

# Huaiguang Cai

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📄 <https://caihuaiguang.github.io/>

## Education

- 2022 – 2025 **Institute of Automation, Chinese Academy of Sciences**, Beijing, China.  
Master Student, Advisor: Dr. Wensheng Zhang.  
Major: Pattern Recognition and Intelligent System, GPA: 3.83/4.00.
- 2018 – 2022 **Sun Yat-Sen (Zhongshan) University**, Guangzhou, China.  
Bachelor Degree, Advisor: Dr. Zhi Zhou & Dr. Chang-Dong Wang.  
Major: Computer Science, GPA: 3.9/4.0.

## Research Interests

My research aims to develop **reliable**, **explainable**, and **practical** decision-making algorithms. My interests include algorithmic game theory, online algorithms, ad auction, and online learning theory.

## Publications

- INFOCOM 2024 **Huaiguang Cai**, Zhi Zhou, and Q. Huang, "Online Resource Allocation for Edge Intelligence with Colocated Model Retraining and Inference," in IEEE Conference on Computer Communications, Vancouver, Canada, May 20–23, 2024. (CCF-A).
- Working Paper **Explainable Decision-making: Attribute model performance to training data.**  
CHG Shapley: Efficient Data Valuation and Selection towards Trustworthy Machine Learning.
- Working Paper **Explainable Decision-making: Attribute model prediction to input features.**  
CAMs as Shapley Value-based Explainers.

## Project

- 2021 – 2022 **Recommendation System**, Bachelor Thesis, Sun Yat-Sen University.  
A Bipartite GNN-based Recommendation with Dynamic Multi-negative Sampling.
- 2022 – 2023 **Online Learning and Game Theory Review (in Chinese)**, 19 pages.  
Link: [https://caihuaiguang.github.io/my\\_summary/OL/OL\\_GT2.pdf](https://caihuaiguang.github.io/my_summary/OL/OL_GT2.pdf)
- 2023 – 2024 **Ad Auction**, *Brand Advertising*, Intern, ByteDance, Ocean Engine.
- 2022– Now **Learning in Games**, Independent Researcher.  
Experimentally observed that predictive CFR algorithms converge faster in last-iterate than average-iterate in non-HUNL two-player zero-sum games; acknowledged by Prof. Gabriele Farina, MIT. Ongoing theoretical investigation will further explore this finding.

## Skills

- Programing C/C++, Python, LaTeX, MATLAB.
- Language Chinese (native), and English (fluent).
- Other Guitar, Rowing.

# 决策

## 单人决策： 在线优化

训练推理混合部署：**首次**形式化此计算范式，用优化技术提出在线算法，并给出仅推理和此算法的竞争比刻画。CCF-A: INFOCOM。

OpenAI o1算力分配: o1的哲学就是将模型在Test-Time Compute获得的长程推理能力通过训练来内化。模型初期能力较弱时应加强推理去得到好的Rationale，模型后期只需加强训练。

## 多人决策： 合作博弈论

模型训练结果归因到数据：推导出每个数据的价值的**解析式**，**首次**将模型训练次数从平方降为1。数据定价，抗噪训练。独作投稿ICLR。

模型推理结果归因到特征：从决策角度提出理论框架，**建立**可解释AI两代表性方法CAM和SHAP的联系，解释GradCAM，发展ShaplyCAM。

大模型辅助决策产品 (政策, 金融, 代码)：李沐说大模型代表着无限人力资源，但我认为重要领域决策只能由人来决定。我的产品可以将模型输出的某个词归因到输入中的词 (非RAG)。  
**高级文秘**：金融或者政策从业者可以将过往海量政策信息输入大模型，对于有意义的输出用我的工具直接标红原文，自行再判断。  
**代码解释**：公司新人对代码库不熟悉，可以和内部大模型对话，给出结论的同时标红代码来对照。

## 多人决策： 非合作博弈论

求解两人Nash均衡：大规模实验发现Predict CFR在last-iterate上快avg几倍收敛。得到MIT教授Gabriele Farina (Noam Brown师弟) 认可。

机制设计：字节核心部门广告拍卖，预算分桶代码实现，在复杂业务链路中找到一个埋藏4年的小bug。

OpenAI o1复现：在4张A40 (48G) 上运行了自动化所汪军老师发布的第一个o1开源复现。Self Play这部分难点我的发现可能加速训练。