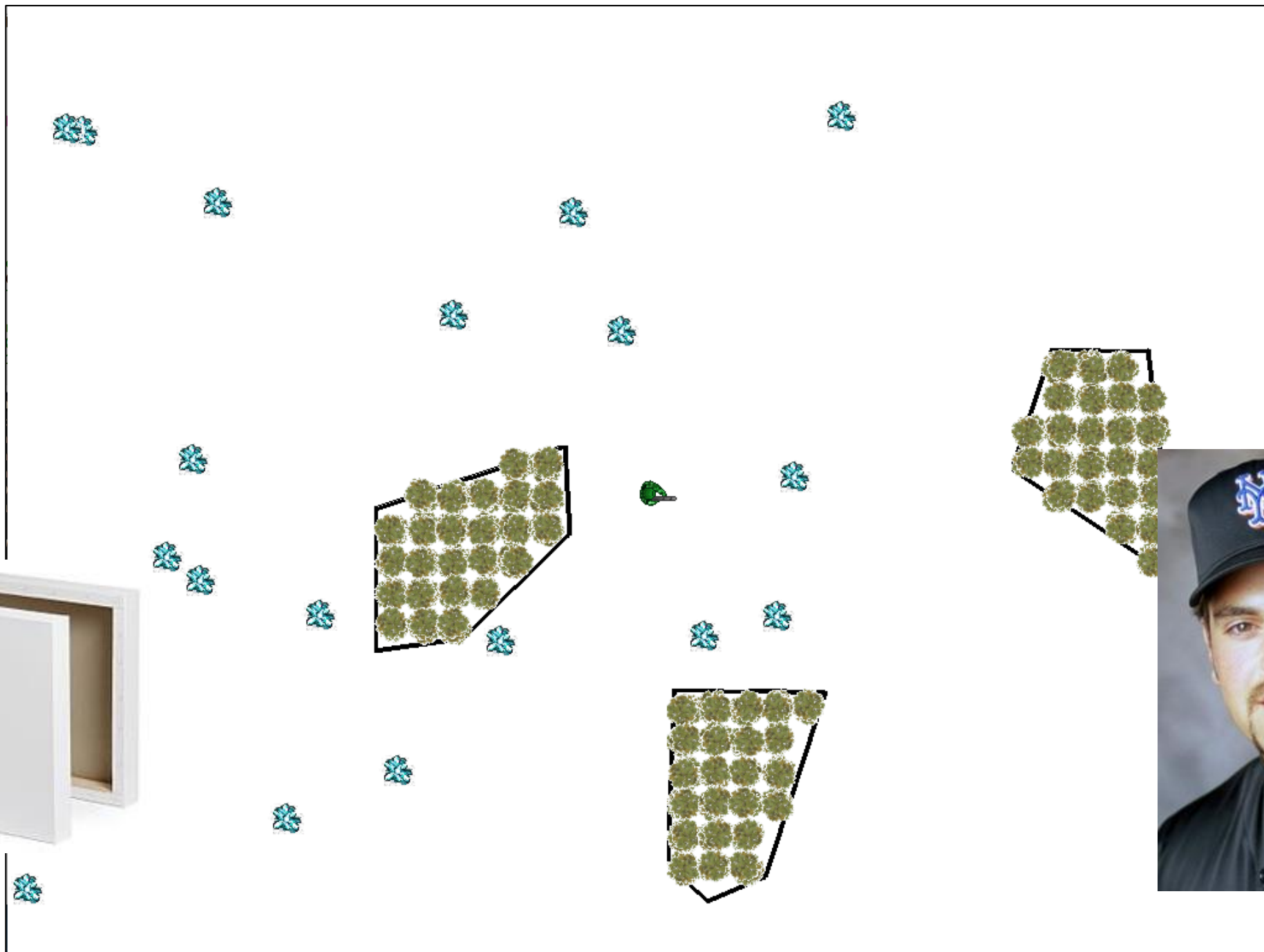


“the question of whether computers can think is like the question of whether submarines can swim” -- Dijkstra

Game AI: The set of algorithms, representations, tools, and tricks that support the creation and management of real-time digital experiences



**PREVIOUSLY ON...**

What is AI?

# Goals of AI

Systems that <b>think</b> like humans	Systems that <b>think</b> rationally
Systems that <b>act</b> like humans	Systems that <b>act</b> rationally

# Artificial Intelligence

- Getting a computer to do something that a “reasonable person” would think requires intelligence
  - Complexity fallacy
    - Simple can be good, Complex can be bad.
  - Illusion of complexity & Illusion of intelligence: Behaviorism
    - M&F: “We are not interested in the nature of reality or mind; we want characters that look right. In most cases, this means starting from human behaviors and trying to work out the easiest way to implement them in software.”
  
- Automation

# Why AI in games?

Automation—because you need other people to do things, but don't always have those people

- Opponents
- Companions
- NPCs (shopkeepers, farmers, villains)
- Dungeon master?
- Plot writer?
- Game designer?

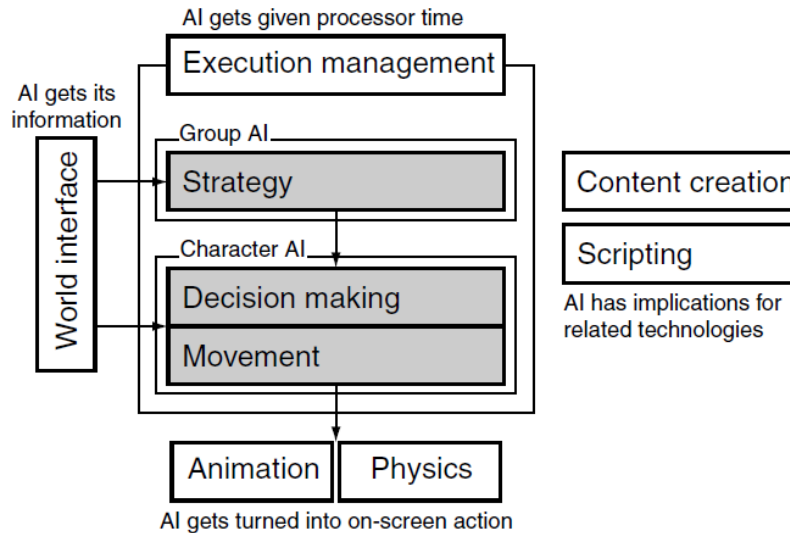
# What this class is about

- **AI for games**
  - Ways in which AI can—and is used to—enhance game play experiences
  - **Game dev industry: Set of algorithms, representations, tools, tricks, and techniques that support the creation and management of real-time digital experiences**
  - Goals include:
    - enhancing the player's engagement, enjoyment, and experience
      - End behavior is the target
      - Do better than random
    - doing things the player or designer cannot do or don't want to do
      - replace real people when they are unwilling or unavailable to play
      - aid for designers and developers
    - making the entities, opponents, agents, companions, etc. in games appear intelligent
    - believable characters / looking convincing



# Major ways GameAI is used...

- In game
  - Movement
  - Decision making
  - Strategy
  - Tailoring/adapting to player individual differences
  - Drama Management
- Out of game
  - PCG
  - Quality control / testing



M&F Fig 1.1

# Why AI is important for games

- Why is it essential to the modeled world?
  - NPC's of all types: opponents, helpers, extras, ...
- How can it hurt?
  - Unrealistic characters → reduced immersion
  - Stupid, lame behaviors → reduced fun
  - Superhuman behaviors → reduced fun
- Until recently, given short shrift by developers. Why?
  - Graphics ate almost all the resources
  - Can't start developing the AI until the modeled world was ready to run
    - AI development always late in development cycle
- Situation rapidly changing / changed. How?
  - AI now viewed as helpful in selling the product
  - Still one of the key constraints on game design

# What this class is about

- “Game AI is (a fundamental part of) game design”
  - How a game design can be brought into existence through the application of algorithms that are often thought of as intelligent
  - Pac-man?
- Not a substitute for an Intro to AI course
- Not going to teach good game design

# At its core

- What is it for?
  - Suspension of disbelief (aka “Magic Circle”)
    - making the entities/opponents/agents/companions/etc. in games appear intelligent
  - Easing the cost of development
  - Tailoring/adapting to player individual differences
  - (Data-driven insights)

# What this class is NOT about

- **AI in games**
  - John Laird and Michael van Lent (2000): Games are perfect test-beds for “human level” AI
  - AI should play games as if human
    - Vision
    - Decision making in real-time
    - Handling uncertainty
    - Learning
    - Opponent modeling
  - Demonstrated with an AI agent that played Quake
- [https://en.wikipedia.org/wiki/Artificial\\_general\\_intelligence](https://en.wikipedia.org/wiki/Artificial_general_intelligence)
  - <https://openai.com/five/>

# How/Why distinct from “academic AI”

- Supporting the player experience
- Good game AI == matching right behaviors to right algorithms
- Product is the target, not clever coding – ends justify means. FUN
- Illusion of intelligence
- “Magic Circle” (Rules of play: game design fundamentals)
- Elegance in simplicity & the complexity fallacy
- Quality control & resource limits
- Fun vs smart: goal is not always to beat the player
- Optimal/rational is rarely the right thing to do

# Common (game) “AI” Tricks?

- Move before firing – no cheap shots
- Be visible
- Have horrible aim (being Rambo is fun)
- Miss the first time
- Warn the player
- Attack “kung fu” style (Fist of Fury; BL vs School)
- Tell the player what you are doing (especially companions)
- React to own mistakes
- Pull back at the last minute
- Intentional vulnerabilities or predictable patterns

# Common Heuristics

- Most Constrained / Most Difficult
  - Given current state make choice / select action least available.
  - Aka: Do the most difficult thing first
    - E.g. Attacking enemy with special weapon
    - E.g. Assigning large characters to squads first
- Try the most promising thing first
  - Give each option a rough score and attempt in decreasing order



# Intelligent vs. random

The screenshot shows a turn-based battle in the game *Puzzle Quest: Challenge of the Warlords*. The title bar at the top reads "PUZZLE QUEST CHALLENGE OF THE WARLORDS". The battle is taking place on a 10x10 grid. The player's character, Enbria (a Knight, Level 3), is on the left, and the enemy, Thiel (a Thief, Level 3), is on the right. The grid contains various puzzle pieces: blue circles with a cross, green circles with a cross, red circles with a cross, yellow circles with a cross, purple stars, gold coins, and skulls. A large white and blue energy effect is centered on the grid, with numbers like +1, +8, and +1 appearing. The player's status bar on the left shows 27 of 62 health, 232 gold, and 141 mana. The enemy's status bar on the right shows 8 of 33 health, 12 gold, and 16 mana. The player's abilities are Thrust (6), Divine Right (6), and Challenge (6). The enemy's abilities are Sneak Attack (5) and Steal (6). The turn number is 21.

**PUZZLE QUEST**  
CHALLENGE OF THE WARLORDS

**The Missive**

Enbria  
Knight  
Level: 3  
232 141  
Broken Shield

Thiel  
Thief  
Level: 3  
12 16  
Sneak Attack  
Steal

Turn: 21

# Graphs, Search, & Path Planning

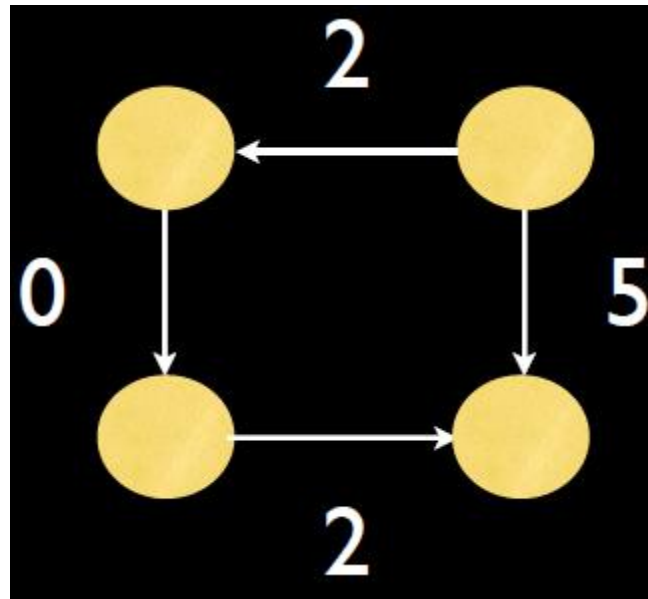
2019-08-21

# Graphs

- What is a graph?
- What defines a graph?
- How can we represent them?
- How does representation effect search?
  
- **Applications to GAI?**
  
- See Buckland CH 5 for a refresher

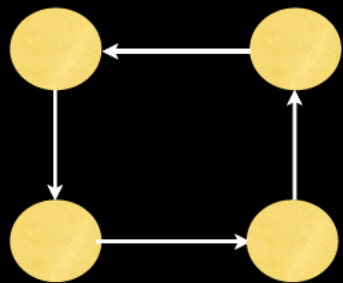
# Graphs (2)

- $G = \{N, E\}$ , N: Nodes, E: Edges (with cost)





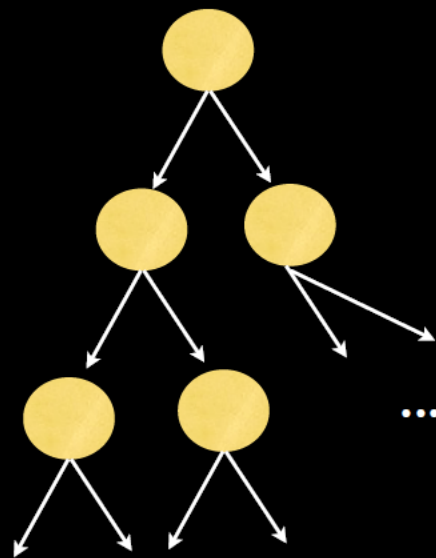
directed acyclic graph



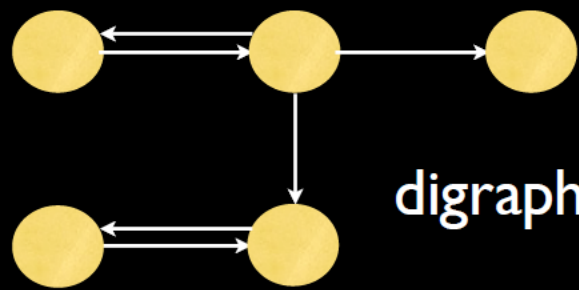
directed cyclic graph



undirected graph

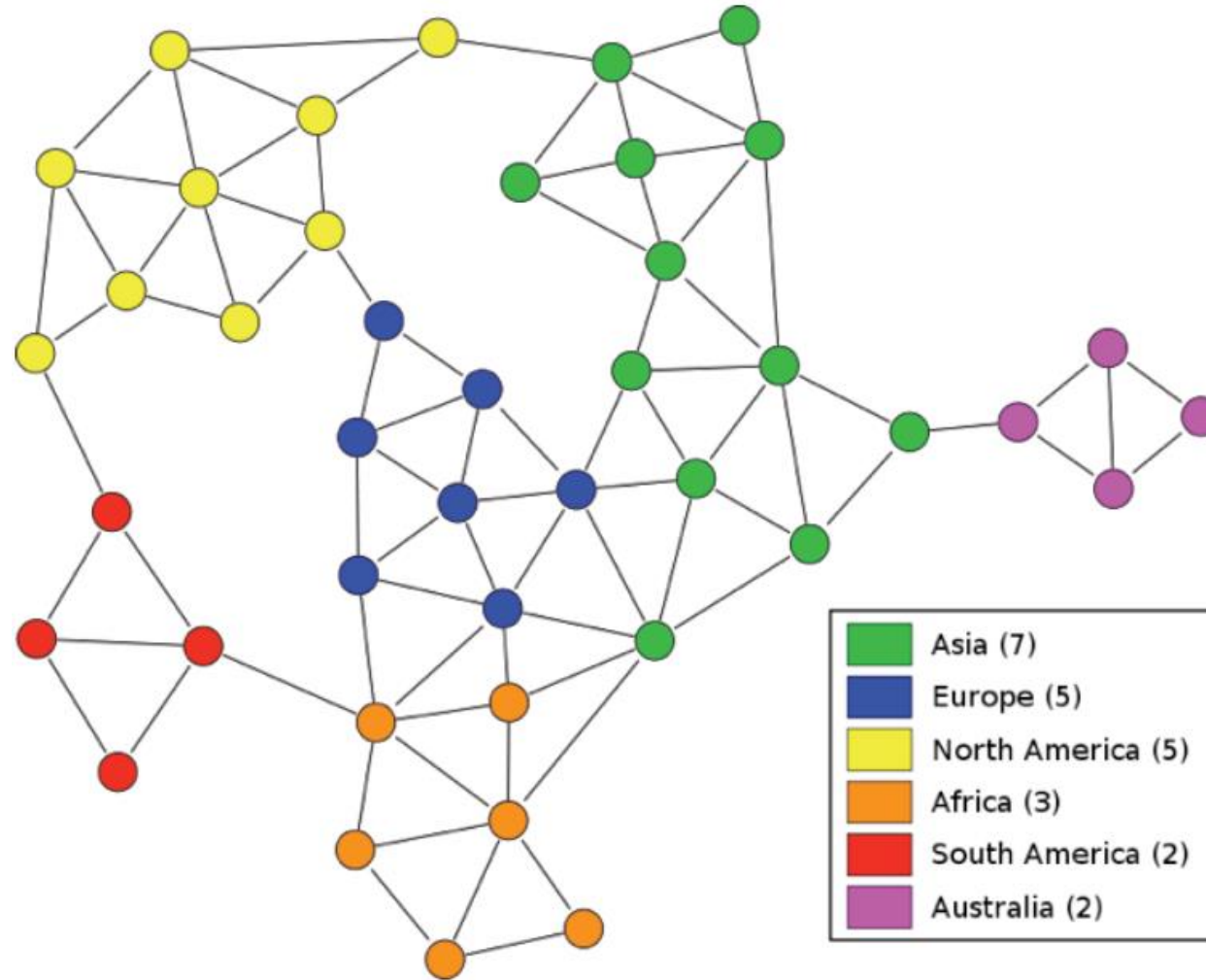


binary tree



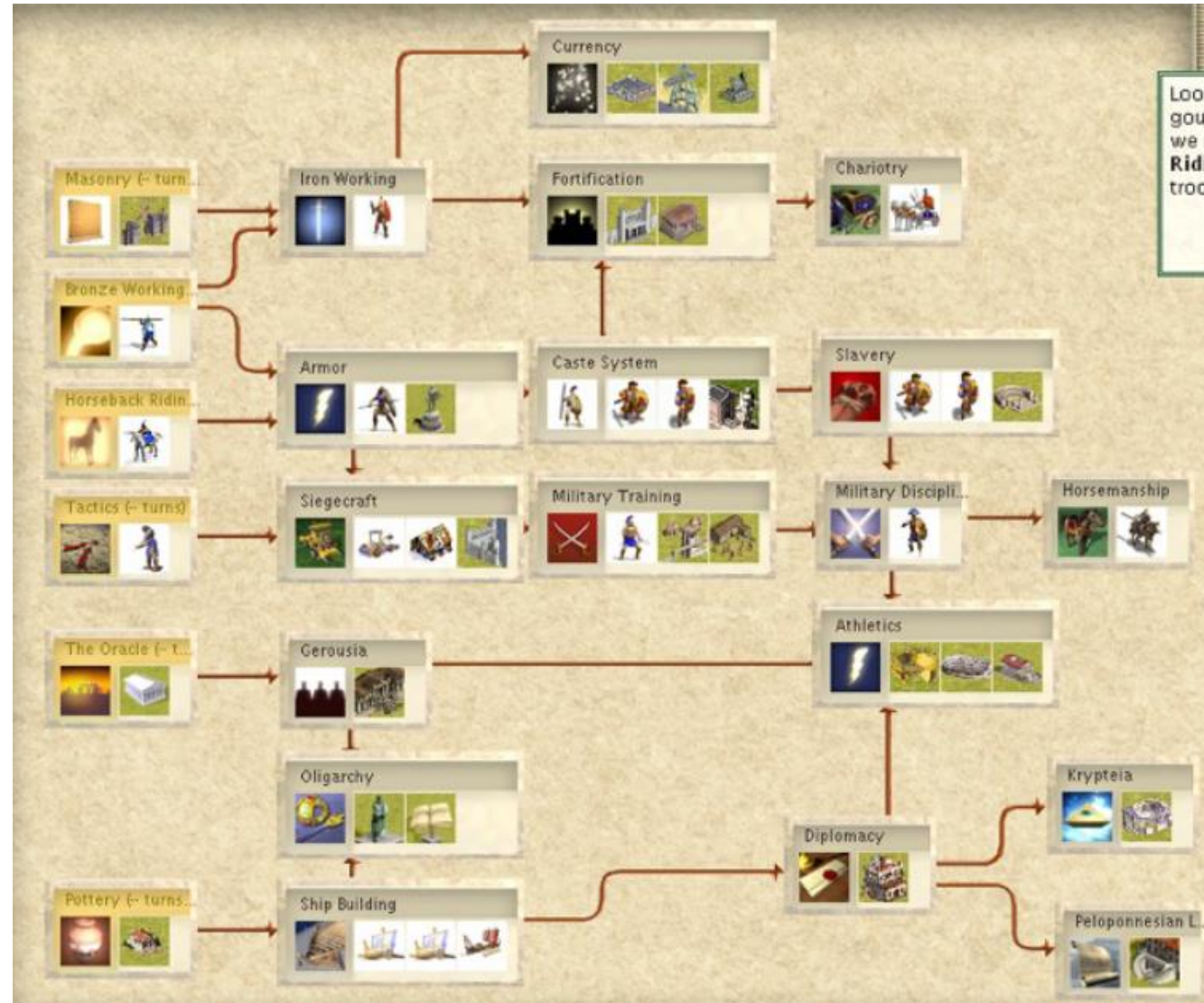
digraph

# Risk





# RTS Dependency Tree



# Graphs: Killer App in GAI

- Navigation / Pathfinding
- Navgraph: abstraction of all locations and their connections
- Cost / weight can represent terrain features (water, mud, hill), stealth (sound to traverse), etc
- What to do when ...
  - Map features move
  - Map is continuous, or 100K+ nodes?
  - 3D spaces?



# Graph Search

- Uninformed (all nodes are same)
  - DFS (stack – lifo), BFS (queue – fifo)
  - Iterative-deepening (Depth-limited)
- Informed (pick order of node expansion)
  - Dijkstra – guarantee shortest path ( $E \log_2 N$ )
  - A\* (IDA\*).... Dijkstra + heuristic
  - D\*
- Hierarchical can help



What problem are all of these approaches solving?

or

What differentiates these approaches?

# Sidebar: Iterative Deepening

- mid 1970s
- Idea: perform depth-limited DFS repeatedly, with an increasing depth limit, until a solution is found.
- Each repetition of depth-limited DFS needlessly duplicates all prior work?
  - Duplication is not significant because a branching factor  $b > 1$  implies that the number of nodes at depth  $k$  exactly is much greater than the total number of nodes at all depths  $k-1$  and less.
- That is: most nodes are in the bottom level.

# Number of nodes

- Full, complete, balanced binary tree, height  $h$ 
  - Total number of nodes  $N = 2^{\{h+1\}} - 1$ 
    - Leaf nodes at height 0:  $2^0 = 1$
    - Leaf nodes at height 1:  $2^1 = 2$
    - Leaf nodes at height 2:  $2^2 = 4$
    - Leaf nodes at height 3:  $2^3 = 8$
    - $N = 1 + 2 + 2^2 + 2^3 + \dots + 2^h$   
 $= (2^{\{h+1\}} - 1) / (2 - 1) = 2^{\{h+1\}} - 1$
  - Number of leaves  $L = 2^h$
  - Height 42,  $N = 8,796,093,022,207$   
 $L = 4,398,046,511,104$

# “Informed” Search: Heuristics

- [dictionary] *“A rule of thumb, simplification, or educated guess that reduces or limits the search for solutions in domains that are difficult and poorly understood.”*
- $h(n)$  = estimated cost of cheapest path from  $n$  to goal (with goal == 0)

# Path finding problem solved, right?

- Compilation
  - <http://www.youtube.com/watch?v=lw9G-8gL5o0>
- Sim City (1, 2 ... 5)
  - [https://www.youtube.com/watch?v=zHdyz\\_x\\_ecbQ](https://www.youtube.com/watch?v=zHdyz_x_ecbQ)
- Half-Life 2
  - <http://www.youtube.com/watch?v=WzYEEZVI46Uw>
- Fable III
- DOTA (Defense of the ancients) 1+2
  - <https://www.youtube.com/watch?v=p585DHI0qh4>
- WoW (World of Warcraft)
- Minecraft Bedrock Edition
  - <https://www.youtube.com/watch?v=qR5M5v0XDM0>
- Fallout 4
  - <https://www.youtube.com/watch?v=M7TicvLXrQo>
- DARPA robotics challenge:
  - <https://www.youtube.com/watch?v=g0TaYhjpOfo>

# Path finding models

1. Tile-based graph – “grid navigation”
2. Path Networks / Points of Visibility NavGraph
3. Expanded Geometry
4. NavMesh

# Path finding models

## 1. **Tile-based graph – “grid navigation”**

- Simplest topography
- Assume static obstacles
- Imaginary lattice of cells superimposed over an environment such that an agent can be in one cell at a time.
- Moving in a grid is relatively straightforward: from any cell, an agent can traverse to any of its four (or eight) neighboring cells

## 2. Path Networks / Points of Visibility NavGraph

## 3. Expanded Geometry

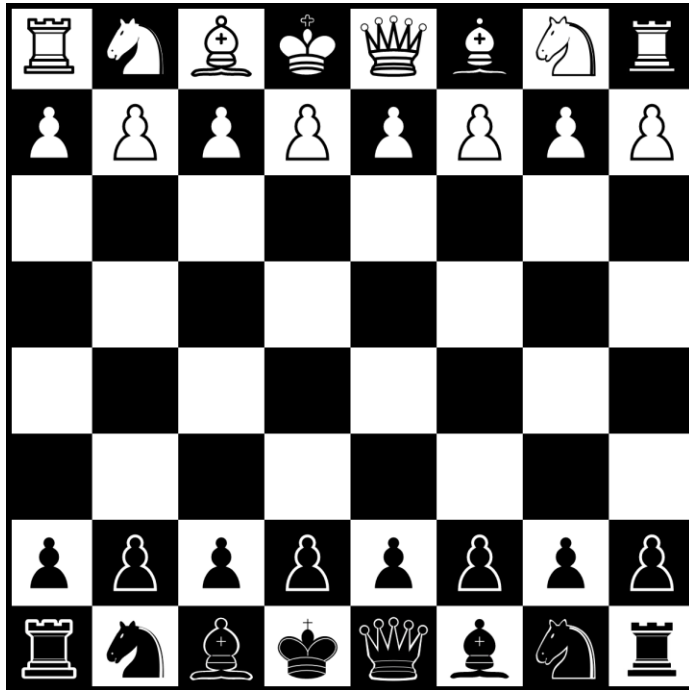
## 4. NavMesh



# Model 1: Grid Navigation

- 2D tile representation mapped to floor/level
  - Squares, hex; 8 or 6 neighbors / connectivity
- Mainly RTS games
- One entity/unit per cell
- Each cell can be assigned terrain type
- Bit mask for non-traversable areas
- Navigation: A\* (or perhaps greedy), Dijkstra, D\*, IDA\*
  - <http://theory.stanford.edu/~amitp/GameProgramming/AStarComparison.html>

# Grids



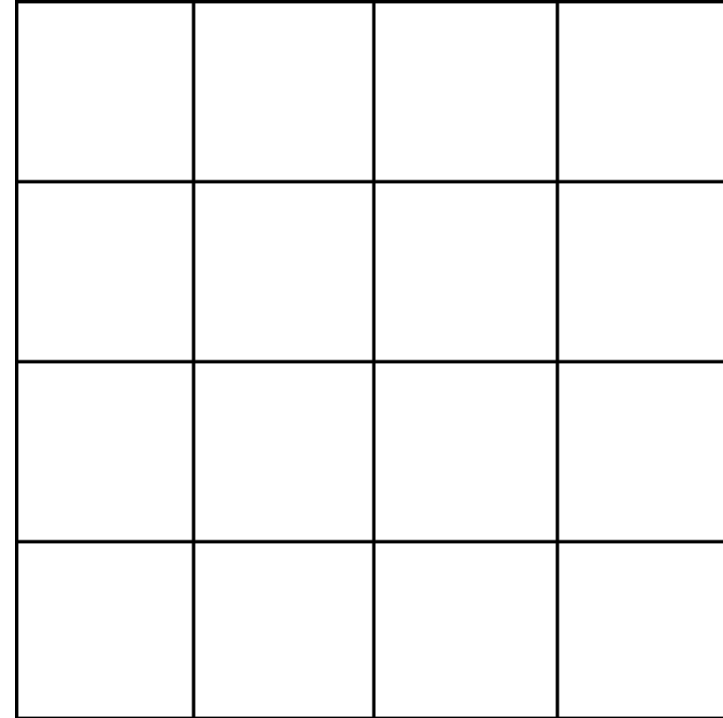


# Also Grids



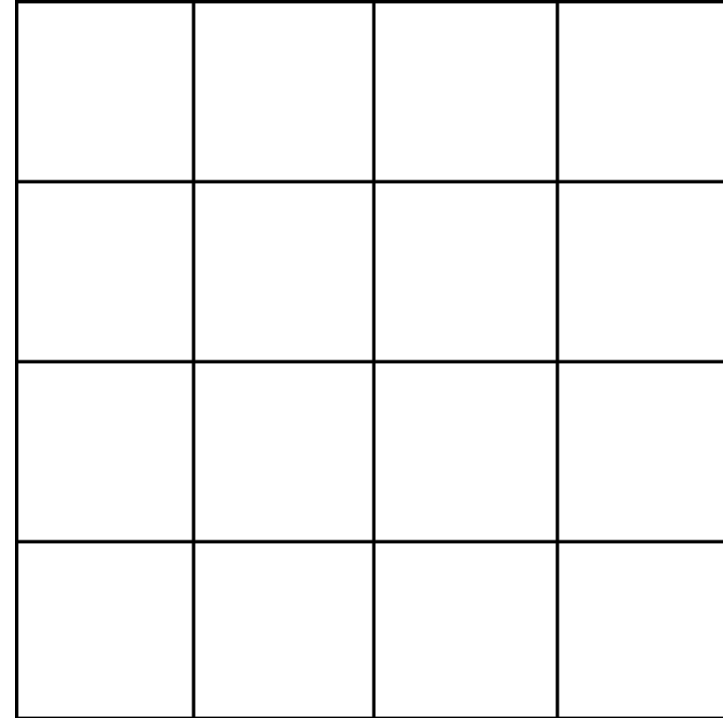
# Grids

- 2D tile representation mapped to floor/level
  - Squares/hex cells
  - 8 or 4 neighbors / connectivity
  - Simplify the space
- At most one entity/unit per cell

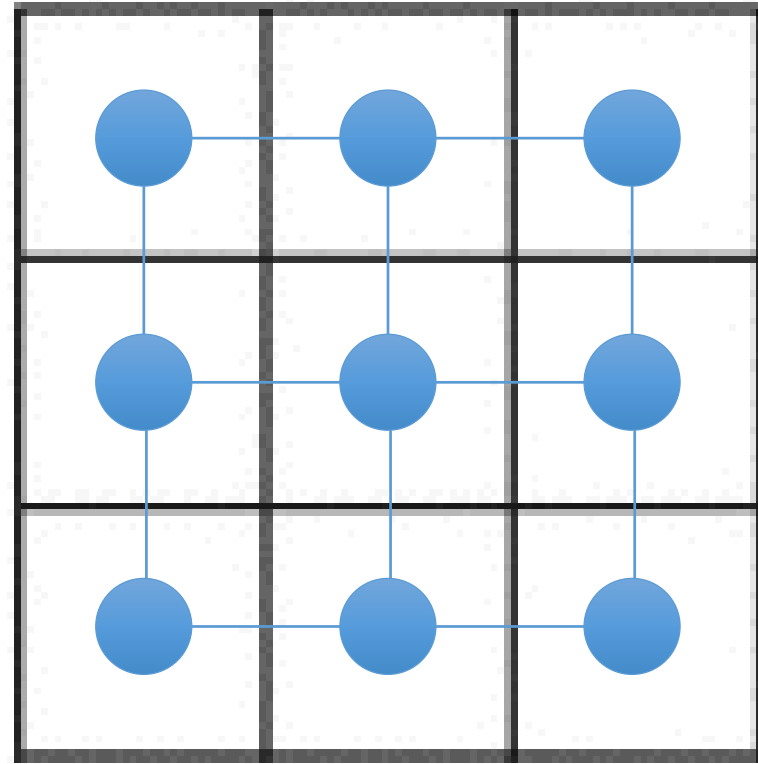
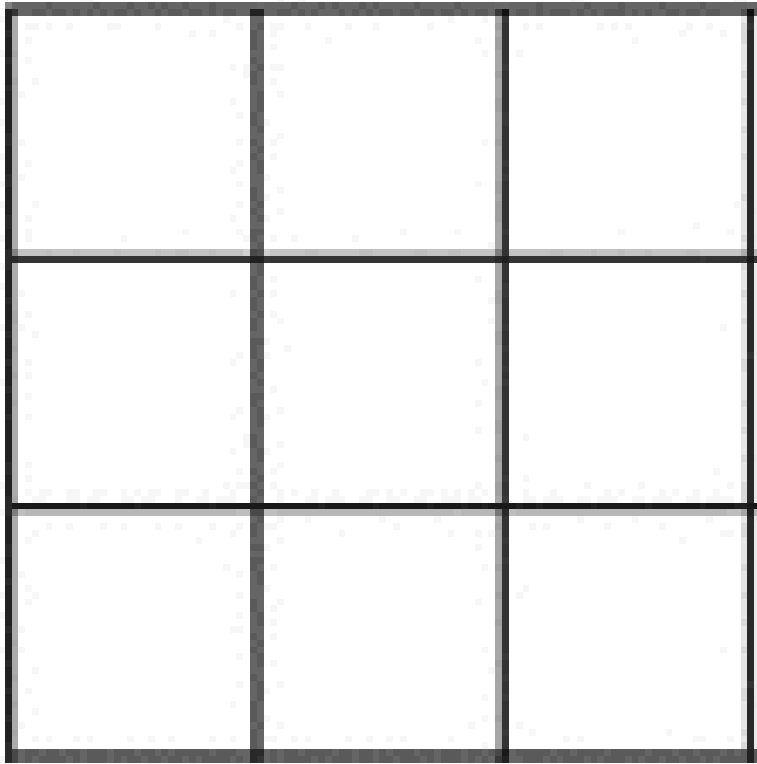


# Movement through Grids

- Continuous or Discrete?
- If continuous, we need a path of cells from a current cell to a goal cell
  - Navigate from one cell center to the next

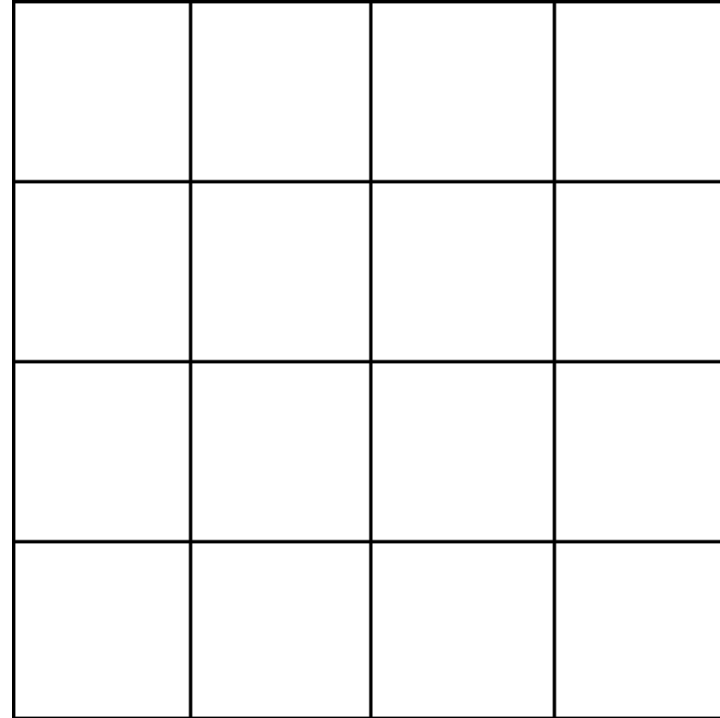


# Grid as Graph



# Greedy Path Planning

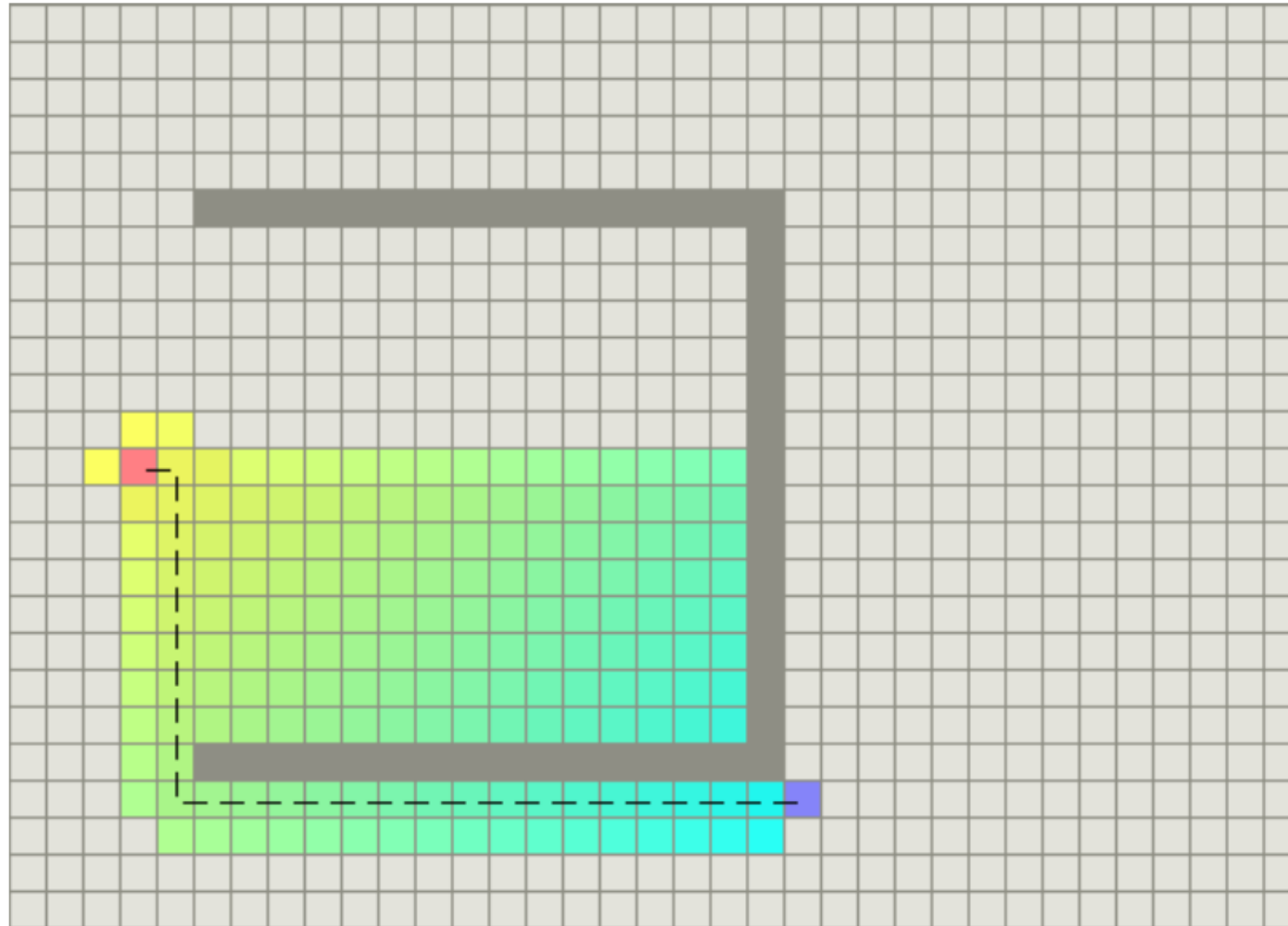
- Given current cell/node, pick the next cell that is closest to the goal cell according to some heuristic
- Once goal cell is reached, backtrack to the initial cell







Grid path planning can be very slow



# Path Planner

- Initial state (cell), Goal state (cell)
- Each cell is a state agent can occupy
- Sort successors, try one at a time (backtrack)
- Heuristic: Manhattan or straight-line distance
- Each successor stores who generated it

# Question

What are pros and cons of a grid representation of space in terms of character movement?

# Grid navigation: pros

- Discrete space is simple
- Can be generated algorithmically at runtime (Hw1)
- Good for large number of units
- A\*/greedy search works really well on grids (uniform action cost, not many tricky spots)

# Grid navigation: cons

- Discretization “wastes” space
- Agent movement is jagged/awkward/blocky, though can be smoothed
- Some genres need continuous spaces
- Partial-blocking hurts validity
- Search must visit a lot of nodes (cells)
- Search spaces can quickly become huge
  - E.g. 100x10 map == 100k nodes and ~78k edges

# New Problems

- Generation
- Validity
- Quantization
  - Converting an in-game position (for yourself or an object) into a graph node
- Localization
  - Convert nodes back into game world locations (for interaction and movement)
- Awkward agent movement
- Long search times