# www.ganzfriedresearch.com

# **Summary**

I enjoy every step of the problem-solving process, from the design and theoretical analysis of new algorithms to implementation in large-scale systems. For my PhD research, I developed scalable approaches for computing game-theoretic solution concepts and learning in imperfect-information games. I have applied several of these techniques to the domain of poker: the two-player no-limit Texas hold 'em agent Tartanian7 that I created came in first place in the 2014 AAAI Computer Poker Competition, and Claudico lost against the strongest human specialists in the Brains vs. Artificial Intelligence competition in 2015.

**Interests**: artificial intelligence, game theory, multiagent systems, multiagent learning, large-scale optimization, large-scale data analysis and analytics, knowledge representation.

#### **Education**

- Ph.D., Computer Science, Carnegie Mellon University, 2015
  - Thesis: "Computing Strong Game-Theoretic Strategies and Exploiting Suboptimal Opponents in Large Games"
- M.S., Computer Science, Carnegie Mellon University, 2009
- A.B., Mathematics, Harvard University, 2005
  - Concentration GPA: 3.92

#### **Awards**

- Paper "Reflections on the First Man vs. Machine No-Limit Texas Hold 'em Competition" selected to be feature article in SIGecom Exchange Newsletter for ACM Interest Group on Electronic Commerce.
- First place, Annual Computer Poker competition, two-player no-limit Texas hold 'em bankroll instant run-off and total bankroll divisions, at the *AAAI Conference on Artificial Intelligence (AAAI)*, 2014 (with Noam Brown and Tuomas Sandholm). Our agent beat each opponent with statistical significance.
- Paper "Safe Opponent Exploitation" from ACM Conference on Electronic Commerce invited to "Best of EC" special issue of journal ACM Transactions on Economics and Computation (with Tuomas Sandholm).
- Finalist, Best Student Paper Award, "Computing an Approximate Jam/Fold Equilibrium for 3-Player No-Limit Texas Hold'em Tournaments" at *International Conference on Autonomous Agents and Multiagent Systems* (with Tuomas Sandholm).
- United States Presidential Scholar.
- National Merit Scholar.

# **Employment**

- Assistant Professor, Florida International University, Computer Science, 2016–2018, Miami, FL
  - Director of Strategic Adversarial Multiagent Artificial Intelligence Laboratory (SAM AI).
- Founder, Ganzfried Research, 2015–present
  - Conducting research and building technology in artificial intelligence and game theory with applications including poker, education, medicine, socialization, and hurricane prediction.
- Quantitative Trader, Tower Research Capital LLC, 2005–2006, New York, NY
  - Designed, implemented, and deployed high-frequency trading algorithms. I was compensated
    for several months after I returned to graduate school due to high profitability of the strategies.
- Director's Summer Program, National Security Agency, Summer 2005
- Research Experiences for Undergraduates, Mathematics, Oregon State University, Summer 2004

#### Media

- "Meet the FIU professor who created program that can beat the poker pros," Miami Herald, front page of "Tropical Life" section, March 2017.
- "Poker-playing AI 'bot' carries long-range impact," Pittsburgh Tribune-Review, August 2016.
- Played in high-stakes poker game for the television series "Poker Night in America," November 2015.
  - Season 4 episodes 17 and 18, aired in October 2016 on CBS Sports Network.
  - Commentated for and played on the show again November 19–20, 2016.
  - Also commentated on March 11, 2017.

### **Publications**

- Sam Ganzfried, Austin Nowak, Joannier Pinales. Successful Nash Equilibrium Agent for a 3-Player Imperfect-Information Game. 2018. Invited feature paper at *Games*, 2018.
- Sheila Alemany, Jonathan Beltran, Adrian Perez, and Sam Ganzfried. Predicting Hurricane Trajectories using a Recurrent Neural Network. 2018. Cite as arXiv:1802.02548 [cs.LG].
- Sam Ganzfried and Farzana Yusuf. Optimal Weighting for Exam Composition. 2018. Education Sciences special issue "Artificial Intelligence and Education."
- Kailiang Hu and Sam Ganzfried. Midgame Solving: A New Weapon for Efficient Large-Scale Equilibrium Approximation. 2017. International Conference on Tools with Artificial Intelligence. Short paper.
- Sam Ganzfried. What is the Right Solution Concept for No-Limit Poker? Int. Conference on Game Theory, 2017.
- Sam Ganzfried. Endgame Solving: The Surprising Breakthrough that Enabled Superhuman Two-Player No-Limit Texas Hold 'em Play. International Conference on Game Theory, 2017.
- Sam Ganzfried and Farzana Yusuf. Computing Human-Understandable Strategies: Deducing Fundamental Rules of Poker Strategy. Invited feature paper at Games, 2017, 8(4), 49.
  - Oral presentation at AAAI Workshop on Computer Poker and Imperfect Information Games, 2017.
- Sam Ganzfried and Farzana Yusuf. Optimal Number of Choices in Rating Contexts. Cite as: arXiv:1605.06588.
  - Oral presentation at INFORMS 2017 in Decision Support Systems track.
  - Accepted as extended abstract at AAMAS, 2017 (declined).
  - Proceedings of Machine Learning Research, 2016, Volume 58.
  - Poster and spotlight presentation at NIPS Workshop on Imperfect Decision Makers: Admitting Real-World Rationality.
  - Poster presentation at INFORMS, 2016. Finalist at poster competition.
- Sam Ganzfried and Qingyun Sun. Bayesian Opponent Exploitation in Imperfect-Information Games. Conference on Computational Intelligence and Games (CIG), 2018. Oral presentation. arXiv:1603.03491 [cs.GT].
  - Oral presentation at AAAI Spring Symposium on Learning, Inference, and Control of Multi-Agent Systems, 2018.
  - Oral and poster presentation at AAAI Workshop on Computer Poker and Imperfect Information Games, 2016.
  - Oral presentation at INFORMS, 2016.
  - Oral presentation at UECE Lisbon Meetings in Game Theory and Applications, 2016.
  - Poster presentation at 2016 New York Computer Science and Economics Day.
  - Poster presentation at ACM Conference on Economics and Computation (EC), 2016.
- Sam Ganzfried. Reflections on the First Man vs. Machine No-Limit Texas Hold 'em Competition. Feature article in SIGecom Exchange Newsletter, Volume 14.2, 2015. arXiv:1510.08578 [cs.GT].

  - AI Magazine, Volume 48, Number 2, summer 2017.
    Oral presentation at 2016 New York Computer Science and Economics Day.
  - Oral presentation at 2016 World Congress of the Game Theory Society (GAMES).
- Sam Ganzfried. Computing Strong Game-Theoretic Strategies and Exploiting Suboptimal Opponents in Large Games. PhD dissertation, 2015, available as CMU technical report CMU-CS-15-104.
- Sam Ganzfried and Tuomas Sandholm. Endgame Solving in Large Imperfect-Information Games. International Conference on Autonomous Agents and Multiagent Systems (AAMAS), 2015. Oral and poster presentation.
  - Also presented at the Workshop on Computer Poker and Imperfect Information at AAAI, 2015, oral and poster presentation.
  - Poster presentation at ACM Conference on Economics and Computation, 2015.
  - Oral presentation at INFORMS, 2015.
  - Early version appeared as "Improving Performance in Imperfect-Information Games with Large State and Action Spaces by Solving Endgames" at the Workshop on Computer Poker and Imperfect Information at AAAI, 2013, oral and poster presentation, and was also presented at the Workshop on Computer Games at IJCAI, 2013.
- Noam Brown\*, Sam Ganzfried\*, and Tuomas Sandholm. Hierarchical Abstraction, Distributed Equilibrium Computation, and Post-Processing, with Application to a Champion No-Limit Texas Hold'em Agent. International Conference on Autonomous Agents and Multiagent Systems (AAMAS), 2015. Full paper, acceptance rate 25%. Oral and poster presentation. \*The student authors are listed alphabetically.
  - Also presented at the Workshop on Computer Poker and Imperfect Information at AAAI, 2015. Oral and poster presentation.
  - Short version "Tartanian7: A Champion Two-Player No-Limit Texas Hold'em Poker-Playing Program" in Demonstrations Program at AAAI, 2015.
- Sam Ganzfried and Tuomas Sandholm. Safe Opponent Exploitation. ACM Transactions on Economics and Computation (TEAC), 2015. Special issue on selected papers from EC-12.
  - Early version appeared in ACM Conference on Electronic Commerce (EC), 2012. Also presented at poster session.
  - Shorter version presented at AAMAS Workshop on Adaptive and Learning Agents, 2012.
  - Oral presentation at INFORMS, 2012.
- Sam Ganzfried and Tuomas Sandholm. Potential-Aware Imperfect-Recall Abstraction with Earth Mover's Distance in Imperfect-Information Games. AAAI Conference on Artificial Intelligence (AAAI), 2014. Oral and poster.
  - Also presented at the Workshop on Computer Poker and Imperfect Information at AAAI, 2014. Oral and poster presentation.
- Sam Ganzfried and Tuomas Sandholm. Action Translation in Extensive-Form Games with Large Action Spaces: Axioms, Paradoxes, and the Pseudo-Harmonic Mapping. International Joint Conference on Artificial Intelligence (IJCAI), 2013. Oral and poster presentation.
  - Also appeared as a poster presentation at the Workshop on Computer Poker and Imperfect Information at AAAI, 2013.

- Sam Ganzfried and Tuomas Sandholm. Tartanian5: A Heads-Up No-Limit Texas Hold'em Poker-Playing Program. Computer Poker Symposium at the AAAI Conference on Artificial Intelligence (AAAI), 2012. Oral and poster.
- Sam Ganzfried, Tuomas Sandholm, and Kevin Waugh. Strategy Purification and Thresholding: Effective Non-Equilibrium Approaches for Playing Large Games. International Conference on Autonomous Agents and Multiagent Systems (AAMAS), 2012. Oral and poster presentation.
  - Early version "Strategy Purification" in AAAI Workshop on Applied Adversarial Reasoning and Risk Modeling, 2011.
  - Extended abstract in AAMAS, 2011 (acceptance rate 45%).
  - Oral presentation at INFORMS, 2012.
  - Poster presentation at ACM Conference on Electronic Commerce (EC), 2012.
- Sam Ganzfried and Tuomas Sandholm. Game Theory-Based Opponent Modeling in Large Imperfect-Information Games. International Conference on Autonomous Agents and Multiagent Systems (AAMAS), 2011. Oral and poster.
  - Also presented at INFORMS, 2011.
  - Poster presentation for the Annual Computer Poker Competition at AAAI, 2010.
- Sam Ganzfried and Tuomas Sandholm. Computing Equilibria by Incorporating Qualitative Models. International Conference on Autonomous Agents and Multiagent Systems (AAMAS), 2010. Oral and poster presentation. Extended version as tech. report CMU-CS-10-105.
  - Also presented at INFORMS, 2010.
  - Oral presentation at Brazilian Workshop of the Game Theory Society, 2010.
- Sam Ganzfried and Tuomas Sandholm. Computing Equilibria in Multiplayer Stochastic Games of Imperfect Information. International Joint Conference on Artificial Intelligence (IJCAI), 2009. Oral presentation.
  - Also presented at INFORMS, 2008.
- Sam Ganzfried and Tuomas Sandholm. Computing an Approximate Jam/Fold Equilibrium for 3-Player No-Limit Texas Hold'em Tournaments. International Conference on Autonomous Agents and Multiagent Systems (AA-MAS), 2008. Oral and poster presentation.
  - Also presented as poster presentation at International Congress of the Game Theory Society, 2008.

# Other presentations

- "Successful Nash Equilibrium Agent for a 3-Player Imperfect-Information Game"
  - Princeton University, 5/1/18, organized by Princeton Poker Club.
  - MIT, 5/3/18, organized by MIT Poker Club.
- "Optimal Number of Choices in Rating Contexts" 4/20/2018, FIU Department of Mathematics and Statistics Annual Mini-Conference in Statistical Methods and Mentoring.
- "Artificial Intelligence: From Poker Agents to Hurricane Prediction" 9/30/2017, FIU ShellHacks hackathon. "Strong Game-Theoretic Strategies: Beyond Two Agents" 9/15/2017, MIT, organized by MIT Poker Club.
- "Endgame Solving: The Surprising Breakthrough that Enabled Superhuman Two-Player No-Limit Texas Hold 'em Play"
  - Microsoft Research Asia Lab, 5/11/17.
  - Tsinghua University, 5/7/17.
  - Princeton University, 3/13/17, organized by Princeton Poker Club.
- "First Man vs. Machine No-Limit Texas Hold 'em Competition" 2/1/17, Stanford University.
  "Computing Strong Game-Theoretic Strategies in Large Games" 3/24/16, Princeton University Poker Club.
- "Reflections on the First Man vs. Machine No-Limit Texas Hold 'em Competition" 3/18/16, Susquehanna International Group.

# **Professional service**

- Organizer: Tutorial on Computer Poker at AAAI Conference on Artificial Intelligence (AAAI) (2017).
- Organizer: First Tutorial on Computer Poker at Conference on Economics and Computation (2016).
- Organizer: AAAI Workshop on Computer Poker and Imperfect Information (2014, 2015).
- Program committees: AAAI (2012, 2014–2018), AAMAS (2014, 2016), IJCAI (2013, 2015, 2016), WWW (2018), AAAI Workshop on Computer Poker and Imperfect-Information Games (2017).
- Additional conference reviewing: AAAI (2010), AAMAS (2013), EC (2013), NIPS (2016).
- Journal reviewing: Artificial Intelligence ('10-'14,'18), Computational Intelligence ('10), Games ('14, '18), Transactions on Computational Intelligence and AI in Games ('14,'15,'17), Sensors ('17).

- Instructor, Game Theory, new graduate course at FIU (2017), www.bestgametheoryclass.com.
- Instructor, Artificial Intelligence, new undergraduate course at FIU, www.ultimateaiclass.com.

#### Mentoring

- Farzana Yusuf, PhD student at FIU, 9/2016–present. Areas: artificial intelligence, machine learning.
- Sheila Alemany, Undergraduate CS student at FIU, 9/17–present. Area: artificial intelligence. - Finalist for CRA Outstanding Undergraduate Research Award.
- Worked with Princeton undergraduate student Bradley Snider on his thesis in mathematics (2017).
- Working with Stanford mathematics PhD student Qingyun Sun on opponent exploitation algorithms.
- Working with Harbin Institute of Technology MS student Kailiang Hu on game-theoretic algorithms.