



# **AI in Computer Games**

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why, where and how

*Olle Gällmo*

# Who am I?

- Lecturer at Uppsala University,  
Dept. of information technology
- AI, machine learning and natural  
computation
- Gamer since 1980



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# AI in Computer Games

- Goals
- History
- Common issues and methods
- Issues in various game categories

# Goals

- Games are entertainment!
- Important that things behave naturally
  - ✱ not necessarily perfect
  - ✱ "things" are not always creatures
- Follow (the game's) natural laws
  - ✱ and avoid cheating
- Characters should be aware



# Game A(I?)

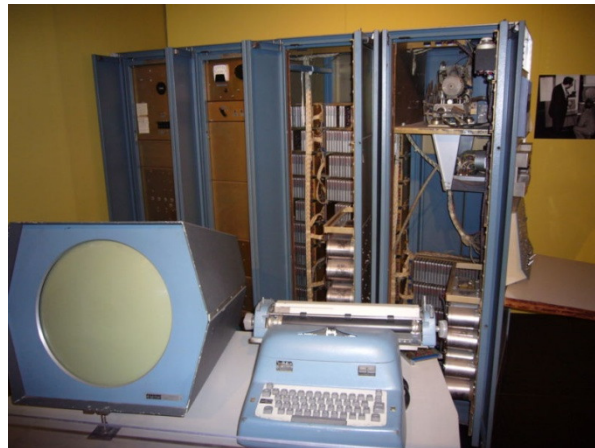
- Academic AI is usually concerned with making rational decisions
  - ✱ Searching for the optimal solution
- Game AI is more often about
  - ✱ Artificial Life
  - ✱ Believable behaviour
    - including stupidity!
    - realistic physics
  - ✱ Game balancing
    - challenging, but not unbeatable opponents

# History -1980

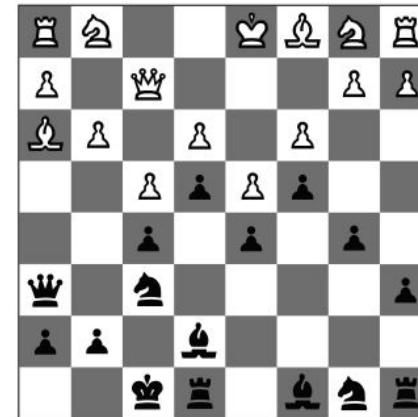
## ■ 1960's

### ✱ First computer games

- SpaceWar! (PDP-1, for two human players) (1962)
- Board games (e.g. chess) against the machine



PDP-1



Chess

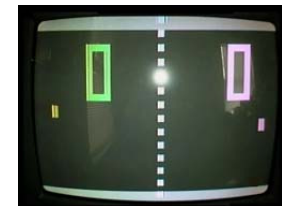
# History -1980

## ■ 1960's

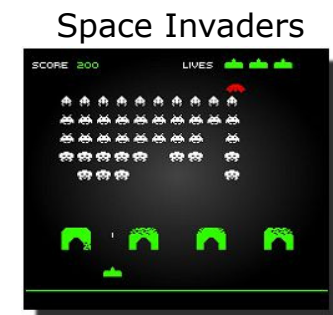
- ✱ First computer games
  - SpaceWar! (PDP-1, for two human players) (1962)
  - Board games (e.g. chess) against the machine

## ■ 1970's

- ✱ Pong (early arcade game) (1972)
- ✱ Computer controlled opponents
- ✱ Space Invaders (1978)
- ✱ Predefined patterns, no awareness
- ✱ "AI" takes 1-2% of CPU



Pong



# 1980's

- Pac-Man (1980)
  - ★ aware opponents with personality
- A computer beats a master chess player (1983)
- First fighting games
- Adventure games
  - ★ Dungeon, Zork, ...
- First MORPG (MUD)

Pac Man



The way of the exploding fist (1985)



# 1990's

- FPS and RTS games
- Games about/with evolution and learning (Creatures, and (in 2001) Black&White)
- Deep Blue beats Kasparov (1997)
- Graphic cards take the load off the CPU
- AI takes 10-35% of CPU



Doom



Dune 2



Black & White

# 2000-

- Focus shift from single- to multiplayer
- Focus shift from graphics to AI
  - ✱ and physics ...
- Large part of the code is AI code
  - ✱ often made from scratch for each game
- Less cheating
- Characters are more aware
  - ✱ thanks to better physics engines
- Characters collaborate better

# 2000-

# BIG industry

- In Sweden
  - ✱ +39%/year on average (2006-2014)
  - ✱ 9 bilj SEK turnover in 2014
  - ✱ Most of the (213) companies make +
- Internationally
  - ✱ 81 bilj USD revenue in 2014
- Tough competition (10 most sold games cover 80% of the market)
- Typical game project: 2 years, 70 people, 20 milj USD (+ marketing)

# Typical Game AI topics

- **Strategical/tactical decisions**
    - ✱ Against or with you
    - ✱ Search for best counter action
    - ✱ adaptivity
  - **Director level AI**
- 
- **Simulation**
    - ✱ of natural behaviour
    - ✱ for animation (e.g. bird flocks)
  - **Shortest path problems**

# Why is Game AI hard?

## (what makes it interesting to CompSci)

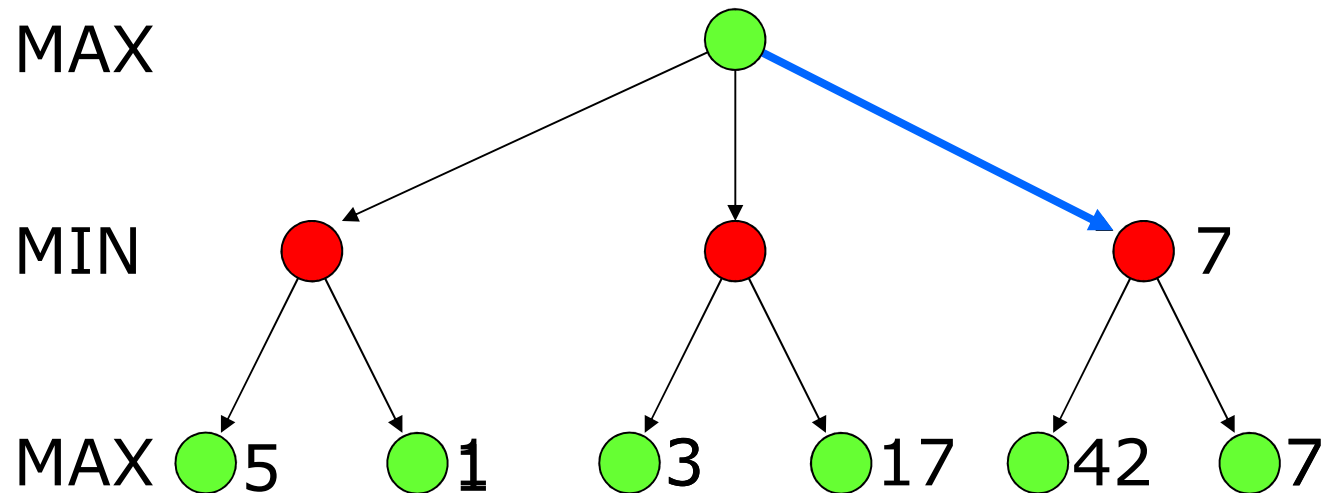
- Huge state space
- Huge action space
- Multiple tasks
  - ✱ on different levels of abstraction
  - ✱ of different types
- Non-deterministic
  - ✱ post-conditions difficult to set
  - ✱ makes planning difficult
- Often real time

# Some common methods

- Minimax
  - ✱ logic games, search for best counter action
- Finite State Machines (FSM)
  - ✱ Behaviour
- $A^*$ 
  - ✱ For shortest path problems
- Particle methods
  - ✱ Simulation of flocks, smoke, water, grass,...
- Smart terrain



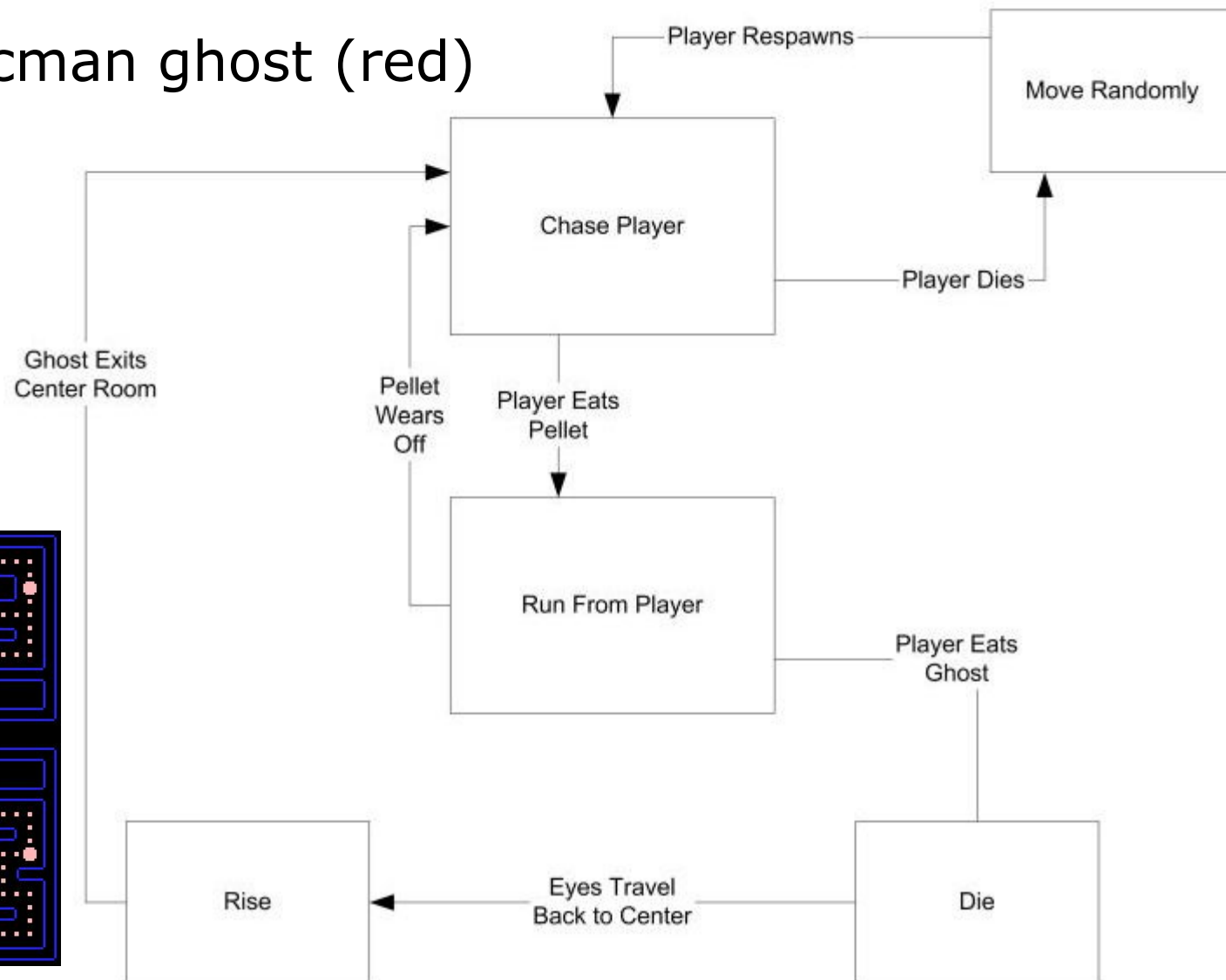
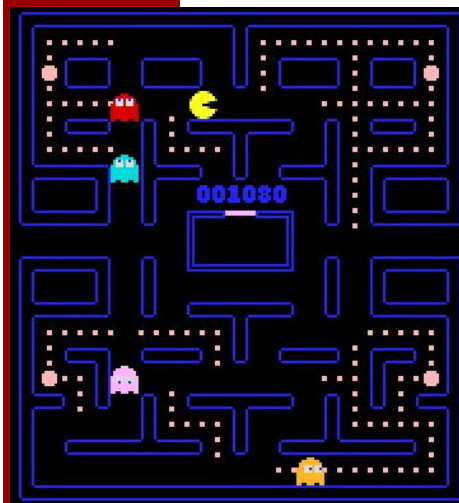
# Minimax (counter actions)



Variants: " $\alpha$ - $\beta$ -pruning" and "expectimax"

# Finite State Machines

Pacman ghost (red)

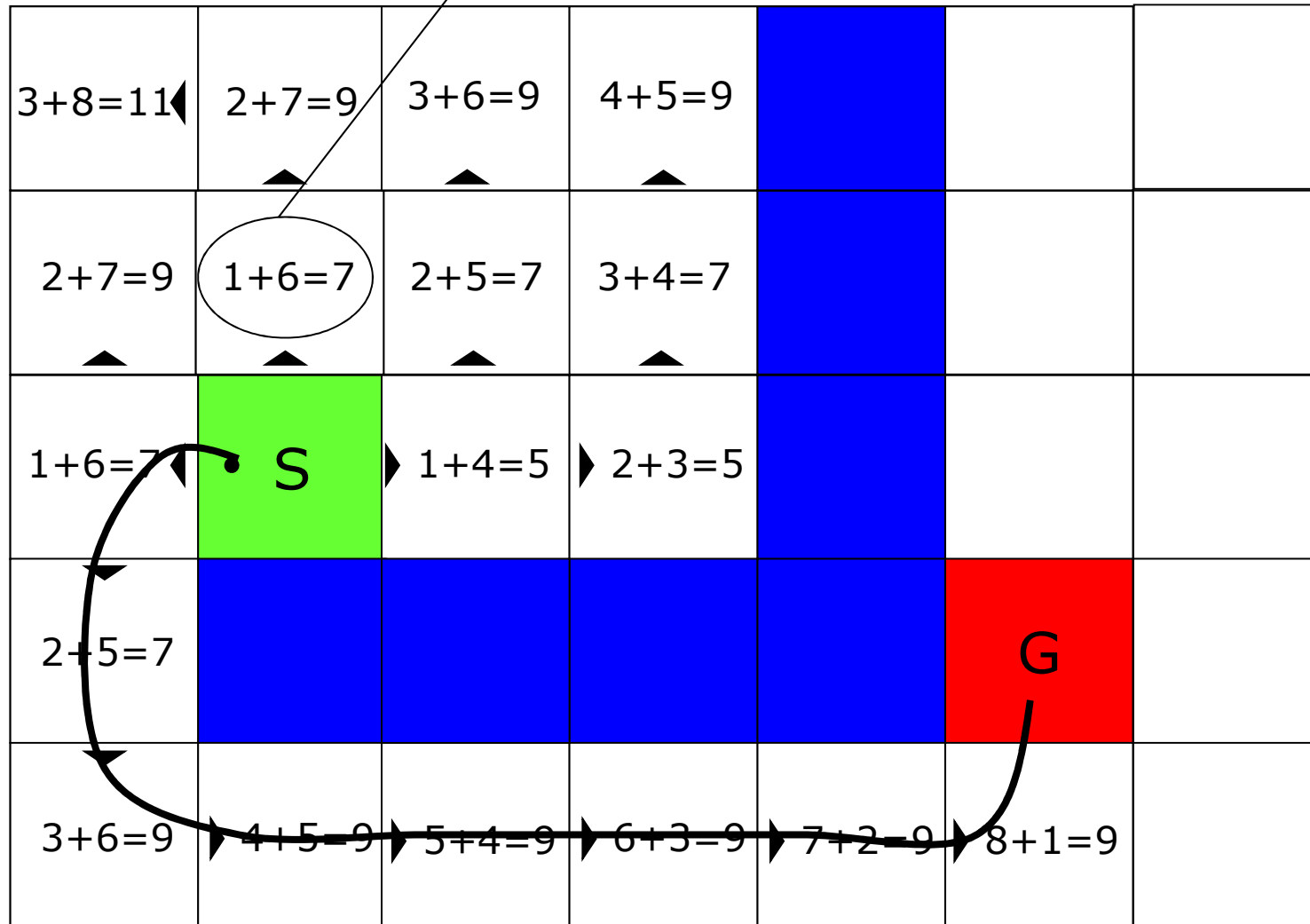




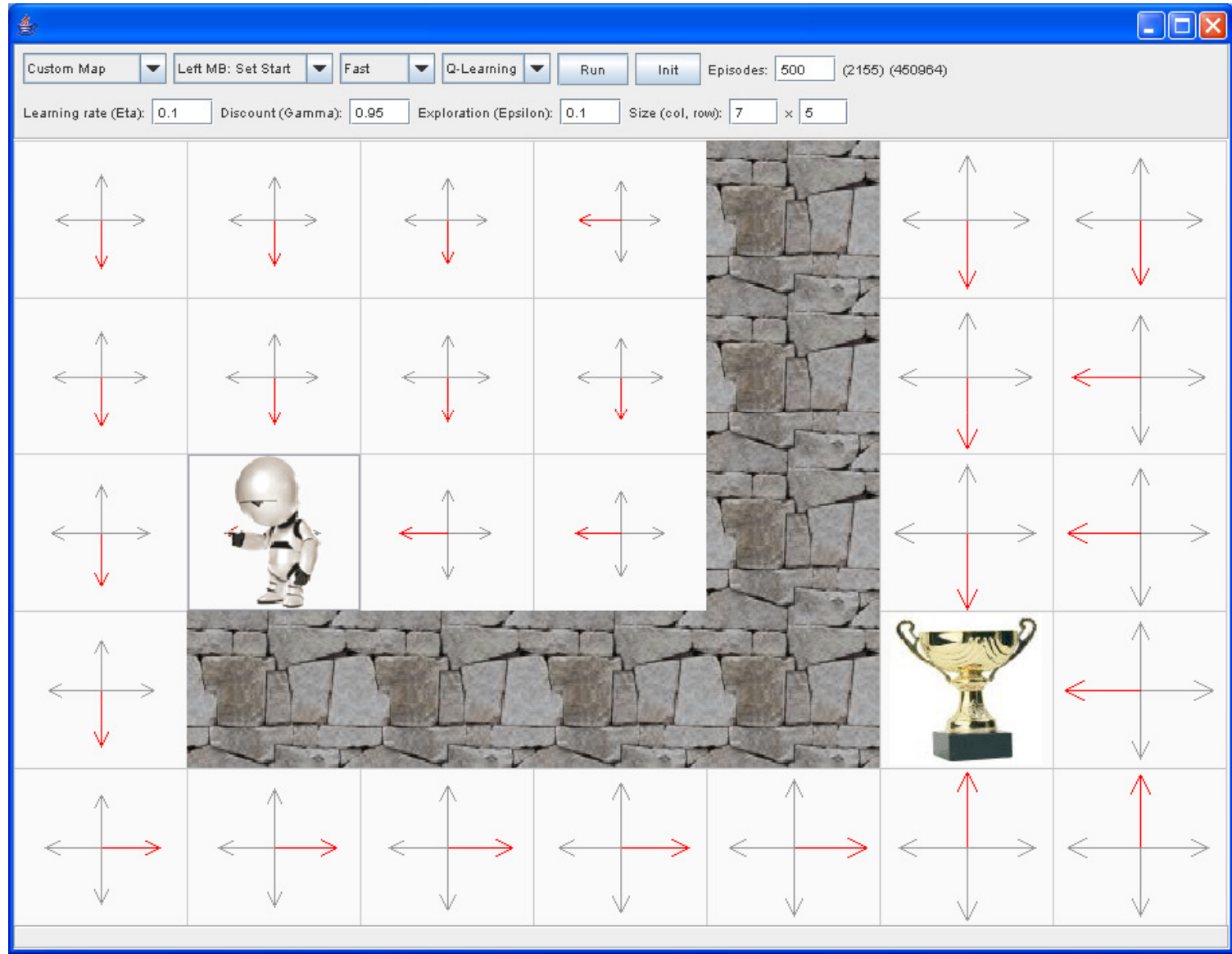


**A\***

Distance from S +  
estimated distance to G



# Reinforcement Learning



# Best $\neq$ shortest



Civilization III

# Smart terrain

- Store knowledge in objects instead of in the characters



drink me! → not thirsty, warm

- ✱ Easier to know what is relevant
  - ✱ Easier to add new objects later
- Attributed to Will Wright (Sims)



# Machine Learning?

- Game characters are short lived
- Learning requires many attempts

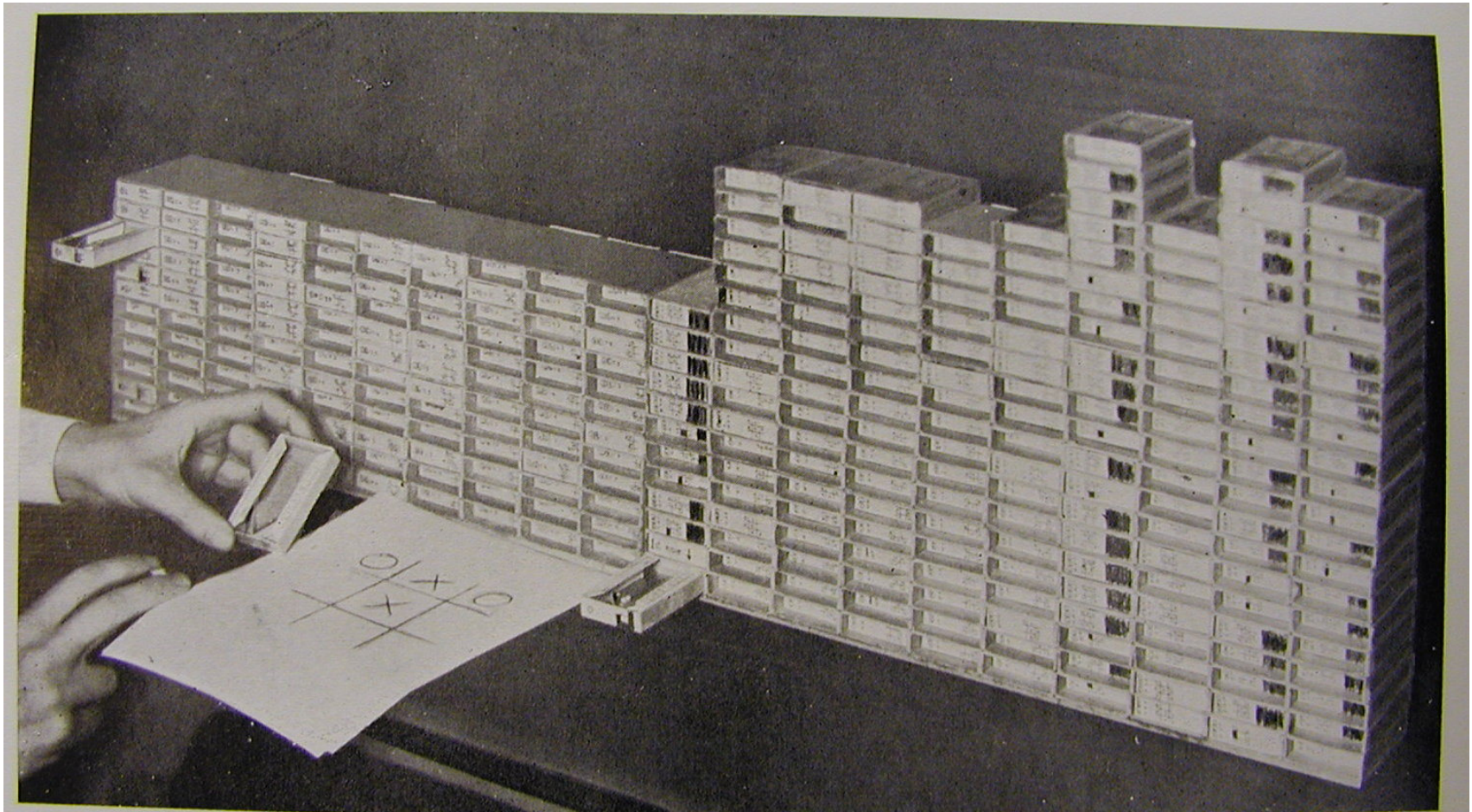
## Keep it simple!

- Probabilistic methods (a la MENACE)
  - ✱ Director level AI
- Evolutionary methods
  - ✱ genetic algorithms and PSO
- Neural networks
  - ✱ in game development, but not often in game



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# MENACE



*Plate 1. The original matchbox version of MENACE*

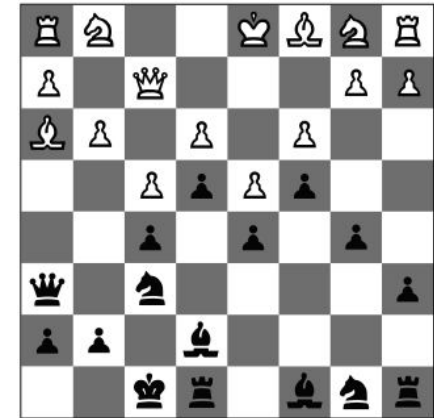


# AI in various game types

- Board games
- Role playing games
- Strategy games
- Platform and sports games
- Racing games

# Board games

- Discrete time / turn based
- Often deterministic
- AI is in the opponent
- AI goal is non-typical (for games)
  - ✱ usually strives for optimality
- Tree search
- Library
- Reinforcement learning



Chess



# Role Playing and Adventure



The Elder Scrolls IV: Oblivion

- AI in enemies, bosses, party members and other NPCs, ...
- Scripting, FSMs, Messaging
- Role Playing  $\neq$  Combat
  - ✱ combat oriented games are simpler to make
- Conversations (grammar machines)
- Quest generators
- Towns



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# Town behaviour



Balmora, in The Elder Scrolls III: Morrowind

# Town behaviour

- Need-based system
  - ✱ Needs (e.g. hunger, business, ...)
  - ✱ Actions (e.g. eating, trading, ...)
  - ✱ "Need pathfinding"
- Problems
  - ✱ Finding people
  - ✱ Unwanted interaction between NPCs

# Strategy games

- AI heavy (on both sides)
- Shortest path problems
- Strategical decisions
- Tactical decisions
- Town building and resource management
  - ✱ planning
- Indigenous life
- Reconnaissance (fog-of-war)
- Diplomacy
- Know thy enemy (observe and adapt)



Civilization III



# Strategy games



Civilization III

# Action games (FPS, TPS)

- Enemies
- Cooperative agents
- Weapons
- Attention
  - ✱ requires perception
    - requires a good physics engine
- Pathfinding
- Spatial reasoning
- Anticipation



Half Life 2



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# Action games (FPS, TPS)



Thief 3: Deadly Shadows



# Platforms and sports

## ■ Platform games

- ✱ In 3D, since 1996 (Mario 64)
- ✱ Camera problems

## ■ Sports games

- ✱ Camera problems (harder)
- ✱ Cooperation
- ✱ Game balance can be difficult
- ✱ Learning





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# Platforms and sports



Prince of Persia



Prince of Persia: The Two Thrones



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# Racing games



Forza Motorsport (2005)

# Racing games



- Track AI
  - ✱ Neural networks (CMR2)
- Traffic (including pedestrians)
- Physics
- Tuning NPCs and vehicle parameters
  - ✱ Genetic algorithms
  - ✱ Particle swarm optimization



# Conclusion

- Making realistic games requires more than good graphics
- Computer controlled characters must *behave*
  - ✱ Naturally
  - ✱ Reasonably intelligent, without cheating
- Graphics has dedicated hardware
  - ✱ More processing power available to AI
- In the future
  - ✱ Dedicated AI cards?
  - ✱ Combined AI/Physics/Graphics cards?
  - ✱ Dedicated cores?
  - ✱ From simulated to real worlds (robotics)

# Robocup (Aibo league)





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# Recommended reading

<http://aigamedev.com>