

Challenging Human Supremacy in Trick-Based Card Games and RTS Games

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Game-playing, **A**nalytical methods,
Minimax search and **E**mpirical **S**tudies

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Abstract Games and Puzzles

- ▶ Skat
- ▶ Go
- ▶ Hex
- ▶ Poker
- ▶ Checkers

- ▶ Heuristic search
- ▶ Combinatorial game theory
- ▶ Opponent Modeling
- ▶ Acting under uncertainty
- ▶ Endgame/pattern databases
- ▶ Evaluation function learning
- ▶ Multiplayer games ...

Video Games

- ▶ RTS (StarCraft)
- ▶ Role-playing Games
- ▶ Sports Games
- ▶ First Person Shooters

- ▶ Multi-agent pathfinding
- ▶ Single-agent and adversarial planning
- ▶ Threat modeling
- ▶ Plot Generation
- ▶ Scripting ...

My Research Interests

- ▶ Heuristic Search
- ▶ Adversarial Planning
- ▶ Search Abstractions
- ▶ Search/Evaluation in Imperfect Information Games
- ▶ Search/Evaluation in Complex Video Games

Applications:

- ▶ Real-Time Strategy Games (StarCraft)
- ▶ Card Games (Skat)
- ▶ Synthetic Game Trees, combat/traffic simulations

Research Challenge 1: Trick-Taking Card Games



How can we reach or surpass the best human players in “simple” abstract **imperfect information team games** such as Spades, Contract Bridge, or Skat?

- ▶ Humans use sophisticated **signalling schemes**
- ▶ Humans routinely **model opponents and partners** well
- ▶ Humans can quickly and **accurately evaluate game states**

Computers don't (yet)

Skat: Popular Card Game for 3 Players

Video: [Skat](#)

Skat: Properties



Similar to Contract Bridge, but:

- ▶ 1 vs. 2 players in cardplay phase, rather than 2 vs. 2
- ▶ Short card deck (32 cards)
- ▶ Simpler numerical bidding system
- ▶ Card points important, rather than number of tricks
- ▶ Declarer allowed to pick up and discard cards
- ▶ No dummy player

Meet Kermit



Our program

1. **evaluates states** based on human games,
2. uses **Monte Carlo search** in the cardplay phase,
3. **infers cards** based on histograms trained from human games,
4. **identifies opponents' cardplay strength** and adjusts to it

Kermit is currently the **best Skat AI system**, playing at human expert level

We think we are close to reaching World Championship level

Thesis Topics Related to Skat

1. Train deep state evaluation and **policy networks** and integrate them into our MC player
2. Develop and evaluate **signalling mechanisms** to improve player cooperation
3. Identify and **exploit common opponent weaknesses** in the bidding and cardplay phases

Research Challenge 2: RTS Game AI

Video: RTS game

- ▶ Current video game AI systems have **little reasoning, learning, and planning** abilities — they are mostly scripted
- ▶ Large number of **simultaneous micro actions**
- ▶ **Real-time!** Thinking too long without acting loses
- ▶ **Imperfect information**, multi-player

RTS Game Combat

Video: StarCraft combat

Playing RTS Games Professionally

Video: professional RTS players

Meet UAlbertaBot

Our bot won the 2013 AIIDE StarCraft AI competition!

It uses:

- ▶ **Branch-and-bound** based build-order optimization
- ▶ **Heuristic search and simulation** for combat attack/retreat decisions
- ▶ **Scripted high-level strategies**

StarCraft bots are nowhere close to the best human players

MCTS, abstraction, and neural nets to the rescue

Thesis Topics related to RTS Games

1. Improve **small-scale combat** AI by training policy networks
2. Design and train a hierarchical network to **play the full StarCraft game**

Facebook and Google Deep Mind also seem to be interested!

Want to help beat them?

Interested in Exciting Game AI Research?

Talk to me

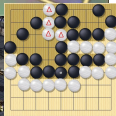
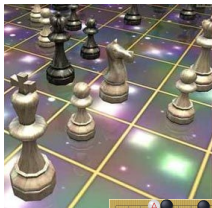
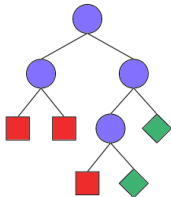
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Prerequisite ...

CMPUT 657 in Winter 2017

Heuristic Search

Instructor: Michael Buro



- How to find high-quality paths in video games quickly?
- How to program a machine that can defeat the human chess World champion?
- Monte Carlo Tree Search, Deep Neural Networks and more ...

Interested? Find out more about this course at www.cs.ualberta.ca/~mburo