

# MIT Pokerbots 2017



# Resources and Contact Info

Piazza – [piazza.com/mit/spring2017/6176](https://piazza.com/mit/spring2017/6176)

Website – [mitpokerbots.com](http://mitpokerbots.com)

Email – [pokerbots@mit.edu](mailto:pokerbots@mit.edu)



# Eligibility and Grading

- Register for 6.176 (6 units P/F or as a Listener) on WebSIS
- The IAP tournament is restricted to MIT students and cross-registered students from other universities
- To pass:
  - Submit a 2 page strategy report by the end of IAP
  - Submit your resume on our website (sponsors review resumes as they come in)
  - Enter your bot to both our mini and final tournament

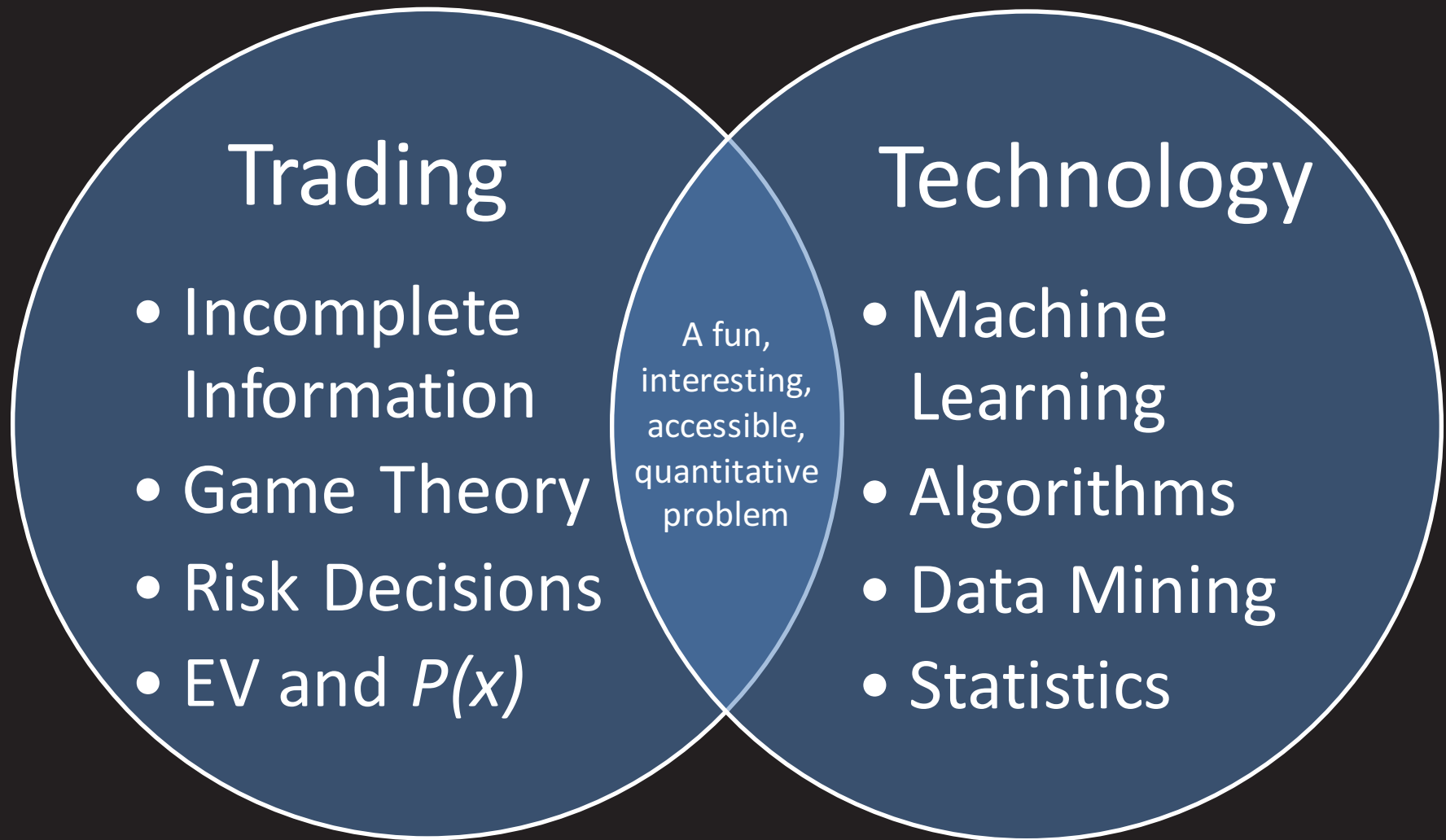


# Lectures and Office Hours

- E25-111 on WF from 4-5pm for the first two weeks of IAP
- Office Hours 3-5 on MR location TBD
- Lecture 1 is an introduction of the class and will feature Kevin Pang from Jump Trading. He was one of the founders of Pokerbots
- Lecture 2-3 will go more in-depth of the Pokerbot variation along with general poker strategy and explain the software
- Lecture 4 will be a guest lecture from Citadel



# Pokerbots in a Nutshell...



# Our Goals

- Challenge you to combine programming ability and highly quantitative thinking
- Connect you with prestigious trading and tech sponsors looking for talent



# Sponsors



# The Challenge

- Conquer your opponents in...

## Heads-up No-Limit Hold 'em With Discards





# The Challenge

- Heads-up: Play against one person at a time



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- No-Limit: Your bet sizes can go up to your entire stack size.



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- No-Limit: Your bet sizes can go up to your entire stack size.
- Discards: After the flop(the street where 3 cards are laid down) and the turn(where the 4<sup>th</sup> card is laid down), each player has the option to discard one of their two cards and draw another card.



# The Challenge

- Heads-up: Play against one person at a time
- No-Limit: Your bet sizes can go up to your entire stack size.
- Discards: After the flop(the street where 3 cards are laid down) and the turn(when the 4<sup>th</sup> card is laid down), each player has the option to discard one of their two cards and draw another card.
- Cash Games: Bots ranked by final chips count



# Logistics

- Check out [mitpokerbots.com/docs](http://mitpokerbots.com/docs) for detailed documentation
- Post a note on Piazza if you can't request a password on [mitpokerbots.com](http://mitpokerbots.com) by midnight tonight



# Final Competition

- The Final Competition will take place in on 2/6 from 6-8pm in room 10-250
- Gold and Platinum sponsors will be present
- Deadline for submitting your bot is 2/3
- Newbie teams will compete in an additional event (teams composed entirely of freshmen or sophomores with limited experience)
- Make sure to submit a bot to both events!



# Prize Pool

- Over \$40,000!
- Distribution will be announced when we have a more accurate idea of participation
- Lots of opportunities to win
  - We will reward creativity, effort, and excellence



# Next Lecture

- We will talk more in-depth about how no limit hold 'em works and how the discard functionality will change the game.
- We will go over downloading the game engine and getting setup to start development.





# Guest Lecture

- Kevin Pang
  - Algorithmic Trader at Jump Trading
  - Founder of Pokerbots
  - MIT B.S. Course 14 '11





# jump trading

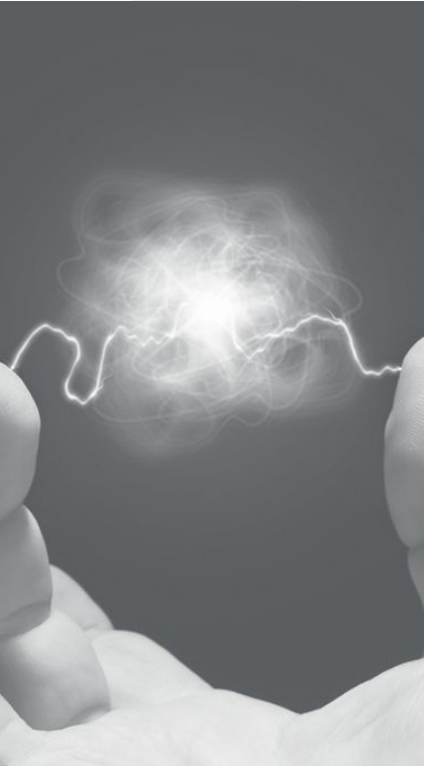
**MIT POKERBOTS 2017**

01.11.2017





# JUMP TRADING



**ESTABLISHED**  
2000



**HEADQUARTERS**  
CHICAGO, IL



**EMPLOYEES**  
550+



**LOCATIONS**  
CHICAGO, NEW YORK,  
CHAMPAIGN,  
LONDON, SINGAPORE



**WHAT WE TRADE**  
FUTURES, CASH  
(EQUITIES, FX,  
TREASURIES), OPTIONS



**EXCHANGES**  
75+ IN AMERICAS,  
ASIA, EUROPE AND  
AUSTRALIA



# JUMP CULTURE

- Small, dynamic and fast-paced teams
- Flat organizational structure
- Diverse trading community and strategies
- Shared core infrastructure and software
- Casual atmosphere





**HQ**  
**CHICAGO**

600 West Chicago  
Chicago, IL 60654  
p: 312.205.8900

**CHAMPAIGN**

2100 S. Oak Street  
Champaign, IL 61820  
p: 312.205.8900

**NEW YORK**

15 East 26th Street  
New York, NY 10010  
p: 646.843.7400

**LONDON**

One London Wall  
London EC2Y 5EA  
p: 44.207.382.4350

**SINGAPORE**

8 Marina View  
Asia Square Tower 1, #38-01  
Singapore 018960  
p: 65.6240.6266



# Kevin Pang

MIT '11

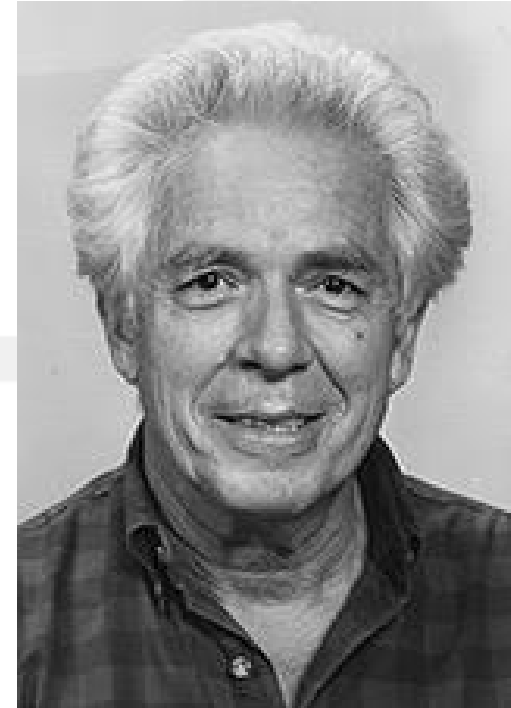
Pokerbots Co-Founder

# Overview

- Mathematically formalizing poker
- Nash Equilibrium
- Counterfactual Regret Minimization
- State of the art bots (Cepheus, Claudico, Libratus, DeepStack)
-

# Kuhn Poker

- Stack size: 2 chips
- Ante: 1 chip
- 3 card deck {A, K, Q}
- Button cannot bet
- 

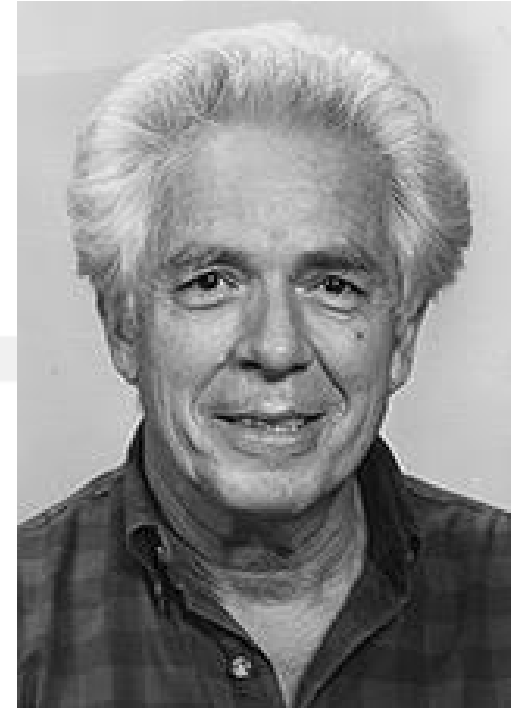


Harold Kuhn  
1925-2014



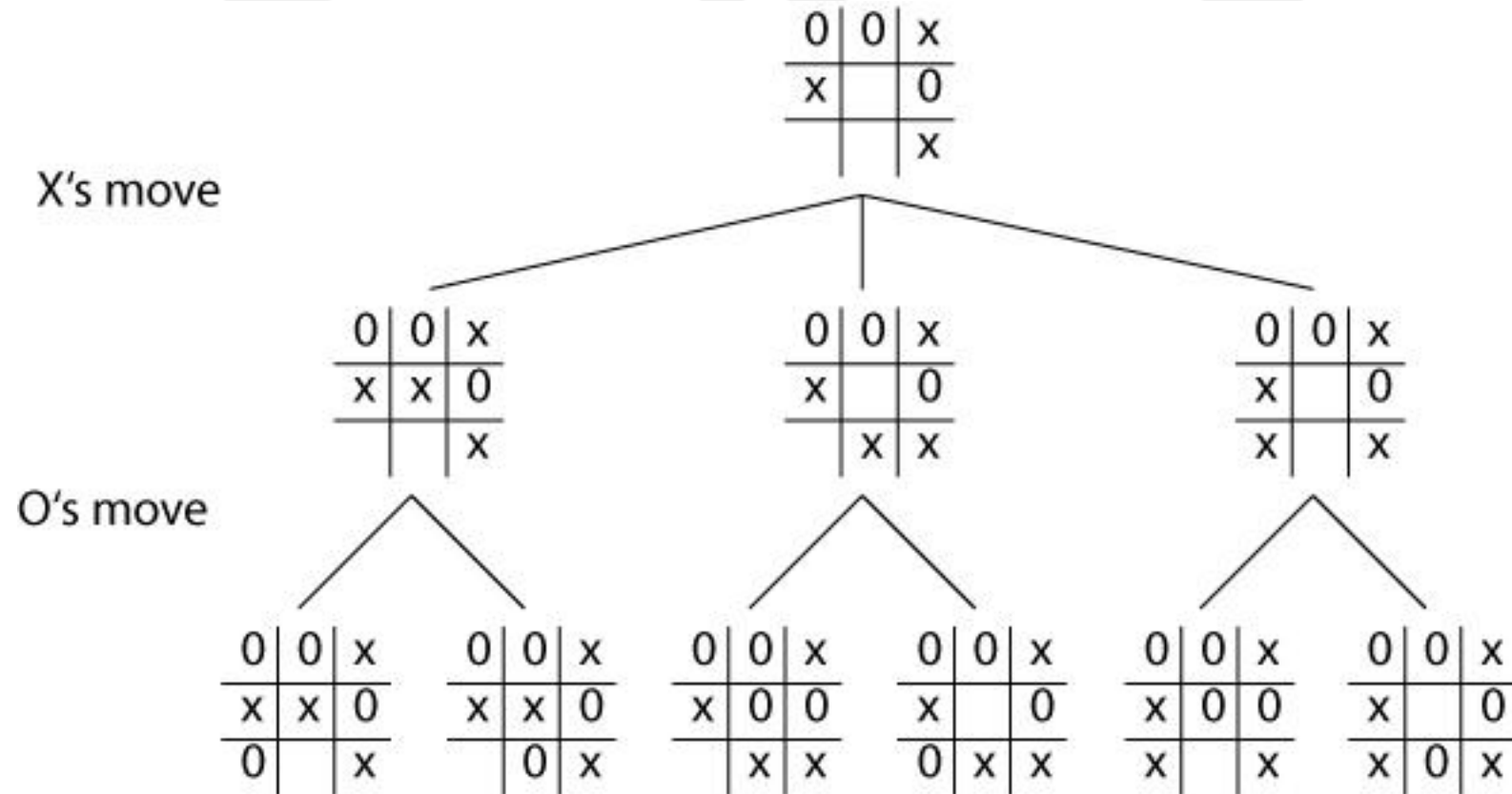
# Kuhn Poker

- Stack size: 2 chips
- Ante: 1 chip
- 3 card deck {A, K, Q}
- Button cannot bet
- A: always bet, always call
- K: never bet, sometimes call
- Q: sometimes bet, never call

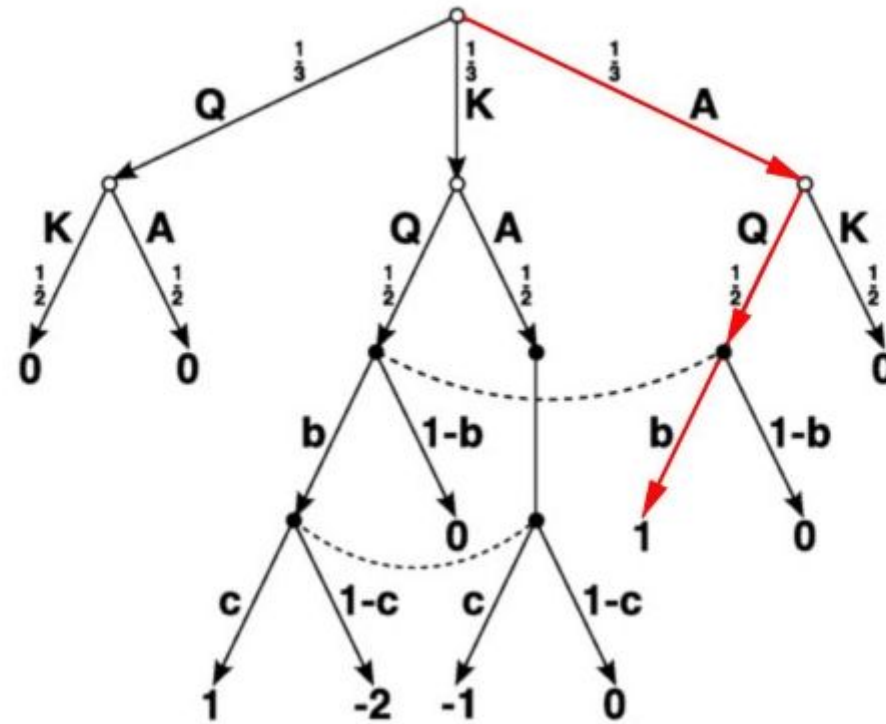


Harold Kuhn  
1925-2014

# Perfect Information Games



# Imperfect Information Games



# Poker Abstractified

- **Information set:** set of game states that are indistinguishable from player i's point of view
- **Poker:**
  - Game tree with information sets
  - Leaf nodes have associated payouts
  - Each player seeks to maximize their expected payout

# Strategies

- Finite set of information sets,  $I$
- Finite set of possible actions,  $A$
- $P(A)$ : set of probability distributions over  $A$
- **Strategy**: function mapping  $I$  to  $P(A)$

# Normal form

- $\min_x \max_y xAy$
- $A$ : payout matrix (encodes poker rules)
- $x, y$ : strategies represented by probabilities of individual moves

# Normal form

- $\min_x \max_y xAy$
- $A$ : payout matrix (encodes poker rules)
- $x, y$ : strategies represented by probabilities of individual moves
- Problem:  $A$  is exponential in game tree size

# Sequence form

- $\min_x \max_y xAy$
- $A$ : payout matrix (encodes poker rules)
- $x, y$ : strategies represented by probabilities of **sequences of moves**
- Avoids exponential blow-up!
- Koller et al [1994]



# Solving optimization problem

- Reduce size by merging similar information states
- Two approaches to solve optimization:
  - Linear programming
  - Counterfactual regret minimization (Johanson et al. [2007])

# Counterfactual Regret Minimization (CFR)

- Initialize strategy  $x$  randomly
- Play  $x$  against itself
- For each node of game tree, compare what  $x$  did, against what  $x$  **should** have done.
- Update  $x$  based on difference

# Counterfactual Regret Minimization (CFR)

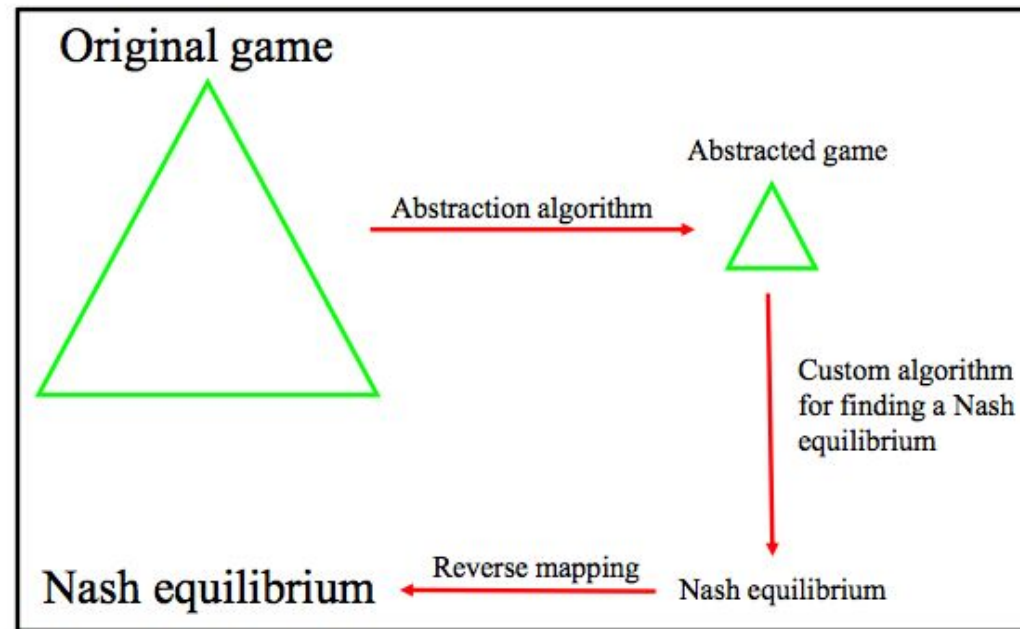
- Generates sequence of strategies  $x_1, x_2, \dots$
- Provably converges to Nash Equilibrium!
- Small memory requirement, parallelizable

# Fixed Limit Hold'em (FLHE)

- About  $3.2e14$  information sets
- Brute force with hardware + time + coding skillz
- 2008: bots defeat best humans
- 2015: FLHE “weakly solved” (Cepheus)

# No Limit Hold'em (NLHE)

- $\sim 1.0e50$  information sets for 100BB stacks
- Information sets must be merged



# Abstraction

- **Hand bucketing**
  - “on AhKcQd board, 22 and 33 can be treated as the same hand”
- **Action translation**
  - “a \$49 bet into a \$100 pot can be treated the same as a \$50 bet”
  - Bet sizes:  $\{\frac{1}{4} \text{ pot}, \frac{1}{2} \text{ pot}, \text{pot}, 3x, \text{all-in}\}$

# Action Translation

- Difference between **actual** pot size and **abstract** (implicit) pot size can diverge
- Alberta guys tried to use bet sizes that would correct for divergence
- Claudico, on the river, would:
  - Recalibrate its view of pot size
  - Perform expensive Nash Equilibrium approximation on subtree (~2 minutes)

# Existing Literature

- Cepheus
  - <http://science.sciencemag.org/content/347/6218/145.full.pdf>
- Claudico
  - <https://www.cs.cmu.edu/~sganzfri/Claudico15.pdf>
- DeepStack
  - <https://arxiv.org/pdf/1701.01724v1.pdf>