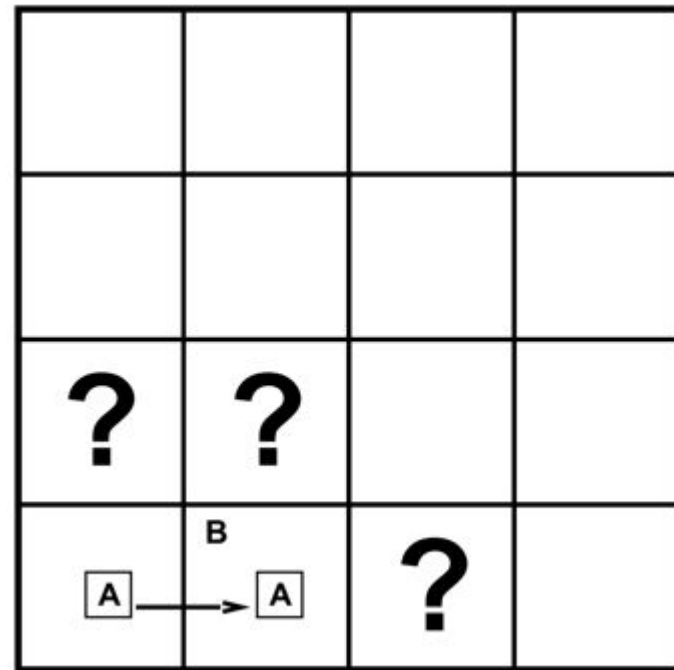
Move right, breeze in [2,1]

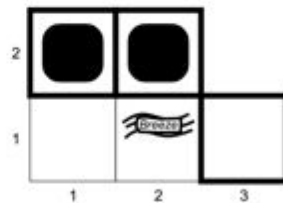
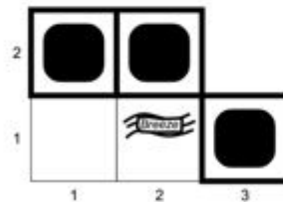
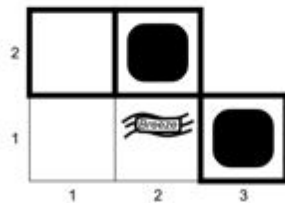
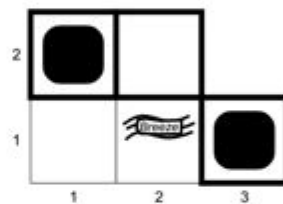
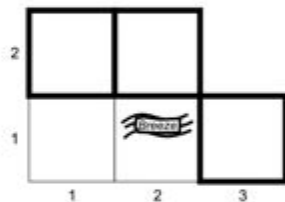
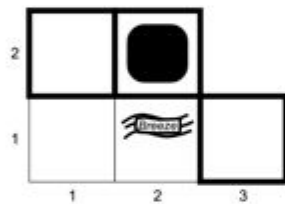
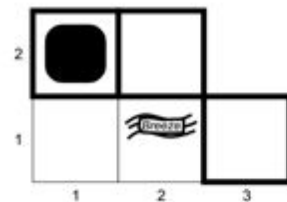
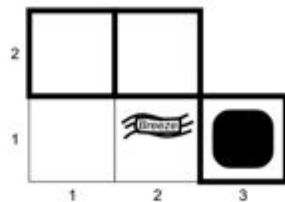
What are the possible worlds for the ?'s

(assuming only pits)

3 Boolean choices

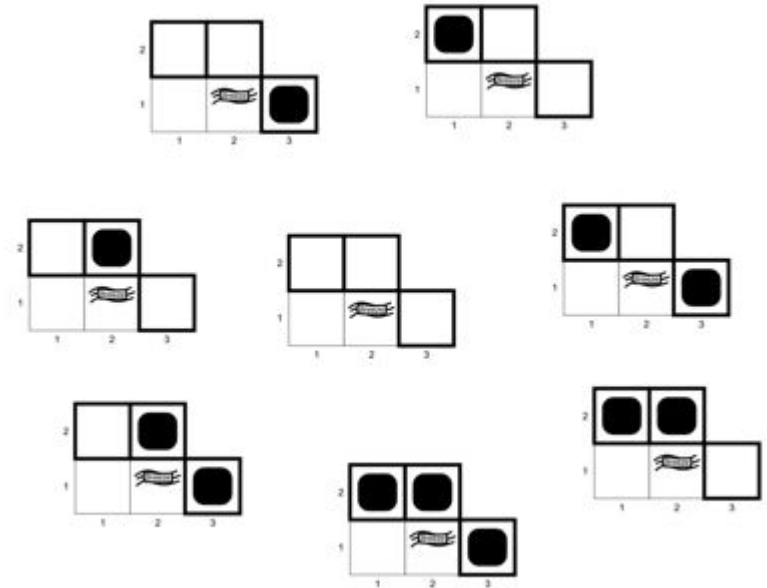
8 models (possible worlds)





Possible worlds

[1,2]	[2,2]	[3,1]
		pit
	pit	
	pit	pit
pit		
pit		pit
pit	pit	
pit	pit	pit

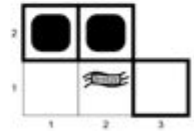
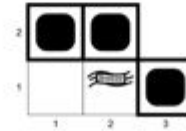
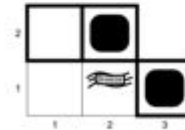
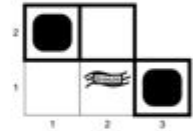
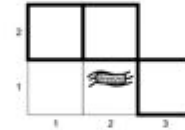
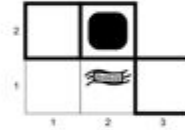
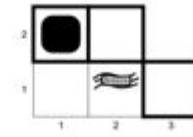
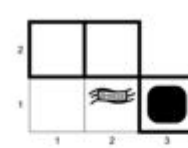


Possible worlds

Nothing detected in $[1,1]$,

Move right, breeze in $[2,1]$

Which of these is a model of the KB?



Possible worlds

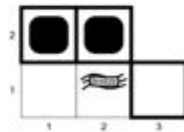
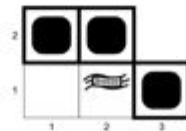
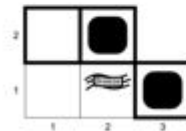
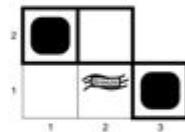
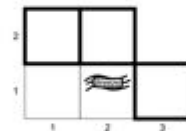
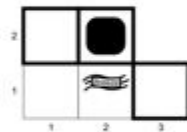
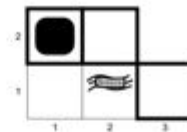
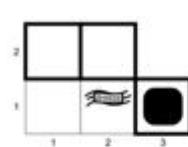
Is it safe to move up to $[1, 2]$?

Let a represent “ $[1, 2]$ is safe”

Does $KB \models a$?

a entails b : in every model where a is true, b is also true

Prove by model checking



Possible worlds

Is it safe to move up to [1 , 2] ?

Let a represent “[1 , 2] is safe”

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Prove by model checking

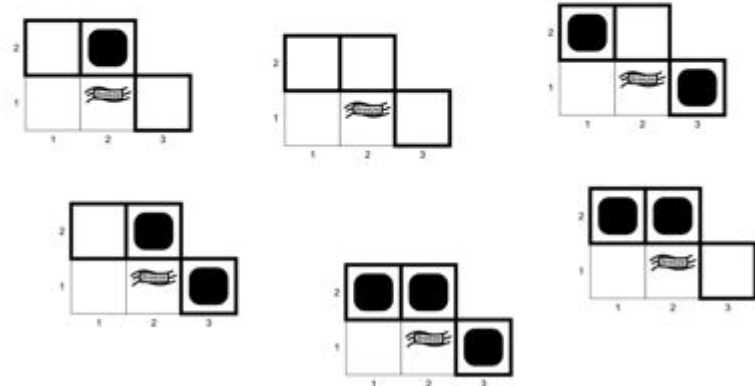
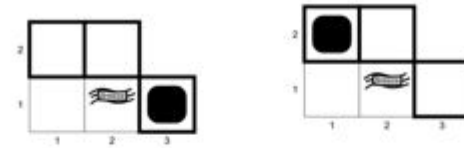
[1,2]	[2,2]	[3,1]	KB	a
			F	T
		pit	T	T
	pit		T	T
	pit	pit	T	T
pit			F	F
pit		pit	F	F
pit	pit		F	F
pit	pit	pit	F	F

Possible worlds

Is $[2, 2]$ safe?

Let a represent “ $[2, 2]$ is safe”

Does $KB \models a$?



Possible worlds

Is $[2, 2]$ safe?

Let a represent “ $[2, 2]$ is safe”

Does $KB \models a$? No

[1,2]	[2,2]	[3,1]	KB	a
			F	T
		pit	T	T
	pit		T	F
	pit	pit	T	F
pit			F	F
pit		pit	F	F
pit	pit		F	F
pit	pit	pit	F	F

Inference in Wumpus World

Enumerate all combinations of seven symbols (128 possibilities)

To see if $KB \models \alpha$, for all cases where KB is true, α should be true

Does $KB \models P_{1,1}$?

Model Checking

Sound

Complete

Complexity $O(2^n)$

$B_{1,1}$	$B_{2,1}$	$P_{1,1}$	$P_{1,2}$	$P_{2,1}$	$P_{2,2}$	$P_{3,1}$	R_1	R_2	R_3	R_4	R_5	KB
false	false	false	false	false	false	false	true	true	true	true	false	false
false	false	false	false	false	false	true	true	true	false	true	false	false
⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮
false	true	false	false	false	false	false	true	true	false	true	true	false
false	true	false	false	false	false	true	true	true	true	true	true	true
false	true	false	false	false	true	false	true	true	true	true	true	true
false	true	false	false	false	true	true	true	true	true	true	true	true
false	true	false	false	true	false	false	true	false	false	true	true	false
⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮
true	true	true	true	true	true	true	false	true	true	false	true	false

Problems with Propositional Logic

Impossible to make general assertions

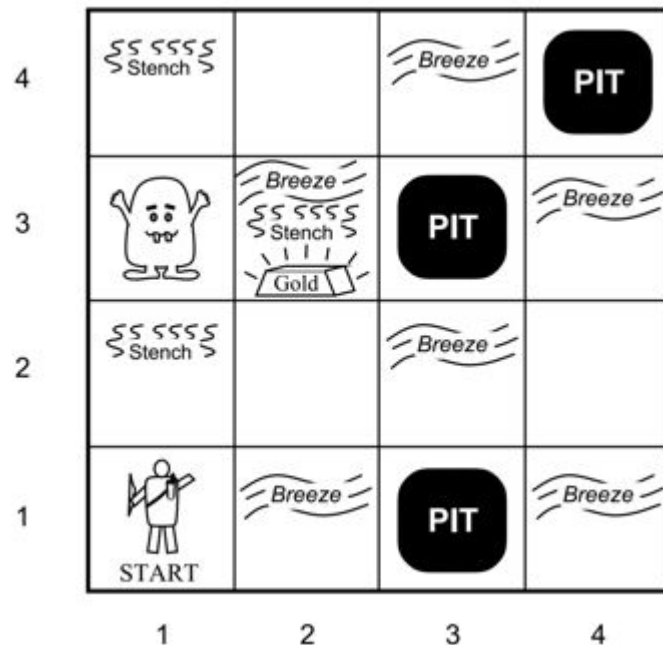
"Pits cause breezes in adjacent squares"

$$B_{2,1} \Leftrightarrow (P_{1,1} \vee P_{2,2} \vee P_{3,1})$$

$$P_{3,1} \Leftrightarrow (B_{2,1} \vee B_{3,2} \vee B_{4,1})$$

Propositional logic has very limited expressive power (unlike natural language)

E.g., cannot say "pits cause breezes in adjacent squares" except by writing one sentence for each square



Logics

Propositional logic

- Is simple

- Illustrates important points:

 - Model, soundness, completeness, satisfiability

- Is restrictive: world is a set of facts

- Lacks expressiveness (world contains FACTS)

First-Order Logic

- More symbols (objects, properties, relations)

- More connectives (quantifiers)

First-order Logic

Whereas propositional logic assumes the world contains **facts**,

First-order logic (like natural language) assumes the world contains

- **Objects**: people, houses, numbers, colors, baseball games, wars, ...
- **Properties**: red, round, prime, ...
- **Relations**: brother of, bigger than, part of, comes between, ...
- **Functions**: width, best friend, one more than, plus, ...

Objects

Objects in the world: people, places

Not just physical things: number, events, time

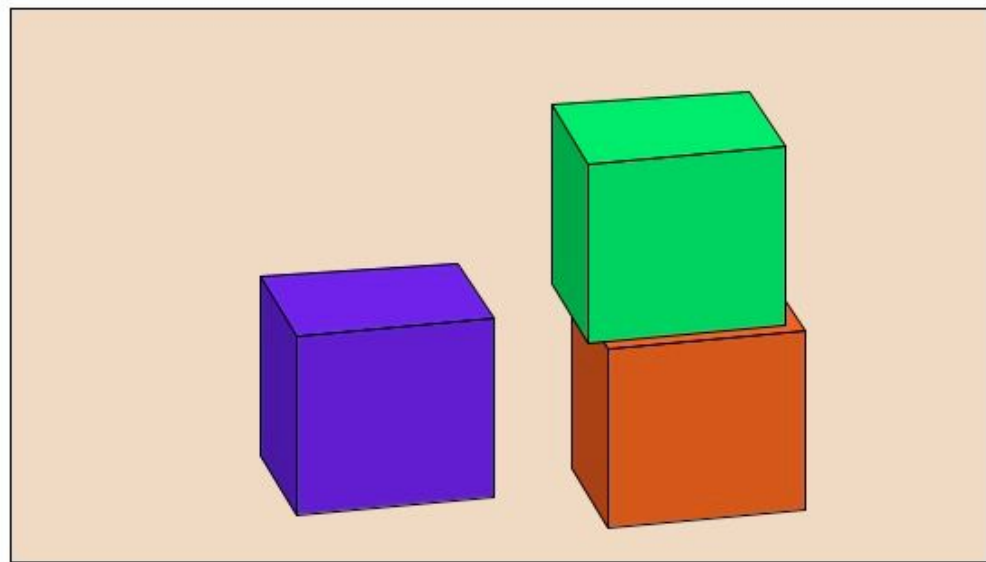
Constants

Table, BlockR, BlockG, BlockB

Variables

x, y, z, a, b, c, etc.

?x, ?y



Properties

BlockB, BlockG, BlockR

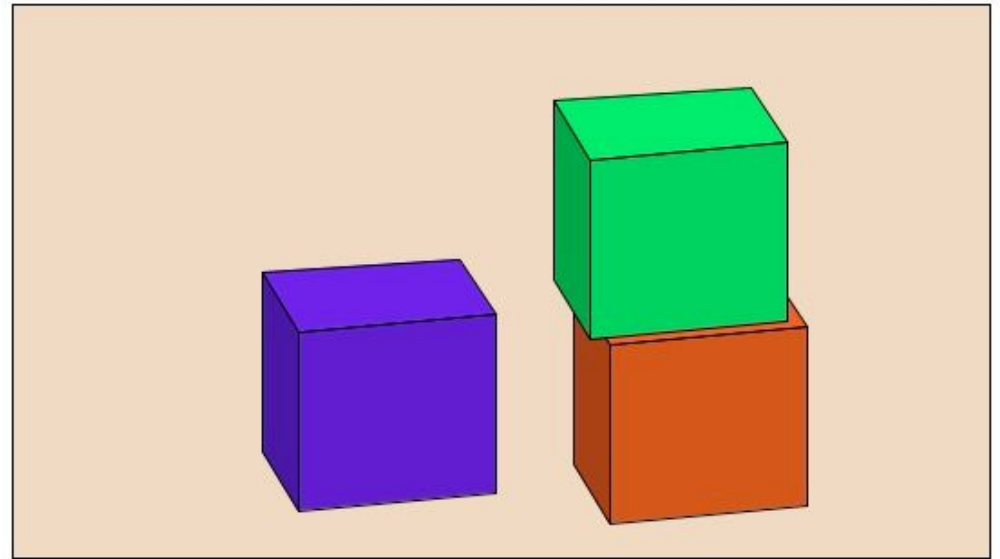
(blue BlockB) blue(BlockB)

(green BlockG)

(red BlockR)

(six_sided Cube)

(clear BlockG)



Relations

(inst BlockB Block)

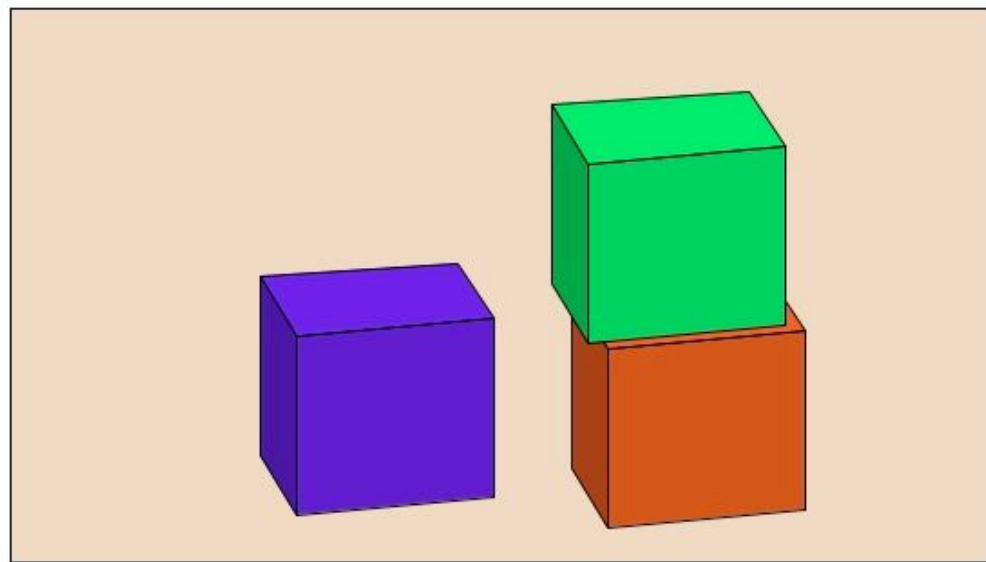
(isa Block PhysicalObject)

(isa PhysicalObject Thing)

(on BlockG BlockR)

(on BlockR Table)

(above BlockG Table)



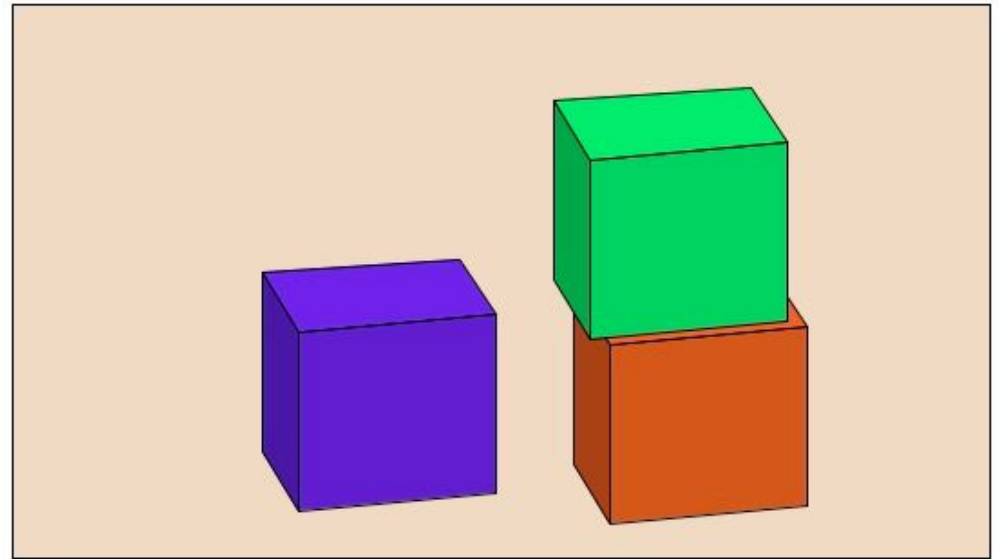
Functions

(mass BlockB) = 200g

(width BlockB) = 40mm

(width BlockB) = (width BlockG)

(price BlockB) = 1_million



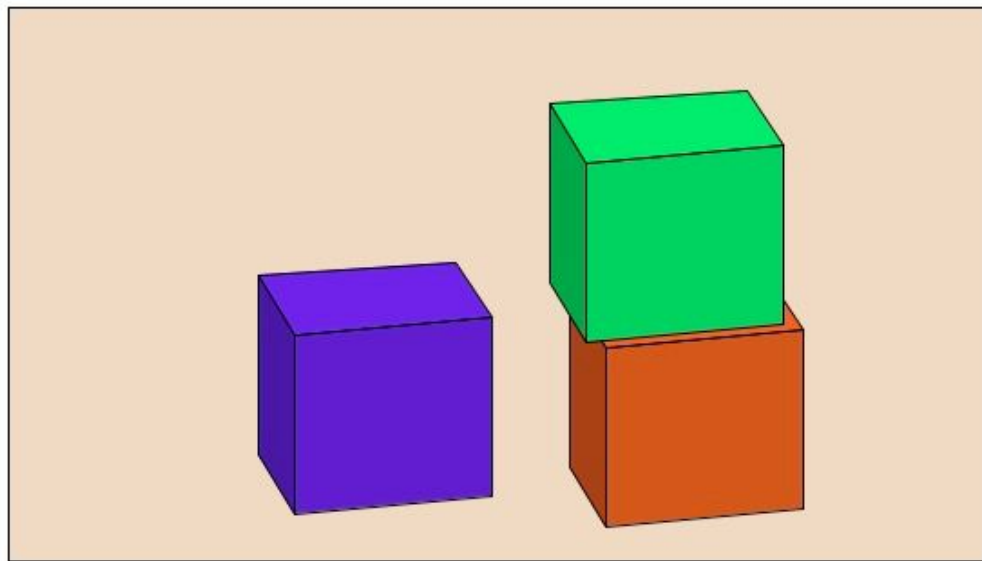
Quantifiers

$\forall x,y (\text{on } x \ y) \Rightarrow (\text{above } x \ y)$

$\forall x,y,z (\text{on } x \ y) \wedge (\text{on } y \ z) \Rightarrow (\text{above } x \ z)$

$\forall x \ \exists y (\text{isa PhysicalObject } x) \Rightarrow$
 $(\text{color } x \ y)$

$\forall x \ \exists y (\text{on } x \ y)$ is not the same as
 $\exists y \ \forall x (\text{on } x \ y)$



Assertions and Queries

ASSERT(KB, (inst BlockB Block))

ASSERT(KB, (inst BlockG Block))

ASSERT(KB, (inst BlockR Block))

ASSERT(KB, $\forall x,y$ (on x y \Rightarrow (under y x)))

ASK(KB, (inst BlockB Block)) : returns True

ASK(KB, $\exists x$ (inst x Block)) : returns {x/BlockB}, {x/BlockG}, {x/BlockR}

FOL for Wumpus World

Objects

Wumpus, Gold, Glitter, Breeze, Stench, 1, 2, 3, 4

Properties

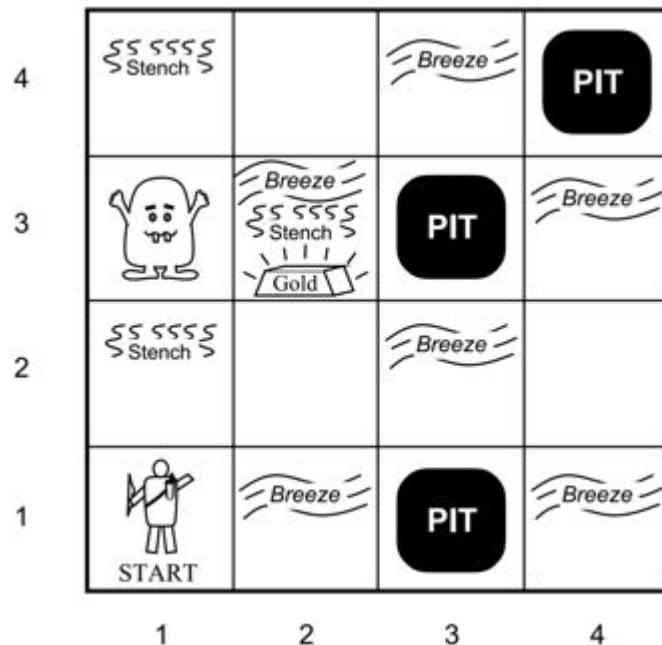
(glitters Gold) (smells Wumpus) (hasPit x)

Relations

(cell 1 1) (adjacent (cell 1 1) (cell 1 2))

Functions

$\forall s \text{ (breezy } s) \Rightarrow \exists r \text{ (adjacent } r s) \wedge \text{ (hasPit } r)$



Next time

Friday

More work in logic

Truth tables

Resolution

Knowledge representation with FOL

Monday

Inference