

# Simple Stochastic Games and Propositional Proof Systems

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# Proof Complexity

A **propositional proof system** is a polynomial-time onto function  $S : \{0,1\}^* \rightarrow \text{UNSAT}$

Intuitively,  $S$  maps (encodings of) proofs to (encodings of) unsatisfiable formulas.

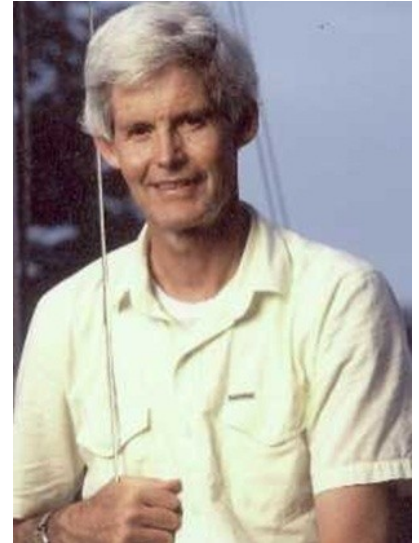
$S$  is **polynomially bounded** if for every unsatisfiable  $f$ , there exists a string (proof)  $a$ ,  $|a| = \text{poly}(|f|)$ , and  $S(a)=f$ .

# Cook's Program

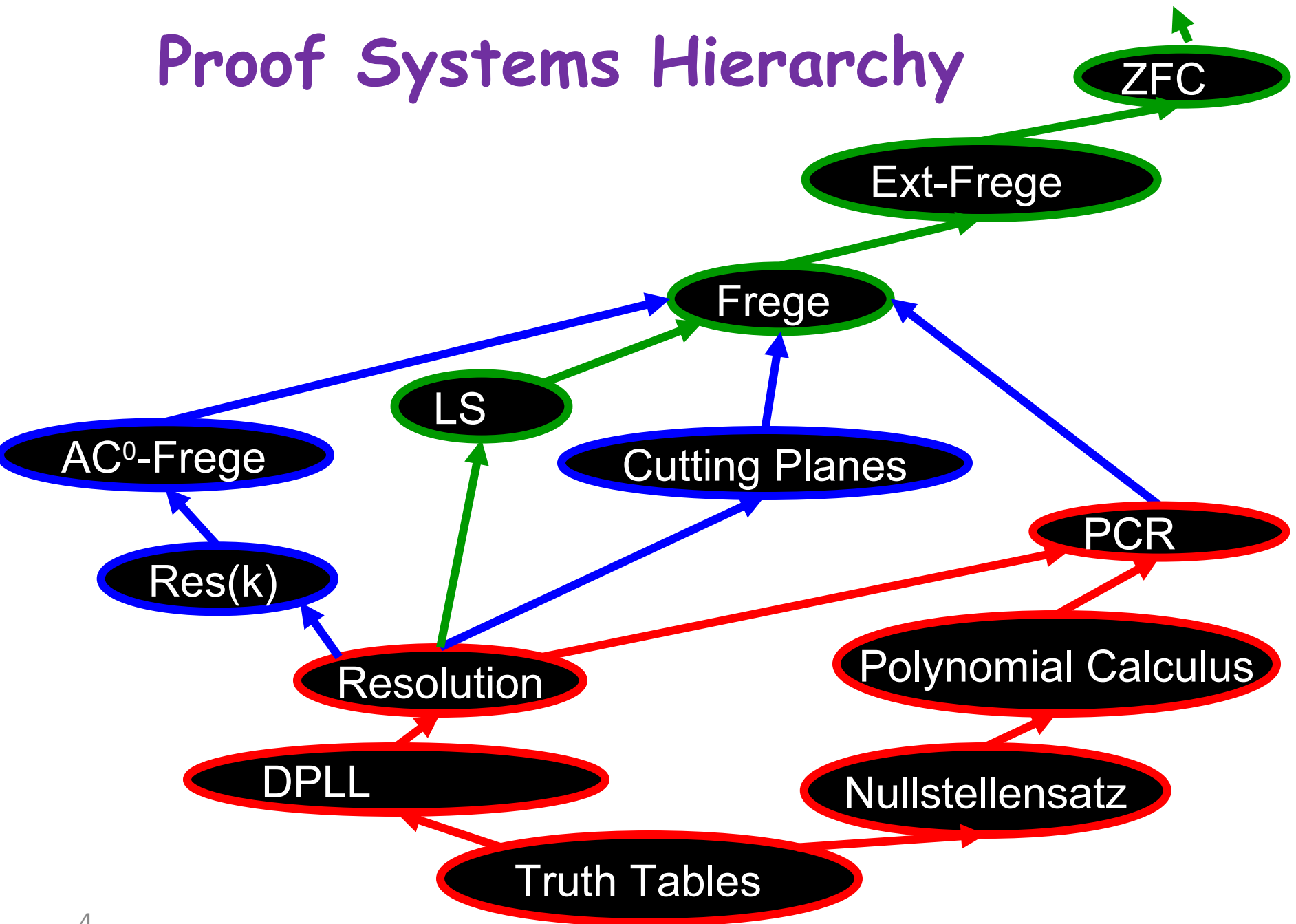
Theorem. [Cook, Reckhow]

$NP = coNP$  iff there  
exists a polynomially  
bounded proof system.

Prove lower bounds for  
increasingly more  
powerful proof systems



# Proof Systems Hierarchy



# Main Lower Bound Tool: Feasible Interpolation

**Main Idea:** Associate a search problem,  $\text{Search}(f)$  with  $f$ .  
Show that a short refutation of  $f$  implies  $\text{Search}(f)$  is easy.

**Interpolation statement:**  $f = A(p,q) \wedge B(p,r)$

**$\text{Search}(f)[a]$ :** Given an assignment  $p=a$ , determine if  $A$  or  $B$  is UNSAT.

Proof system  $S$  has **(monotone) feasible interpolation** if there is a (monotone) interpolant circuit for  $(A \wedge B)$  of size  $\text{poly}(\text{size of the shortest } S\text{-proof of } A \wedge B)$ .

**Feasible interpolation property implies superpolynomial lower bounds (for  $S$ ).**

# Feasible Interpolation :

## Important interpolant formulas

**Example 1.** [Clique-coclique examples] Lower bounds for Res, CP

$A(p,q)$  :  $q$  is a  $k$ -clique in graph  $p$

$B(p,r)$  :  $r$  is a  $(k-1)$ -coloring of graph  $p$

**Example 2.** [Reflection principle for  $S$ ] Complete formulas for  $S$

$A(p,q)$ :  $q$  is a satisfying assignment for  $p$

$B(p,r)$  :  $r$  is a polysized  $S$ -proof of  $p$

**Example 3.** [ $SAT \not\subseteq P/poly$ ] Independence of lower bounds

$A(p,q)$ :  $q$  codes a polysized circuit for  $p$

$B(p,r)$ :  $r$  codes a polysized circuit for  $p \oplus SAT$

# Feasible Interpolation and Automatizability

$S$  is **automatizable** if there exists an algorithm  $A$  such that:  
for all unsat  $f$ ,  $A(f)$  returns an  $S$ -refutation of  $f$ , and  
runtime of  $A(f)$  is poly in size of smallest  $S$ -refutation of  $f$ .

$S$  is **weakly automatizable** if there exists a proof system that  
 $p$ -simulates  $S$  and that is automatizable.

Automatizability (for  $S$ ) implies weak automatizability

Weakly automatizability (for  $S$ ) implies feasible interpolation.

# Limitations of Interpolation/Automatizability

Theorem [KP] If one-way functions exist then Extended Frege systems do not have feasible interpolation.

Theorem [BPR] If DH is hard, then any proof system that  $p$ -simulates  $TC_0$ -Frege does not have feasible interpolation.

Theorem  $AC_0(k)$ -Frege does not have feasible interpolation if DH cannot be solved in time  $\exp(n^{2/k})$ .

- Best alg for DH runs in time  $\exp(n^{1/2})$ ; number field sieve conjectured to solve DH in time  $\exp(n^{1/3})$ .
  - Thus feasible interpolation of  $AC_0(k)$ -Frege unresolved for  $k < 5$
  - Even for Resolution, weak automatizability is unresolved.
- [AR]: Resolution not automatizable under FPT assumption.



# Open Problem

- Are low depth Frege systems automatizable?  
Weakly automatizable?
- Problem is in NP intersect coNP
- No evidence one way or the other

# Our Main Result

We connect automatizability/feasible interpolation to the complexity of simple stochastic games (SSG).

## Theorem.

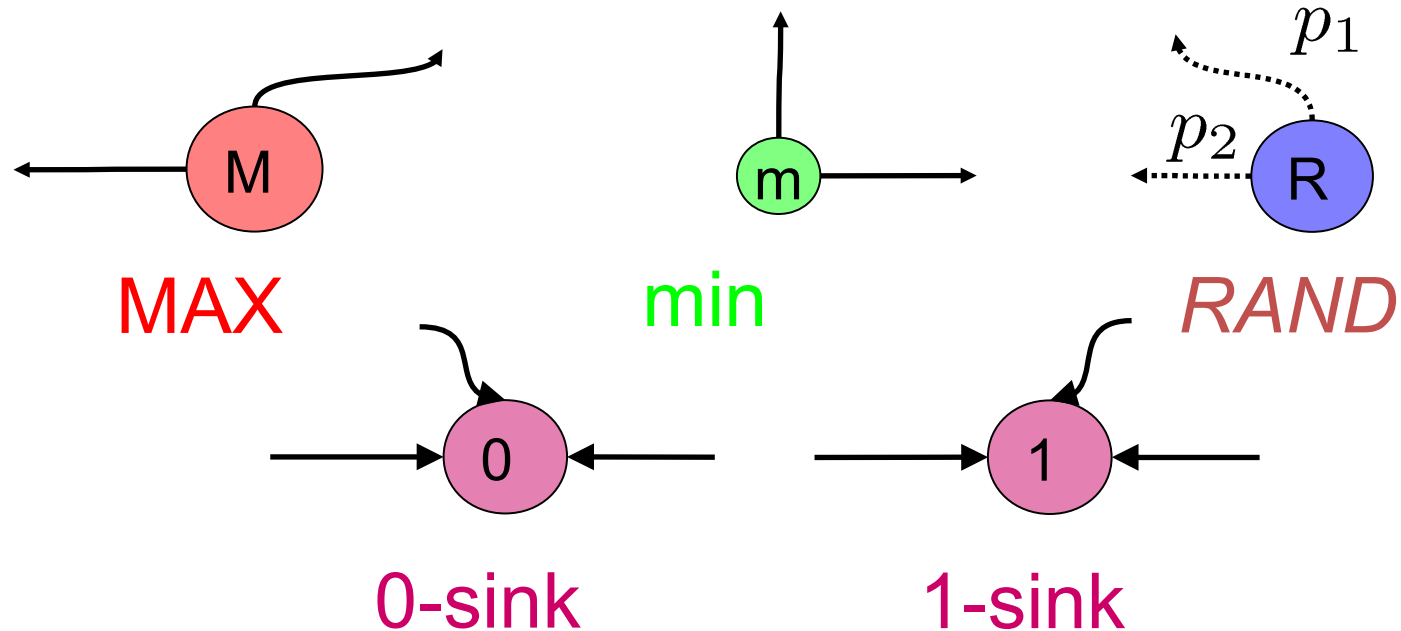
1.  $AC_0(2)$ -Frege+IGOP has feasible interp  $\rightarrow$  SSG in P
2.  $AC_0(3)$ -Frege has feasible interpolation  $\rightarrow$  SSG in P

## Theorem [Atserias, Menerva, 2010]

- $AC_0(2)$ - Frege automatizable  $\rightarrow$  MPG (mean payoff games) in P.
- $AC_0(3)$ - Frege has feasible interpolation  $\rightarrow$  MPG in P.

Our proofs are very different at a high level.

# Simple Stochastic game (SSGs) Reachability version [Condon (1992)]



No weights      **Objective:** Max / Min the  
All prob. are  $\frac{1}{2}$       prob. of getting to the **1-sink**

Usually G is assumed to halt with probability 1

# The SSG Problem

- Given a pair of strategies  $\sigma, \tau$  the value of a node  $v_{\sigma, \tau}(i) = P[\text{reach 1-sink under } \sigma, \tau]$
- Every  $v(i) = \min_{\tau} \max_{\sigma} v_{\sigma, \tau}(i)$  i.e.
- Values  $v(0), \dots, v(n)$  are rational numbers requiring only  $n$  bits  $\exists$
- $\mathbf{v} = \langle v(0), \dots, v(n) \rangle$  is the value vector of  $G$
- Theorem: pure positional strategies (for both Max and Min player) achieving
- Is there a poly-time decision alg for**

# The SSG Problem

**Condon had it right:**

**[Anderson, BroMilterson]:**

**“SSG is polynomially equivalent to essentially all important 2-player zero sum perfect info stochastic games”**

- Minimum stable circuit problem
- Generalized linear complementarity problem
  - Stochastic parity games
  - Stochastic mean payoff games

# The SSG Problem

**[Zwick] Other (non stochastic) games are polynomially reducible to SSGs:**

- Mean payoff games
- Parity games

## Mean Payoff Games:

Two player infinite game on a bipartite graph  $(V_1, V_2, E)$

Edge  $(i, j)$  has payoff  $w_{i,j}$

Player 1 tries to maximize average payoff

# Previous Work

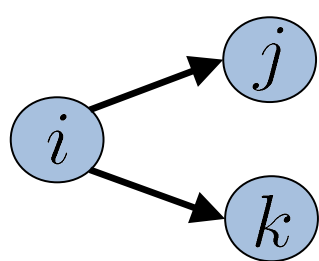
Complexity of SSG decision problem is unresolved:

- SSG decision problem is in  $NP \cap coNP$  [Condon 92]
  - Unlikely to be NP-complete
- SSG restricted to any two node types is in P [Derman72, Condon 92]
- The best known algorithms so far are
  - $Poly(|V_{Rand}|!)$  [Gimbert, Horn 09]
  - $\exp(\sqrt{n})$  [Ludwig 95]
- SSG is in both PLS and PPAD [Juba 05]
  - Unlikely to be a complete problem

# The Complexity of SSGs:

## SSG in $NP \cap coNP$

Any game can be polynomially reduced to a **stopping game** where the values  $v_i$  of the vertices of the stopping game are the **unique** solution to the following equations:


$$v_i = \begin{cases} \max\{v_j, v_k\} & i \in V_{MAX} \\ \min\{v_j, v_k\} & i \in V_{min} \\ \frac{1}{2}(v_j + v_k) & i \in V_{RAND} \end{cases}$$
$$v_{0\text{-sink}} = 0 \quad v_{1\text{-sink}} = 1$$

**Note:** Optimal solution is always stable (satisfies the above equations). For stopping games, stable solution is unique.

**Corollary:** Decision version in  $NP \cap co-NP$



# SSG in PPAD

- Let  $G'$  be stopping game for  $G$
- Best strategy is fixed point for  $I(G')$
- Fixed point for  $I(G')$  in PPAD via Brouwer fixed pt

## SSG in PLS

- PLS graph where vertices are the strategies for max player
- Two strategies neighbors if they differ on one edge
- Local max equals global max
- Local improvement algorithm polytime if discount factor is constant; exponential-time in general

# Our Main Result

We connect the automatizability/feasible interpolation question to the complexity of simple stochastic games

Theorem: depth-2 Frege + IGOP weakly automatizable (or has feasible interp)  $\rightarrow$  SSG in P.

Remark: Since IGOP provable in depth-3 Frege, this implies depth-3 Frege weakly automatizable (or has feasible interpolation)  $\rightarrow$  SSG in P.

# Depth-3 Frege has feasible interpolation implies SSG in P

Given a game  $G$ , construct an equivalent stopping game,  $G'$ .  
For  $G'$ , construct a formula  $F(G') = A(G', v) \wedge B(G', w)$ , where  
A:  $v$  is a stable value vector for  $G'$  with value  $> \frac{1}{2}$   
B:  $w$  is a stable value vector for  $G'$  with value  $\leq \frac{1}{2}$

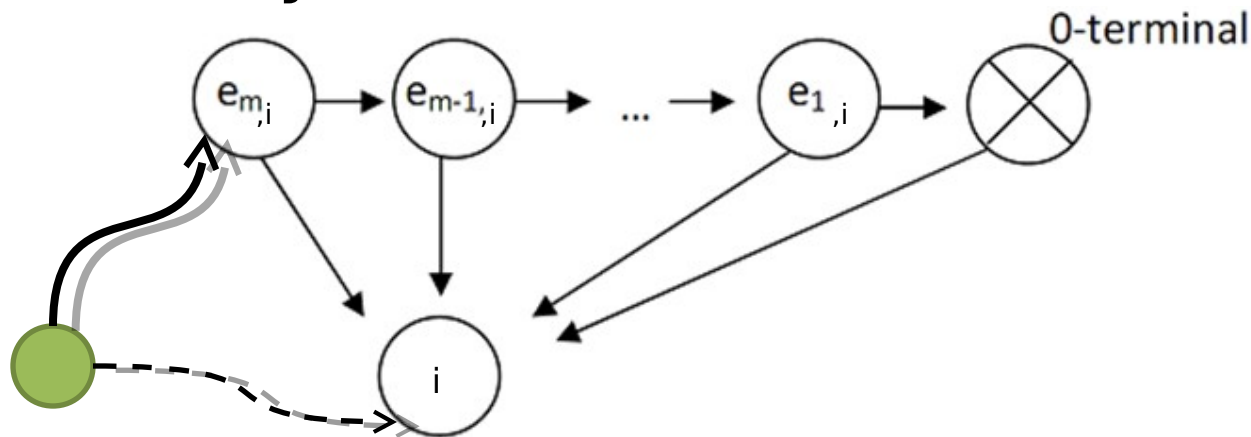
Main Lemma:  $F(G')$  has a polysize depth-3 Frege proof.  
 $F(G')$  has a polysize depth-2 Frege + IGOP proof.

Technical work is to prove uniqueness of stable value vector for stopping game  $G'$ , in low-depth Frege.

Corollary: If depth-3 Frege has feasible interpolation, then SSG in P.

# Reduction and proof of Uniqueness for the Stopping Game

- For every  $G$ , there exists  $G'$  such that  $G'$  has exactly one stable solution

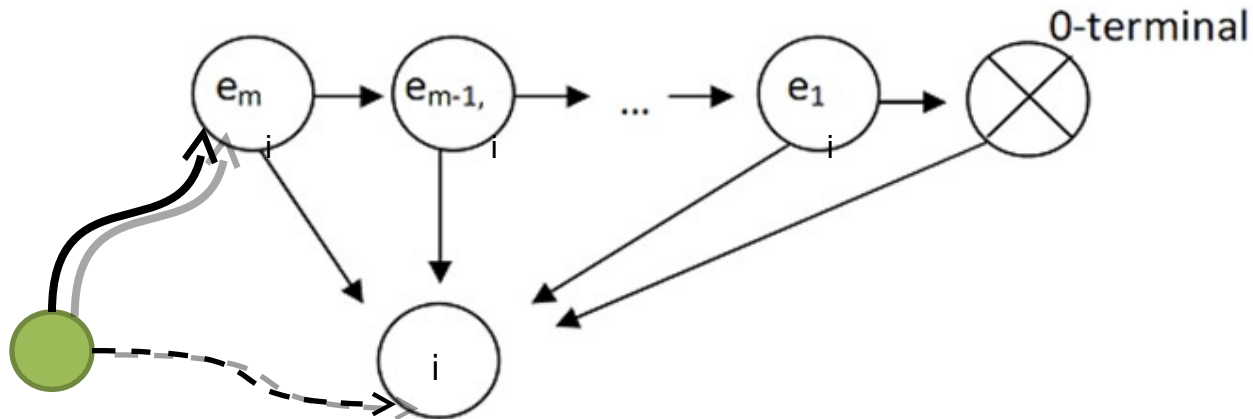


- Every edge into  $i$  is replaced by an edge into  $e_{m,i}$

$$v(e_{m,i}) = (1 - 1/2^m) v(i)$$

- $G$  has value greater than  $1/2$  iff  $G'$  has value greater than  $1/2$ .

# Unique Solution - The Stopping Game



Lemma. For every  $G$ ,  $G'$  has a unique stable solution

Main Idea:  $G'$  adds a discount factor:  $v(e_{m,i}) = (1 - 1/2^m) v(i)$

Let  $v, w$  be two different stable value vectors, and let  $k$  be a node such that  $\Delta(k) = |v(k) - w(k)|$  is locally maximal.

Case I:  $k$  is a max node, pointing to  $i$  and  $j$ .

Suppose  $v(k) = v(e_{m,i})$ ,  $w(k) = w(e_{m,i})$ .

Since  $v(e_{m,i}) = (1 - 1/2^m) v(i)$ ,  $|v(k) - w(k)| = (1 - 1/2^m) |v(i) - w(i)|$   
 thus  $|v(k) - w(k)|$  is not maximal.

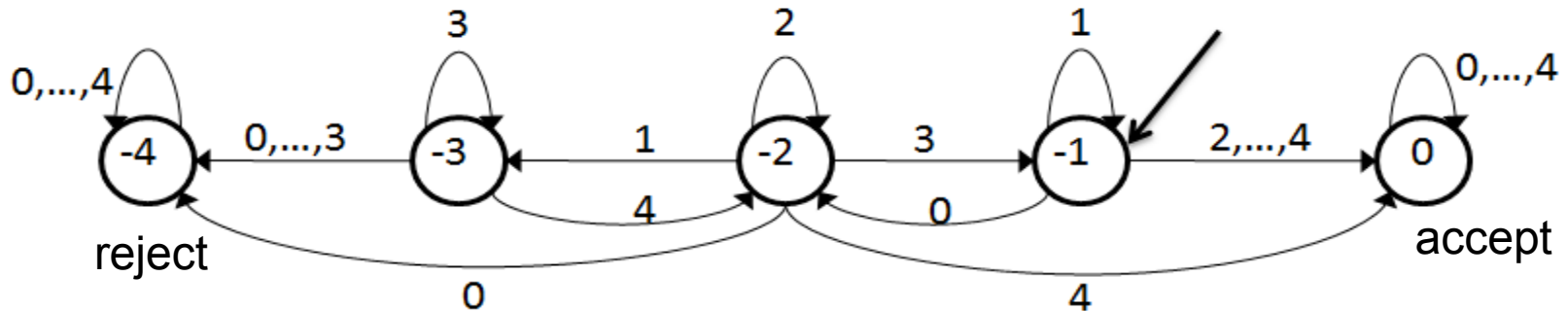
# Main Lemma: Proving Uniqueness with depth-2 Frege proofs

For every stopping game  $G'$  we want to prove that  $G'$  has a unique stable solution

$$\text{ie. } v = I_G(v) \text{ and } x = I_g(x) \rightarrow x = v$$

- Recall  $x(i)$  are rationals of the form  $p/q$  where  $q = O(2^n)$  [Condon 92] so we can represent  $x(i)$  with bit strings of length  $O(n)$
- Simulate the stopping game proof using small depth circuits for addition/subtraction/comparison of integers

# Depth 2 Addition Circuits [AM]



Let  $x_1..x_n$  be the bitwise sum of  $k$  binary numbers

**Example ( $k=4$ ):**  $x=10341234$

State after  $p$  digits read represents a range of possible values for the partial sum

reject state:  $[0, 2^p - k]$

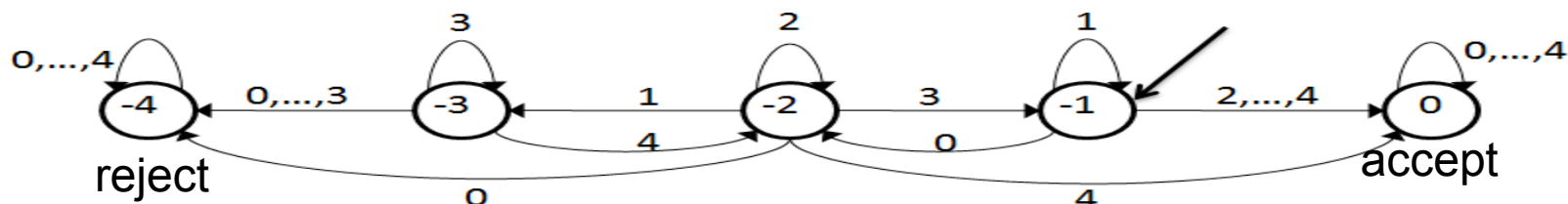
accept state:  $[2^p, k2^p]$

state  $-s$ :  $2^p - s$

Finite state diagram, so only depends on a constant number of bits



# Depth 2 Addition Circuits



$A(i,x)$ : true if we reach accept from  $i-1$  to  $i$

$R(i,x)$ : true if we reach reject from  $i-1$  to  $i$

$A(i,x), R(i,x)$  depend only on a constant number of bits of  $x$

$C(x)$ : true if an overflow bit is generated (there is some bit  $j$  where the circuit reaches accept and every bit from  $j$  to  $i$  does not reach reject)

$$\bigvee_{j \geq 1} \neg[A(1,x) \wedge A(2,x) \wedge \dots \wedge A(j-1,x)] \wedge R(j,x)$$

$C$  is a  $\Delta_2^+$  formula

# IGOP: Integer-value Graph Ordering Principle

Let  $G$  be an undirected graph on  $n$  vertices, each vertex  $i$  labelled with an  $n$ -bit value  $\text{value}(i)$

IGOP( $G$ ):

Each node of  $G$  is labelled by an  $n$ -bit integer value

IGOP( $G$ ) states that there exists a node  $i$  such that  $\text{value}(i)$  is greater than or equal to  $\text{value}(j)$  for all vertices  $j$  incident with  $i$ .

IGOP( $G$ ) expressible as a CNF formula in variables  $v(1), \dots, v(n)$ , where  $v(i) = v^1(i) \dots v^n(i)$

# IGOP: Integer-value Graph Ordering Principle

Fact: IGOP( $G$ ) has a depth-3 polysize Frege proof.

Idea: Prove that there exists a node  $i$  such that  $v(i)$  is maximal.

Open Problem: Does IGOP( $G$ ) have a polysize depth-2 Frege proof?

**yes** implies an improvement of our Main Theorem

**no** implies that SSGs are not reducible to MPGs.

# Open Problems

- Our proof is very general; relies only on uniqueness of solution. Should also hold for the more general class of Shapley games.
- Does an efficient algorithm for SSGs imply feasible interpolation/automatizability of low-depth Frege?
- Prove that IGOP is not efficiently provable in depth-2 Frege.
- Is uniqueness of discount games depth-2 equivalent to IGOP?
- Study the relative complexity of proofs of totality for SSGs, MPGs, PLS, PPAD.

Thanks!