### Al Session 3

Jan 29, 2021

# Agenda

- Recap
- Continuing a bit on graph search algorithms etc.
- Using data and knowledge, reasoning

## Recap

- Searching solutions to problems
  - Various strategies in
    - uninformed case
    - informed case (heuristics)
  - The environment, the problem, the time/space requirements, and the requirements for a solution affect the selection of the algorithm to be used
  - Local optimization methods can lead to good (enough?)
     results with modest space requirements

#### Situation

- Project topic developments or something else?
- Exercise situation (discussing the tasks)

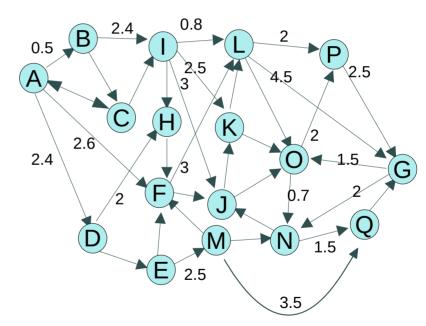
# Uniform Cost Search (Dijkstra's)

Evaluation of state n by

$$f(n) = g(n)$$
Minimal path cost known so far

Always expand a node minimizing f(n).

Find the shortest route from A to G.
The step costs / edge weights are indicated in the figure. A step cost without an explicit number indication defaults to one.



#### Heuristic-based Best-first Search

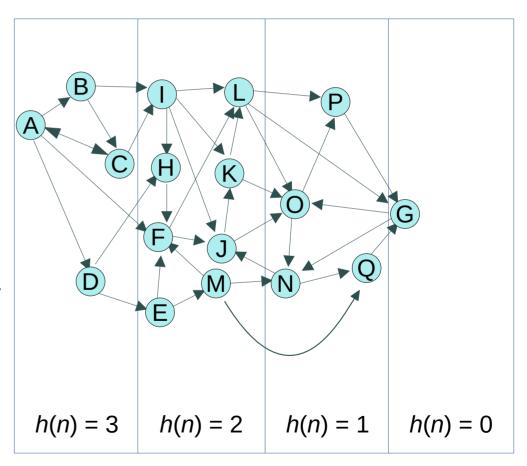
Evaluation of state n by

$$f(n) = h(n)$$

Heuristic function value

Always expand a node minimizing f(n).

Find the shortest route from A to G.
The step costs / edge weights are indicated in the figure. A step cost without an explicit number indication defaults to one.



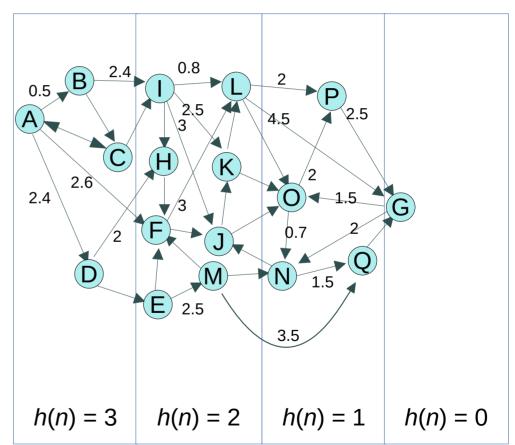


Evaluation of state n by

$$f(n) = g(n) + h(n)$$
Minimal path cost known so far + Heuristic function value

Always expand a node minimizing f(n).

Find the shortest route from A to G.
The step costs / edge weights are indicated in the figure. A step cost without an explicit number indication defaults to one.

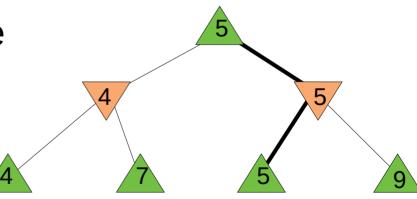


## Adversarial Search (Simple Case)

- Minimax algorithm
- alpha—beta pruning

 Typically, cannot evaluate the real utilities (leaf nodes)

- heuristics



### Data and Knowledge

- Often, our agents have lots of data available. In order to take advantage of it, it can be refined to knowledge.
- Logical agents may use knowledge in knowledge base, described as sentences in some knowledge representation language, to draw conclusions and derive more knowledge.
  - Based on the knowledge, an agent may be able to derive the solution to the problem it should solve
  - Inferring hidden features of states and options may help in partially observable environments

possibly initialized with some general knowledge

Add perception knowledge, query actions to perform

Get action decisions

Act

Get perception

data

Knowledge base,

# Reasoning: Propositional Logic

- · Proposition symbols, logical connectives, parentheses
- In order to determine, whether the knowledge entails some sentence, we can check models taking advantage of logical equivalences and tautologies.
- Are there models evaluating to true (satisfiability problem)?
- Checking entailment by enumerating all the possible models is not viable with large propositional vocabularies
- Reasoning patterns like modus ponens or andelimination can be used (no need to evaluate all the models)
- So-called resolution inference rule combined with a complete search algorithm gives us a complete inference algorithm (requires conjunctive normal form)
- With Horn clauses, forward and backward chaining can be used
- Local search can be useful, when trying to prove satisfiability

Α	В	¬А	A ∧ B	A V B	$A \Rightarrow B$	A ⇔ B
false	false	true	false	false	true	true
false	true	true	false	true	true	false
true	false	false	false	true	false	false
true	true	false	true	true	true	true

 $\alpha$  entails  $\beta$  iff  $(\alpha \wedge \neg \beta)$  is unsatisfiable!

We know:

 $R \Rightarrow W$ 

W

 $D \vee W$ 

Can we, based on this, deduce R?

## Reasoning: First-order Logic

- More expressive than propositional logic
  - world has objects with relations (that hold or do not hold), not just "facts"

Cat(Garfield)

Normal(Garfield)

 $\forall$  x [Cat(x)  $\land$  Normal(x)  $\Rightarrow$   $\exists$  y Tail(y, x)]

### Reasoning: First-order Logic

- Quantifiers can be got rid of by universal instantiation (substitutions by ground terms) end existential instantiation (skolemization)
  - We can apply propositional logic inference (slow)
- Unification (substitutions to variables) can boost performance
  - Generalized modus ponens, forward and backward chaining
- If knowledge base in conjunctive normal form, the generalized resolution rule can be used to achieve a complete proof system

# Logic Programming

- A formal logic-based programming paradigm
- A program: facts and rules over some domain
  - can be queried
- Prolog
  - (Still) the most popular logic programming language
  - Based on (headless and headed) Horn clauses
  - Used in, e.g., IBM Watson
  - https://en.wikipedia.org/wiki/Prolog
  - http://www.gprolog.org/
  - https://www.swi-prolog.org/ (try online: https://swish.swi-prolog.org/)

cat(nermal). likes(garfield, odie).

?- likes(X, odie).

#### **Exercises**

It is time to embark upon the challenges of this week (check Moodle)!