Course Overview

CMPUT 654: Modelling Human Strategic Behaviour

Strategic Modelling

This course is about **modelling human strategic behaviour**:

- **Modelling:** Constructing formal, predictive models of action ullet
- **Strategic:** Outcomes that an agent cares about depend on:
 - 1. Agent's own actions
 - 2. Actions of **other** agents, with **independent** goals and priorities
- **Human:** Primarily concerned with modelling behaviour by **people**, not by algorithms (e.g., border gateway protocol)
 - Actual, empirical behaviour, not ideal behaviour

Part 1: Game Theory

- between rational agents
- Format: lacksquare
 - First six weeks
 - Lecture format
 - Two assignments

• Mathematical framework for modelling interactions

Part 2: Behavioural Game Theory

- Inductive models, not just implications of assumptions
- Models are typically cognitively inspired
- Less conceptually unified than standard game theory •

Format lacksquare

- Second four weeks
- Student presentations of readings
- Summaries of readings

Part 3: Research Survey

- - covered
 - Ideally: Propose direction for **new research**
- Presentations in final three weeks

 Survey of literature of sub-area we did not cover in class • Could be an **application** area, **subset** of an area we

(especially if you are considering working with me)

Novel research results **NOT REQUIRED** for full marks

Prerequisites

- Prior knowledge of game theory is **NOT REQUIRED**
- Need to be able to follow/construct formal proofs and mathematical arguments
- Basic knowledge of probability (random variables, expectations, conditional probability, Bayes' rule)

Lecture Outline

- 1. Overview
- 2. Course Topics
- 3. Logistics

Reward hypothesis [Sutton & Barto 2018]: That all of what we mean by goals and purposes can be well thought of as the maximization of the expected value of the cumulative sum of a received scalar signal (called reward).

- represented by a **single number**?
- criterion?

Utility Theory: Reward Hypothesis

1. Why should we believe that an agent's preferences can be adequately

2. Why should agents maximize expected value rather than some other

Utility Theory: Representation Theorem

- Utility theory deals with preference relations \geq over final outcomes $o \in O$
 - i.e., $a \geq b$ means "a is (weakly) preferred to b"
- von Neuman & Morgenstern's **representation theorem** says that if a preference relation \geq satisfies certain axioms, then there exists a utility function $u: O \rightarrow \mathbb{R}$ such that:

1.
$$o_1 \ge o_2 \iff u(o_1) \ge u(o_2)$$

2. $u([p_1 : o_1, ..., p_k : o_k]) = \sum_{k=1}^{n}$

- $_2$), and
- $\sum_{i=1}^{k} p_i u(o_i) = \mathbb{E}[u(o)]$

Game Theory: Normal Form Games

- In a multiagent setting, what are the consequences of assuming that agents \bullet are expected utility maximizers? L
- Normal form games:
 - 4, 3 0, 0 • Each agent picks an action simultaneously • **Profile** of utilities specified for each profile of actions В 1, -1 2, 8
- **Question:** What strategy maximizes utility for the row agent?
 - Solution concepts: Outcomes that are consistent with the expectedutility maximization assumption



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Game Theory: Special Cases

- Repeated games: What happens when the same game is played between the same agents multiple times?
- Extensive form games: Explicitly represent sequential action
- Bayesian games: Explicitly represent private information

Game Theory: Social Choice & Mechanism Design

- **Social choice:** Combining the preferences of multiple agents
- Mechanism design: "Game theory in reverse"
 - the socially optimal outcome
 - ... even if you don't know their utilities
 - *Example:* allocating a valuable item

• Design the **game itself** such that expected utility maximizers will reach

- People aren't actually expected utility maximizers!
- Behavioural game theory: Accurate models of human behaviour in game theoretic settings
 - Demonstrate failures of standard game theory
 - Relaxing assumptions: expected utility maximization, common knowledge
 - Heuristic rules for interactions
 - Cognitive bounds

Behavioural Game Theory

The ideal project is a **proposal** for novel work and a survey of the relevant related work.

1. Predictive Models

- Feedback and Dynamic Behaviour \bullet
- Interpretability lacksquare
- Nonstrategic Factors in Behaviour \bullet
- Discovering Predictive Features

Survey Topics Examples

2. Agent Design

- Game Play
- Optimal Behaviour Discovery / Learning
- Behavioural Finance

3. Mechanism Design

- Spectrum Auctions
- Ad Auctions
- Peer Grading Platforms
- Misinformation in Social Networks
- Topic Selection in Election Coverage



Course Essentials irwright.info/bgtcourse/

- This is the main source for information about the class.
- Slides, readings, deadlines

- This is where **assignments** are posted and handed in
- course material

Class

• There is also a **class forum** for questions and discussions about

Contacting Me

- **Discussion board:** <u>eClass forums</u> for **public** questions about assignments, lecture material, etc.
- Email: james.wright@ualberta.ca for **private** questions (health problems, inquiries about grades)
- **Office hours:** After every lecture, or by appointment \bullet

Evaluation

- Assignments: 30%
- Reading presentation: 15%
- Reading summaries: 15%
- Research survey
 - Outline: 5% lacksquare
 - Presentation: 15% lacksquare
 - Writeup: 20%

Missed / Late Assignments

Late assignments

- Can be handed in up to 2 days after deadline
- Flat 20% penalty
- On time or late but please **not both**

Missed assignments

• Weight of assignments missed due to excused absences will be proportionally distributed among other assessments

Assignments

other students:

- You may not share or look at each other's written work 1.
- 2. You must write up your solutions individually
- 3. You must **list** everyone you talked with about the assignment.

There will be **two** assignments (not necessarily weighted equally)

You are **encouraged to discuss** assignment questions with

Academic Conduct

- Submitting someone else's work as your own is plagiarism.
- So is helping someone else to submit your work as their own.
- I report all cases of academic misconduct to the university.
- The university takes academic misconduct very seriously. Possible consequences:
 - Zero on the assignment (virtually guaranteed)
 - Zero for the course
 - Permanent notation on transcript
 - Suspension or expulsion from the university

Readings

For Part 1 (Game theory)

 Yoav Shoham and Kevin Leyton-Brown, Logical Foundations

For Part 2 (Behavioural game theory):

• Original papers from the literature

For Part 3 (Research surveys):

- Self-directed readings from the literature
 - But feel free to ask me for pointers!

Multiagent Systems: Algorithmic, Game-Theoretic, and

Enrollment

How many people present today are:

- Enrolled?
- Auditing with the hope of enrolling?
- Auditing without intending to enrol?

of enrolling? ing to enrol?

ABGT Reading Group

What: Topics related to algorithmic and behavioural game theory

When: Mondays at 3:15pm - 4:40pm **Where:** ATH 3-32

Next meeting: January 15, 2024

Webpage: jrwright.info/abgt.html

Announcements: <u>abgt slack channel</u> (see website for link)

Al Seminar

What: Great talks on cutting-edge AI research External (e.g., other universities, DeepMind, local startups) and internal speakers

When: Fridays at noon

Website: <u>sites.google.com/ualberta.ca/ai-seminar/</u>

Announcements: Sign up for mailing list (bottom of webpage)

Summary

Course webpage: jrwright.info/bgtcourse/

- Grading: •
 - Two assignments
 - One reading presentation
 - Research survey \bullet
- Reading group: jrwright.info/abgt.html \bullet

Data-driven behavioural modelling using lens of game theory