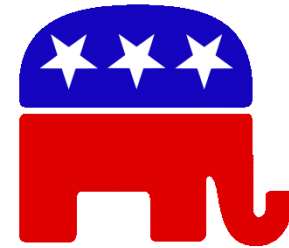


# Voronoi Choice Games

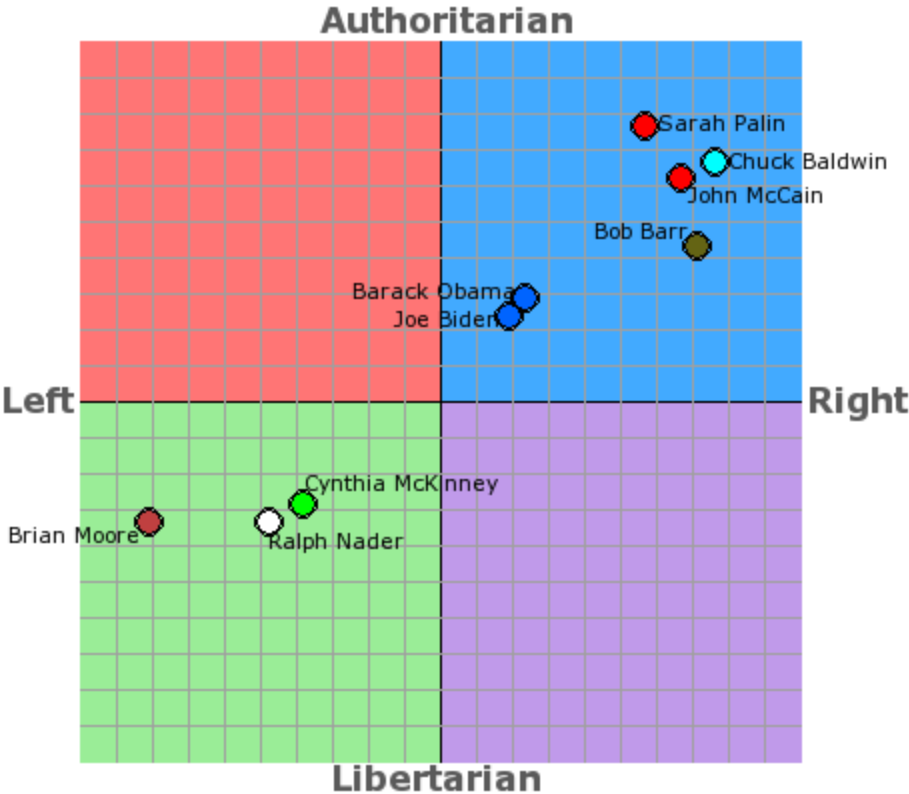
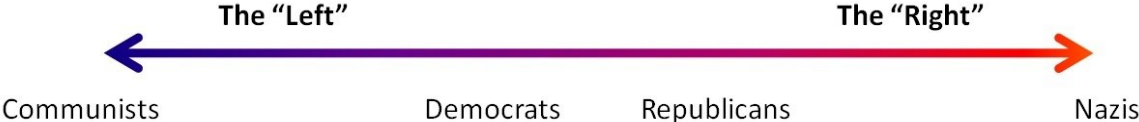
Meena Boppana, Rani Hod, Michael  
Mitzenmacher, Tom Morgan

7/12/16

# Political Candidate Selection

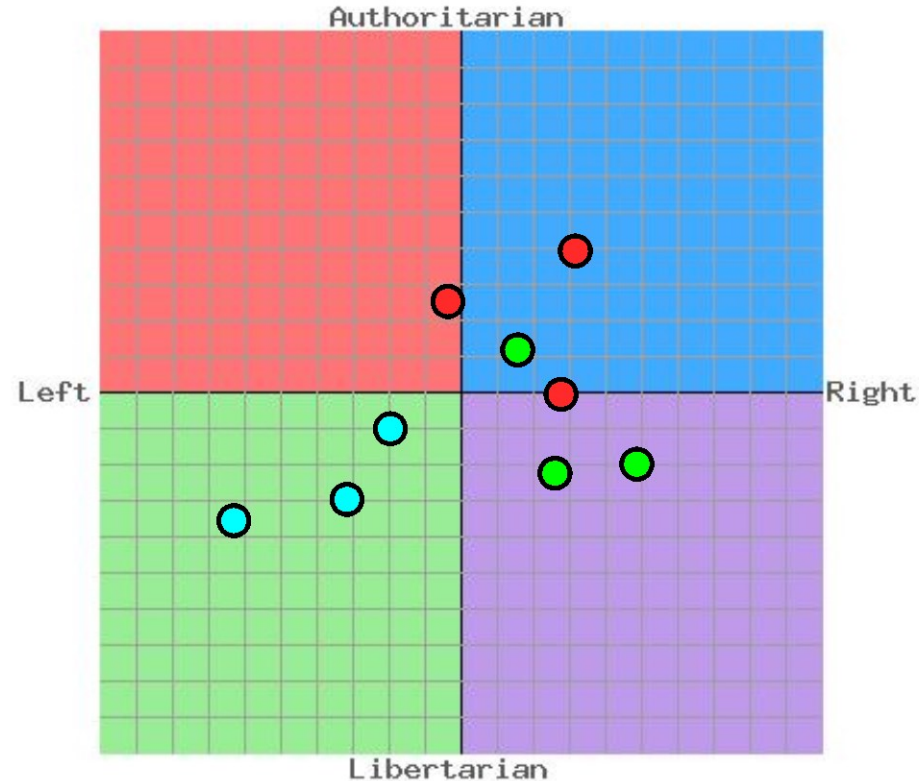


# Political Positions



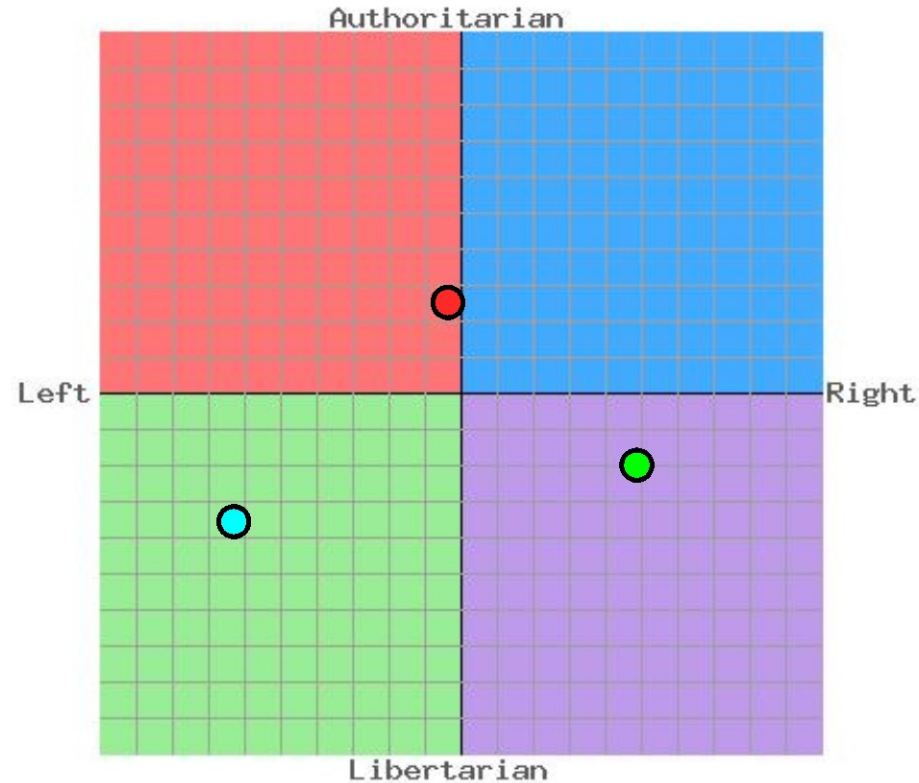
# Candidates Selection Game

- Political candidate selection
  - $n$  parties, each with a separate pool of candidates
  - Simultaneously pick candidates so as to maximize votes



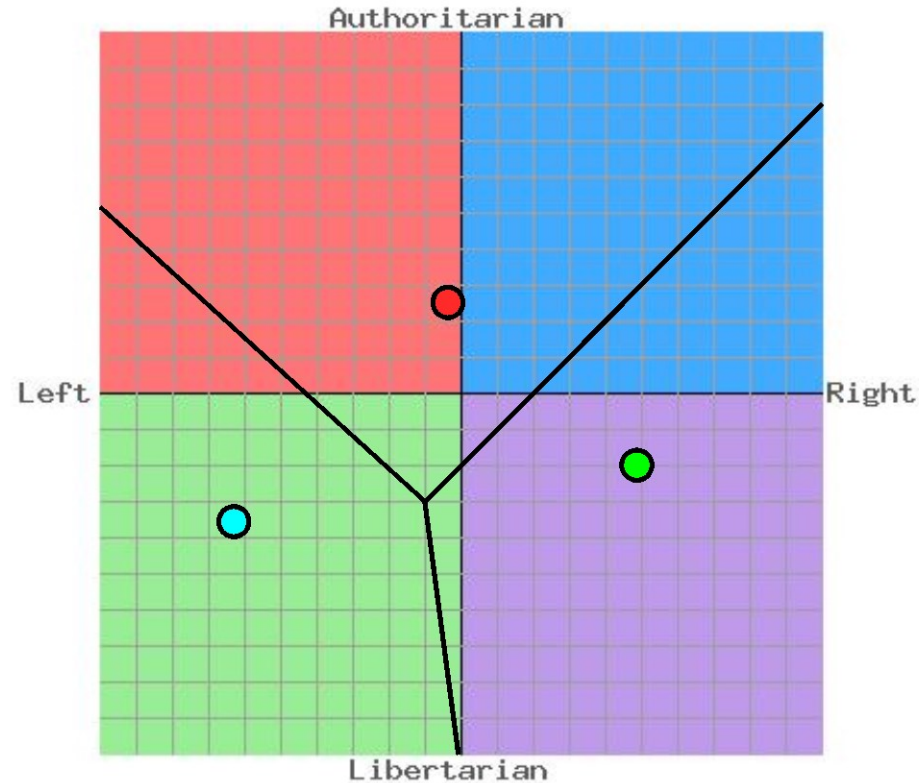
# Candidates Selection Game

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# Candidates Selection Game

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# Models

- **k-D Voronoi Choice Game**
  - **k** dimensional unit torus
  - **n** players
  - Each player has **m** (small constant) points
  - Each player simultaneously picks a point
  - Utility = area of point's cell in Voronoi diagram
- **One Way 1-D Voronoi Choice Game**
  - Utility = distance to next point clockwise

# Related Games

- Voronoi Games
  - Two player
  - Unconstrained choices
  - Sequential games
- Hotelling Games
  - AKA competitive location games
  - Sometimes limited choices, but always symmetric
  - On line or graph
- Main difference with our model: **player asymmetry**



# Summary of Results

- Proof of existence of pure Nash equilibria for the 1-D Voronoi Choice Game
- NP-hardness of pure Nash equilibria in One Way 1-D Voronoi Choice Game
- Strong bounds on the expected number of pure Nash equilibria in random versions of the One Way 1-D Voronoi Choice Game
- Polytime algorithm for finding correlated equilibria in all 1-3 dimensional versions of the game

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- Proof of existence of pure Nash equilibria for the 1-D Voronoi Choice Game
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- **Polytime algorithm for finding correlated equilibria in all 1-3 dimensional versions of the game**

# Random Pure Nash Equilibria

- Model: One Way 1-D (n players, m choices each)
- Each player's points are **independently** chosen **uniformly** at random
- Motivation: “power of choice” in load balancing
- The expected number of PNE in the One Way 1-D Voronoi Choice Game is in  $[\cdot 19^{m-1} m, m]$ 
  - Small constant (for small m), no dependence on n

# Random Pure Nash Equilibria

A player's point **choice** is **stable** in a configuration if they won't deviate from it

A circle **arc** is **stable** if the point that starts it is stable

$$E[\# \text{ PNE}] = m^n \Pr[\text{first choices are stable}]$$

$$= m^n E[\Pr[\text{first choices are stable} \mid \text{positions of first choices}]]$$

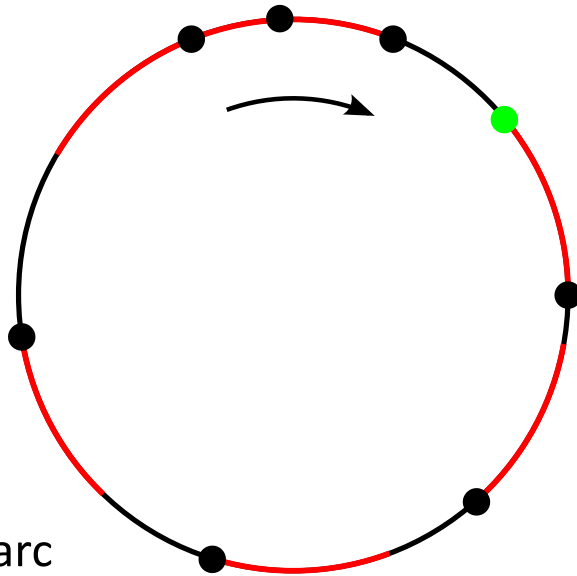
$$= m^n E\left[\prod_{i=1}^n \Pr[\text{ith player is stable} \mid \text{positions of first choices}]\right]$$

$$= m^n E\left[\prod_{i=1}^n \Pr[\text{ith smallest arc is stable} \mid \text{positions of first choices}]\right]$$

# Random Pure Nash Equilibria

Pr[ith smallest arc is stable | positions of first choices]?

Red are regions which green player would not deviate to



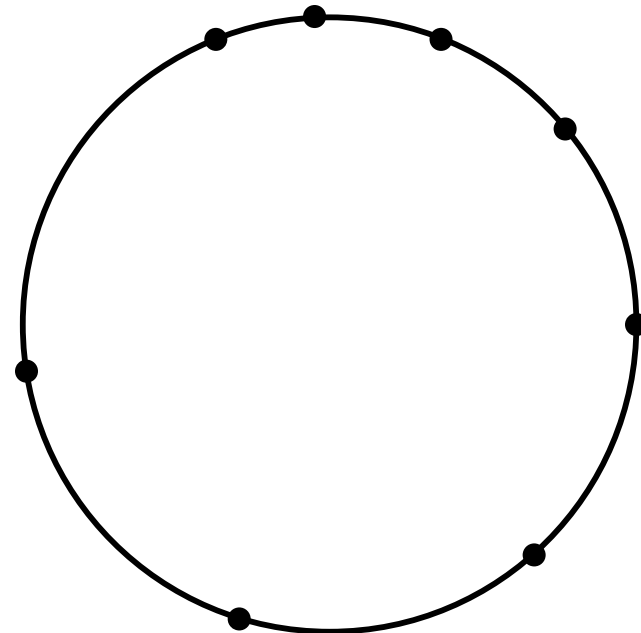
$A_i$  = length of the  $i$ th smallest arc

Pr[ith smallest arc is stable | positions of first choices]

$$= \left( (n - i)A_i + \sum_{j=1}^i A_j - \min(A_i, \text{length of arc before } i) \right)^{m-1}$$

# Random Pure Nash Equilibria

- Now a question about the lengths of **random arcs on circles**
- Distance between points is **exponentially distributed**
- Take order statistics of those exponentials



- Length of  $i$ th smallest arc  $A_i \sim \frac{1}{S_n} \left( \frac{X_n}{n} + \frac{X_{n-1}}{n-1} + \dots + \frac{X_{n-i+1}}{n-i+1} \right)$
- $X_j$  are i.i.d. exponential random vars with mean 1
- $S_j = X_1 + \dots + X_j$

# Random Pure Nash Equilibria

- Pr[ith smallest arc is stable | positions of first choices]

$$= \left( (n - i)A_i + \sum_{j=1}^i A_j - \min(A_i, \text{length of arc before } i) \right)^{m-1}$$

$$\in \left[ \left( \frac{S_i}{S_n} - A_i \right)^{m-1}, \left( \frac{S_i}{S_n} \right)^{m-1} \right]$$

- $E[\# \text{ PNE}] \leq m^n E \left[ \prod_{i=1}^n \left( \frac{S_i}{S_n} \right)^{m-1} \right] = m$
- $S_n, \left( \frac{S_1}{S_2} \right), \left( \frac{S_2}{S_3} \right), \dots, \left( \frac{S_{n-1}}{S_n} \right)$  are independent

- $E[\# \text{ PNE}] \geq m^n E \left[ \prod_{i=1}^n \left( \frac{S_i}{S_n} - A_i \right)^{m-1} \right]$   
 $\geq m^n E \left[ \prod_{i=1}^n \left( \frac{c_i S_i}{S_n} \right)^{m-1} \right] \geq .19^{m-1} m$

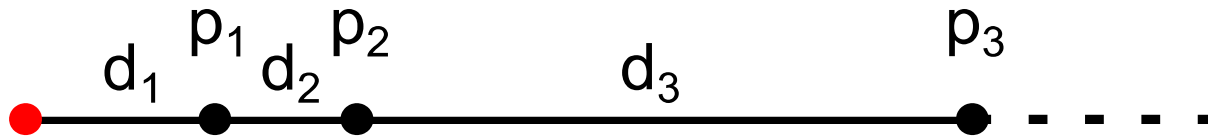
# Correlated Equilibria

- A **correlated equilibrium** (CE) is a generalization of Nash equilibrium to allow player strategies to be correlated
- (Papadimitriou & Roughgarden, 2008) and (Jiang & Leyton-Brown, 2013) developed polytime algorithm for CE in games of **polynomial-type**
- Requires a polytime oracle for computing the **expected utility** given a **product distribution** over strategies (each player is independent)



# 1D Correlated Equilibria

- **Goal:** compute the expected utility over a product distribution for 1-D Voronoi Choice Games
- For each player point, compute the expected distance from that point to the next chosen point in each direction
- Sort the points and iterate through them in order, computing the probability that each point is the first chosen point

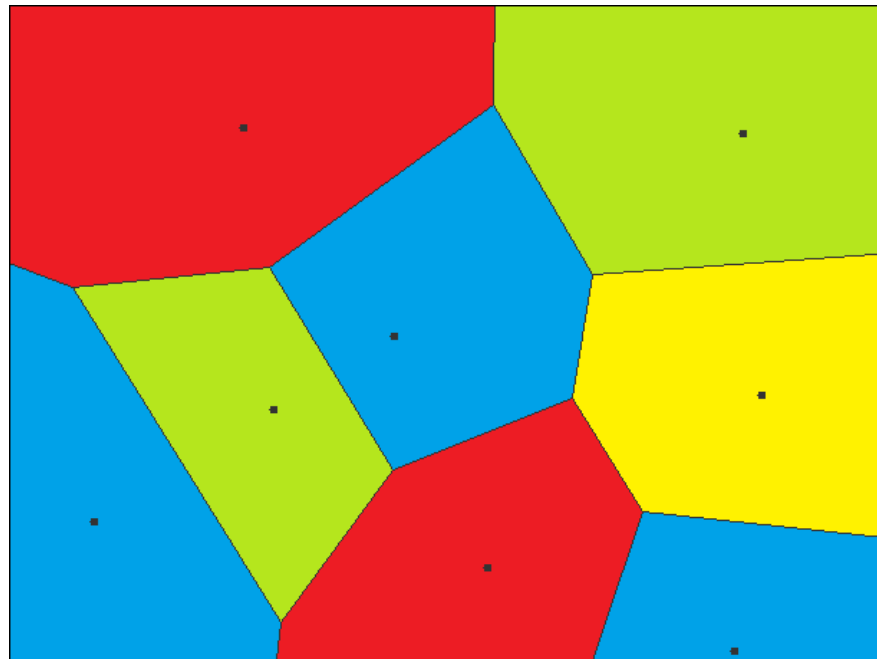


$$E[\text{right dist}] = p_1 d_1 + (1-p_1)p_2 d_2 + (1-p_1)(1-p_2)p_3 d_3 + \dots$$

- Stop once we reach a player's last point

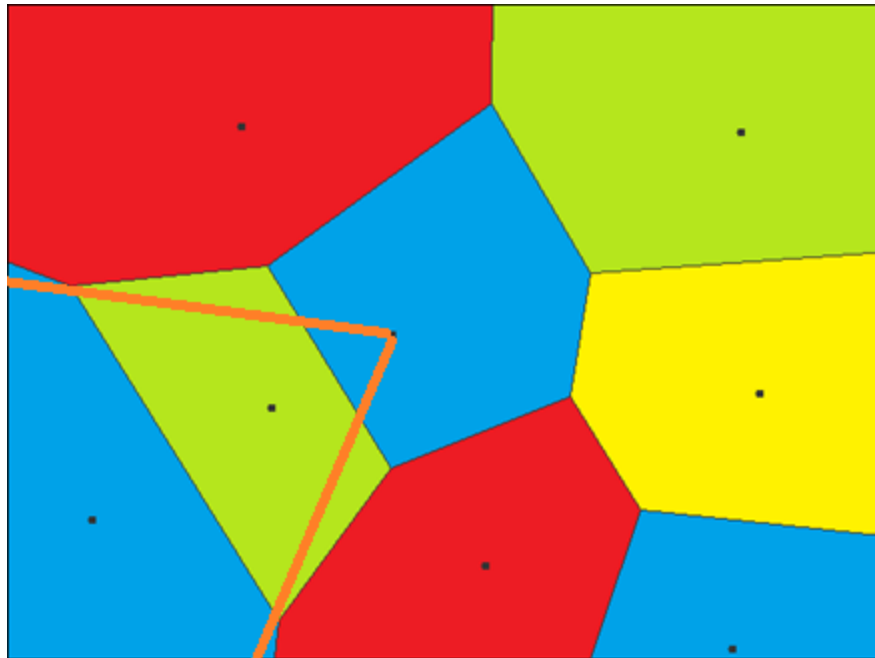
# 2D Correlated Equilibria

- What about 2D?
- A given Voronoi cell can be bounded by many other players' points



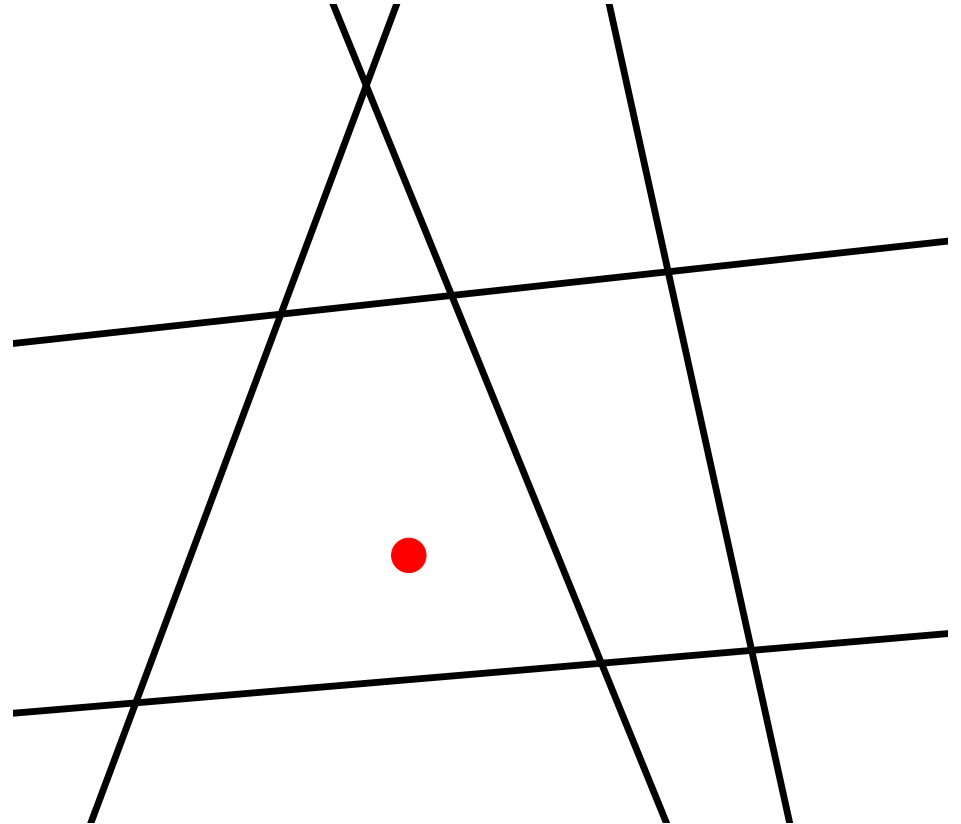
# 2D Correlated Equilibria

- **Idea:** partition space into regions where the 1D strategy works



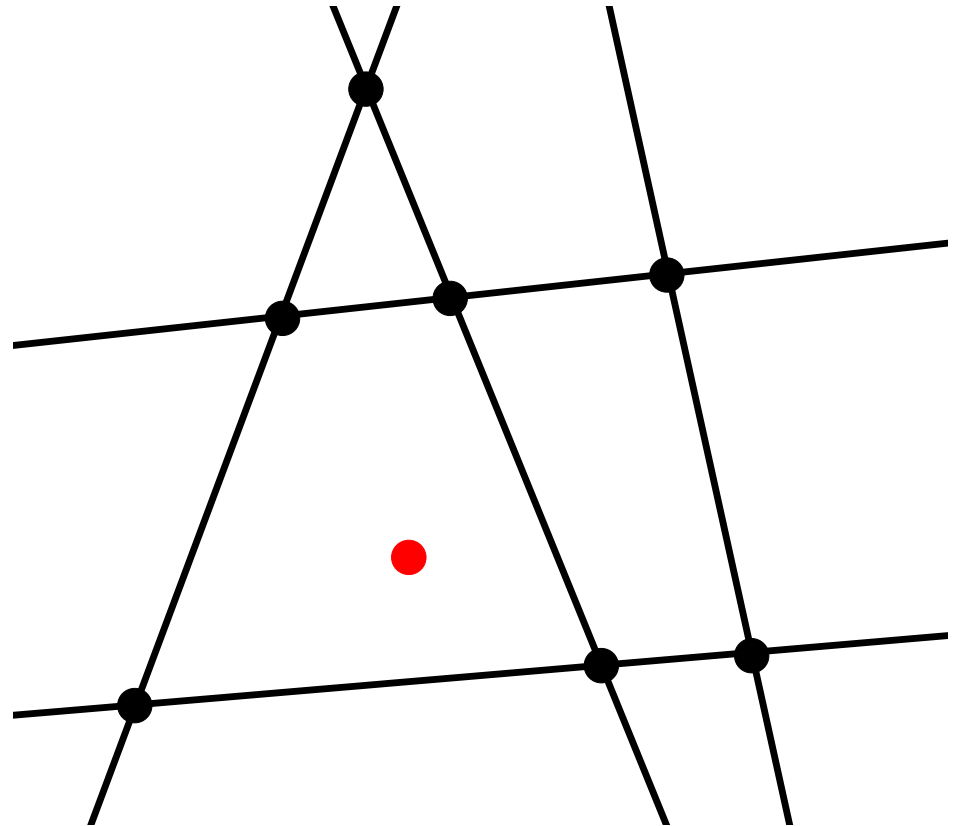
# 2D Correlated Equilibria

- Compute the expected utility of a given point:
  - Each other point yields a boundary line



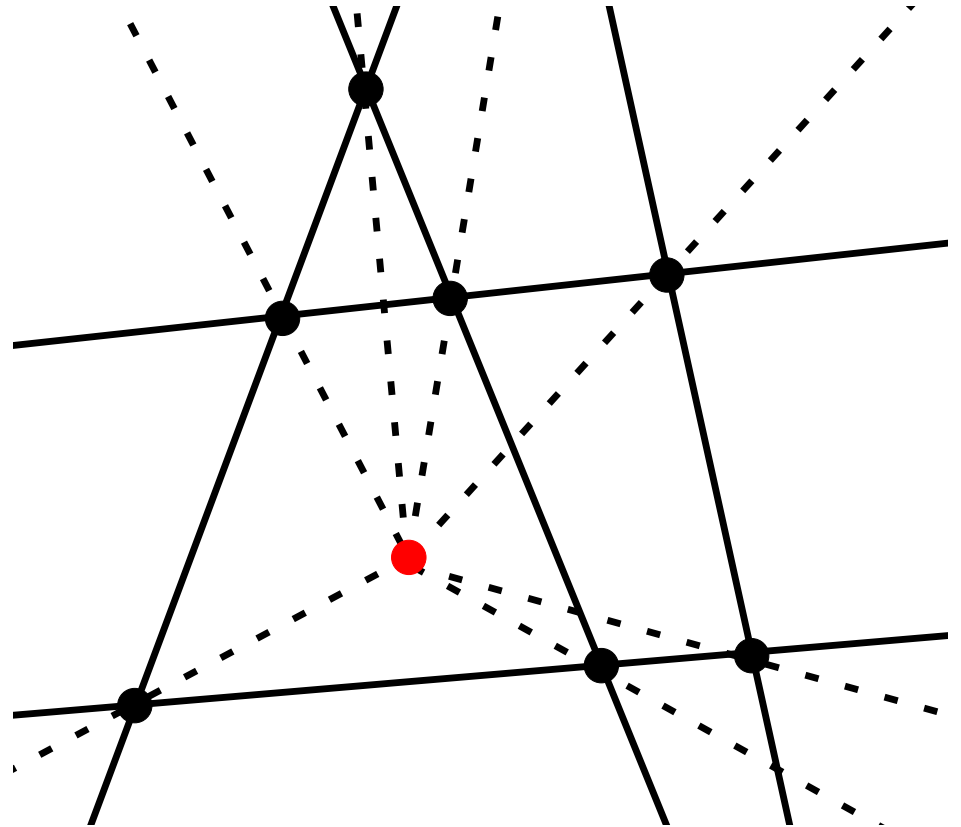
# 2D Correlated Equilibria

- Compute the expected utility of a given point:
  - Each other point yields a boundary line
  - Compute all intersections between boundary lines



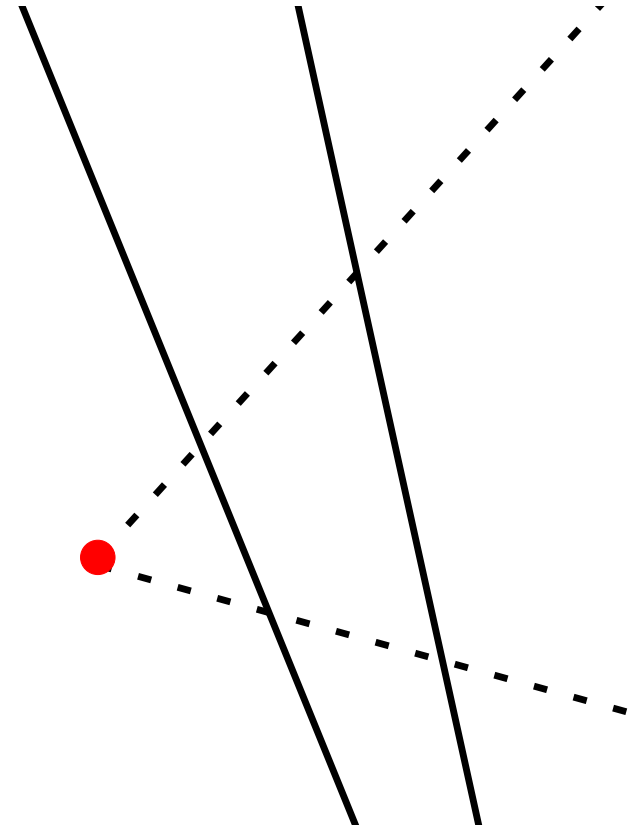
# 2D Correlated Equilibria

- Compute the expected utility of a given point:
  - Each other point yields a boundary line
  - Compute all intersections between boundary lines
  - Sort those points by angle
  - Decompose area into regions in between angles



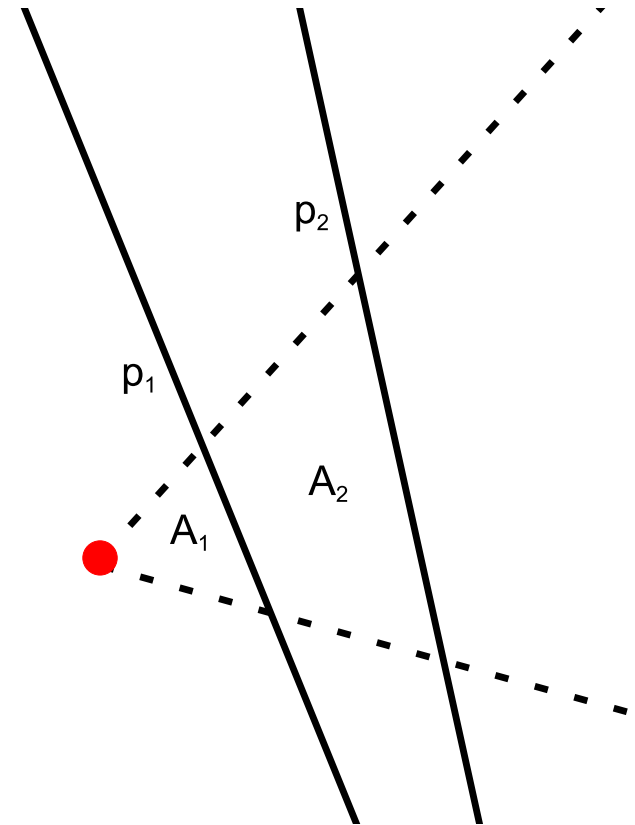
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# 2D Correlated Equilibria

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  - Each other point yields a boundary line
  - Compute all intersections between boundary lines
  - Sort those points by angle
  - Decompose area into regions in between angles
  - In each region iterate through boundary lines as in 1D



$$E[\text{area in region}] = p_1 A_1 + (1-p_1)p_2 A_2 + \dots$$



# 2D Correlated Equilibria

- Time =  $O(n^3 \log n)$ 
  - $O(n)$  boundary lines  $\rightarrow O(n^2)$  regions
  - $O(n \log n)$  time per region to sort lines and iterate
- Can reduce to  $O(n^3)$  by not resorting each time
  - Only one swap between adjacent regions
- Same basic principles get us  $O(n^5 \log n)$  in 3D

# Open Questions

- Probability of any PNE in random model?
- Correlated equilibria in 4D+?
- What about mixed Nash equilibria?
- Sequential versions of these games?

**Thank You**