



COMP280: Specialisms in Creative Computing

7: Al Architectures







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- ✓ Making decisions to achieve goals

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- ✓ Machine learning is an important sub-field of AI, but there are many other AI techniques

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- ✓ Programming machines to carry out (or learn to carry out) a specific type of task

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- For what kinds of tasks are both "good", but approach the task in different ways?

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Al in games

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 A common (and difficult) challenge: creating Al which is imperfect, but not obviously stupid

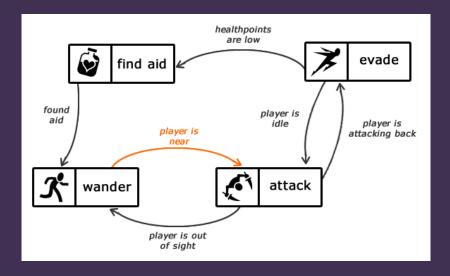




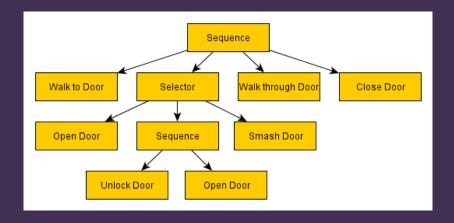
#### Rule-based Al

Generally implemented as if statements or event-based triggers

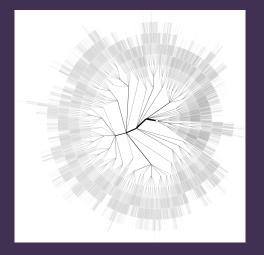
#### Finite state machines



## Behaviour trees

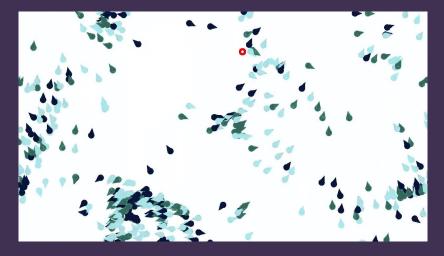


## Game tree search

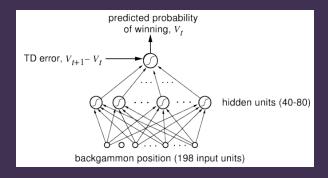




# Multi-agent approaches (e.g. flocking)



# Machine learning



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  - E.g. flocking individual agents are usually rule-based, but overall flock dynamics are emergent





# **Behaviour Trees**

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- ► First used in Halo 2 (2005), now used extensively
- Also used in robotics and other non-game Al applications

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- Unity: numerous free and paid options on the Asset Store e.g. Behavior Machine, Behavior Designer, Behave, RAIN



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- "Running" status allows nodes to represent operations that last multiple frames

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- ... although this is not recommended in Unreal conditionals should be implemented as decorators instead

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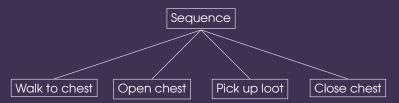
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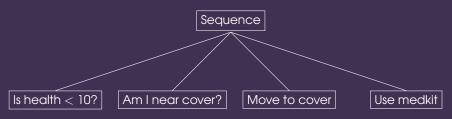
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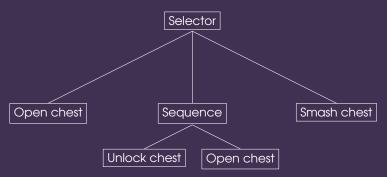
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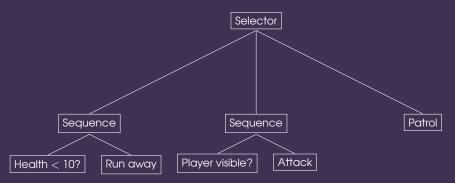
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- (Shared blackboards mean that your Al has "telepathy" — this may or may not be desirable!)



#### BTs in The Division



http://www.gdcvault.com/play/1023382/AI-Behavior-Editing-and-Debugging





Worksheet



Implement AI ghost behaviours for a Pac-Man game



- ► Implement AI ghost behaviours for a Pac-Man game
- ► Brief on LearningSpace

- Implement AI ghost behaviours for a Pac-Man game
- ▶ Brief on LearningSpace
- ► Template project on GitHub

#### Workshop

- ► Make a start on the worksheet!
- Follow the tutorial linked in the worksheet to implement a simple behaviour tree based ghost AI
- Start experimenting with modifying your AI