# Chun Kai Ling

Carnegie Mellon University

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Computer Science Department

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#### **EDUCATION**

### Computer Science Department, Carnegie Mellon University 2017-present

Ph.D. Student, Computer Science

Fields: Artificial Intelligence, Machine Learning, Game Theory.

Advisors: J. Zico Kolter, Fei Fang

Expected graduation date: Summer 2023

### National University of Singapore (NUS)

2011-2015

B.Eng.(Hons), First Class, Computer Engineering, GPA: 5.0/5.0

Minor in Mathematics, Exchange Program to HKUST.

#### RESEARCH

## ${\bf Graduate\text{-}Research\ Assistant(Ph.D.\ student),\ CMU}$

End-to-End Learning of Two-Player Zero Sum Games

Designed a differentiable module able to learn payoff-matrices in 2 player extensive-form imperfect information games, using only samples from equilibrium strategies. Proposed a novel solution concept for bounded rationality in extensive-form games and efficient methods to solve it for zero-sum games.

Skills: Pytorch, Cython, Optimization, Game Theory

Online Solving of General-sum Games (ongoing)

Proposed the first online methods to approximate Stackelberg and Extensive-Form Correlated Equilibrium online without having to solve the full game upfront. For both solution concepts, I was able to solve substantially larger games than existing offline solvers while enjoying guarantees on solution quality with respect to a blueprint policy. Skills: C/C++, Optimization, Game Theory, OpenMP, OpenSpiel

Function Approximation for Solving General-sum Games (ongoing)

We approximate Stackelberg Extensive-Form Correlated Equilibrium by learning the Pareto Frontiers for each state and applying Fitted Value Iteration with an appropriate Bellman-like loss. Our method guarantees incentive compatibility and has solution quality lower bounded in terms of function approximation errors.

Skills: Pytorch, Game Theory

#### Other projects:

- Learning multi-player correlated behavior with deep reinforcement learning.
- Efficient solvers and qualitative analysis for Extensive Form Correlated Equilibrium.
- Learning fully differentiable joint Cumulative Distribution Functions and Copulas.
- Solving multiple-leader Stackelberg Equilibrium with correlated commitments.
- Partial Information Decomposition (PID) for quantifying feature interactions.

### Summer Research Intern, Facebook AI Research, NYC

2019

2017

Project: Safe Search for Stackelberg Equilibrium in Extensive-Form Games

Supervised by Noam Brown.

Skills: Python, Rust, Optimization, Game Theory

### Research Assistant, Department of Computer Science, NUS

Project: Network Anomaly Detection

Applied statistics and machine learning to cluster and identify potential anomalies in unlabelled netflow data. Supervised by Prof. Kian Hsiang Low and Mun Choon Chan. Skills: Applied Machine Learning

#### Signal Processing Lab, DSO National Laboratories

Projects: Computer Vision, Image Processing, Machine Learning, Optimization Applied machine learning and signal processing for object detection, segmentation, image and video enhancement and super-resolution. System administrator for the lab. Skills: Matlab, Image Processing, Optimization

#### Honors Dissertation, NUS

2014-2015

Project: Planning and Learning in Spatiotemporal Environmental Phenomena Formulated, analyzed and evaluated the Gaussian Process Planning framework, a novel non-myopic, Bayes-adaptive model-based planning framework with applications in Bayesian Optimization and Active Learning. Published in AAAI '16. Skills: Gaussian Processes, Machine Learning

#### Undergraduate Part-time Research Assistant, NUS

2014

Project: Point Cloud Registration

Performed feature extraction used to align noisy point clouds obtained via Structure from Motion. Experimented with standard LIDAR datasets and attempted to reproduce results on noisy point clouds obtained using SfM.

#### Undergraduate Research Opportunities Programme, NUS

Project: Computational intelligence for MRI image segmentation

Studied Markov random fields and experimented with t-mixture models to improve robustness in brain tumour segmentation.

Skills: Matlab, Graphical Models

## Research Intern, Centre for Strategic Infocomm Technologies

2014

2013-2014

Project: Static Analysis of Binary Executables

Investigated and proposed methods to perform automatic function and instruction matching of x86 assembly code, in the absence of function symbols. Wrote tools to distinguish between code and data in disassembled binaries.

## AWARDS

#### GameSec'23 Best Paper Award

2023

Out of 18 acceptances and 35 submissions.

#### **NUS Development Grant**

2022, 2023

Support for Singaporeans early in their academic career.

### IJCAI'18 Distinguished Paper Award

2018

7 papers out of 710 acceptances and 3470 submissions.

### **DSO** National Laboratories

KiNETIC and Group accomplishment award for a classified project.

2016

#### National University of Singapore

National University of Singapore	
Valedictorian for the class of Computer Engineering graduates.	2015
IES Gold Medal. Top graduating student.	2015
Lee Kuan Yew Gold Medal. Best graduate through the course of study.	2015
DSTA Gold Medal. Best final year student for Computer Engineering.	2015
NUS Faculty Scholarship.	2011  2015
Deans List for Semesters 1 through 6. Amongst top 5 $\%$ of students.	2011  2014
Alcatel Lucent Telecomm. Award. Best performance in a class for Network	s. 2014
Top 2 Term Project for the class 'AI Planning and Decision Making'.	2014
Micron Prize. Top 2nd year student.	2012

**PUBLICATIONS** 

Weijia Zhang, **Chun Kai Ling**, Xuanhui Zhang. Deep Copula-based Survival Analysis for Dependent Censoring with Identifiability Guarantees. (Accepted to AAAI'24)

Finalist in NUSACM iCode intra-college algorithmic programming competition. 2012

Yixuan Xu, **Chun Kai Ling**, Fei Fang. Learning Coalition Structures with Games. (Accepted to AAAI'24)

Paul Pu Liang, Yun Cheng, Xiang Fan, **Chun Kai Ling**, Suzanne Nie, Richard J. Chen, Zihao Deng, Nicholas Allen, Randy Auerbach, Faisal Mahmood, Ruslan Salakhutdinov, Louis-Philippe Morency. Quantifying & Modeling Multimodal Interactions: An Information Decomposition Framework. (Neurips'23)

Zimeng Song, Chun Kai Ling, Fei Fang. Multi-defender Security Games with Schedules. (GameSec'23)

Best Paper Award out of 18 accepted papers and 35 submissions.

Samuel Sokota, Ryan D'Orazio, **Chun Kai Ling**, David J. Wu, J. Zico Kolter, Noam Brown. Abstracting Imperfect Information Away from Two-Player Zero-Sum Games (ICML'23)

Chun Kai Ling, J. Zico Kolter, Fei Fang. Function Approximation for Solving Stackelberg Equilibrium in Large Perfect Information Games (AAAI'23, Oral Presentation) [19% acceptance rate]

Chun Kai Ling, Fei Fang. Safe Subgame Resolving for Extensive Form Correlated Equilibrium (AAAI'22, Oral Presentation) [15% acceptance rate]

Chun Kai Ling, Noam Brown. Safe Search for Stackelberg Equilibria in Extensive-Form Games (AAAI '21) [21% acceptance rate]

Chun Kai Ling, Fei Fang, J. Zico Kolter. Deep Archimedean Copulas (NeurIPS '20) [20.1% acceptance rate]

Dmitrii Kharkovskii, **Chun Kai Ling**, Bryan Kian Hsiang Low. Nonmyopic Gaussian Process Optimization with Macro-Actions (AISTATS '20) [28.7% acceptance rate]

Gabriele Farina, **Chun Kai Ling**, Fei Fang, Tuomas Sandholm. Correlation in Extensive-Form Games: Saddle-Point Formulation and Benchmarks (NeurIPS '19) [21.6% acceptance rate]

Gabriele Farina, **Chun Kai Ling**, Fei Fang, Tuomas Sandholm. Efficient Regret Minimization Algorithm for Extensive-Form Correlated Equilibrium (NeurIPS '19, Oral Presentation) [21.6% acceptance rate]

Chun Kai Ling, Fei Fang, J. Zico Kolter. Large Scale Learning of Agent Rationality in Two-Player Zero-Sum Games (AAAI '19) [16.2% acceptance rate]

Chun Kai Ling, Fei Fang, J. Zico Kolter. What Game Are We Playing? End-to-end Learning in Normal and Extensive Form Games (IJCAI '18) [20.5% acceptance rate] **Distinguished Paper Award**. 7 papers were selected out of 710 acceptances and 3470 submissions.

Chun Kai Ling, Kian Hsiang Low, and Patrick Jaillet. Gaussian Process Planning with Lipschitz Continuous Reward Functions: Towards Unifying Bayesian Optimization, Active Learning, and Beyond (AAAI '16) [25.8% acceptance rate]

WORKSHOP AND PREPRINTS Chun Kai Ling, J. Zico Kolter, Fei Fang. What game are we playing? Differentiably learning games from incomplete observations. (NIPS '17 Deep Reinforcement Learning Symposium)

TALKS End-to-end Learning in Normal and Extensive Form Games.

2018 AAMAS-IJCAI Workshop on Agents and Incentives in Artificial I	Intelligence (AI <sup>3</sup>	3)
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2018 IJCAI main track (at Stockholm) 2018 Cylab Partners Conference (at CMU)

TEACHING	Artificial Intelligence Methods for Socia	al Good (08-737)	Spring 2018
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Graduate Artificial Intelligence

**SERVICE** 

GameSec 2022 Web Chair 2022

Spring 2019

CMU Speakers Club, Computer Science Department 2021- present CMU Graduate Application Support Program 2020

COURSEWORK Analytical Performance Modeling (15-857) Fall 2017

Fundamentals of Learning from the Crowd (10-709)

Graduate Artificial Intelligence (15-780)

Advanced Algorithms (15-850)

Logical Foundations of Cyber-Physical Systems (15-824)

Advanced Operating Systems and Distributed Systems (15-712)

Fall 2018

Fall 2018

Fall 2018

OTHERS Software Engineering Intern, Graymatics 2013

Wrote tools to speed up machine learning pipelines. Contributed to the implementation of a image-sharing social media platform. Wrote a desktop application to help end-users organize digital media.

Temporary Administrative Assistant, Health Promotion Board
Temporary Tax Officer, Inland Revenue Authority of Singapore
Air Defence Weapon Operator, 160 Squadron
2012
2012
2013
2019
2011