

# The Complexity and Proof Complexity of the Comparator Circuit Value Problem

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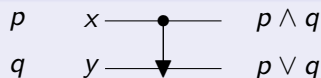
# Outline of the talk

- 1 Define **comparator circuits**
- 2 Define **CC** as the class of problems reducible to **CCV** (**the comparator circuit value problem**)
- 3 Give interesting complete problems for **CC**
- 4 Introduce **universal comparator circuits**, with resulting robustness properties of **CC**.
- 5 Introduce **a theory VCC** and **a propositional proof system CCFrege** for **CC**.
- 6 Support the conjecture that **CC** and **NC** are incomparable using **oracle separations**.

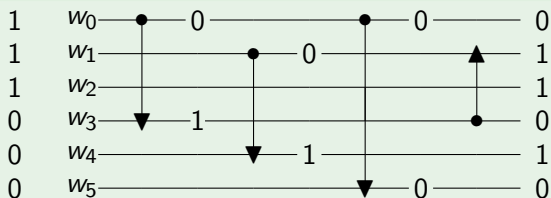
# Comparator Circuits

- Originally invented for **sorting**, e.g.,
  - Batcher's  $\mathcal{O}(\log^2 n)$ -depth sorting networks ('68)
  - Ajtai-Komlós-Szemerédi (AKS)  $\mathcal{O}(\log n)$ -depth sorting networks ('83)
- Can also be considered as Boolean circuits.

## Comparator gate

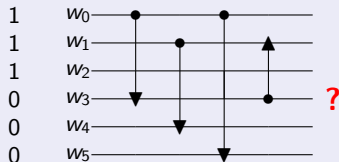


## Example



## Comparator Circuit Value (CCV) Problem (decision)

Given a comparator circuit with specified Boolean inputs, determine the output value of a designated wire.



## Comparator Circuit complexity class

- 1  $CC = \{ \text{decision problems } AC^0 \text{ many-one-reducible to CCV} \}$
- 2 Subramanian [ '90 ] Defined CC using **log space many-one reducibility**
- 3 We introduce universal comparator circuits and use them to show that the two definitions coincide.
- 4 Subramanian showed

$$NL \subseteq CC \subseteq P$$

NL is nondeterministic log space

- Recall  $NL \subseteq CC \subseteq P$
- But also  $NL \subseteq NC \subseteq P$   
where  $NC$  (the parallel class) contains the problems solvable by uniform polysize polylog depth Boolean circuit families.
- $NC$  contains all context-free languages, and matrix powering and determinants over  $\mathbb{Z}, \mathbb{Q}$  etc.

## Conjecture

$NC$  and  $CC$  are incomparable. (So in particular  $CC \subsetneq P$ .)

Intuitively, we think  $CC \subsetneq P$  because each of the two comparator gate outputs in a comparator circuit is limited to fan-out one. (More later...)

## Example Complete Problems for CC

- Ccv
- Stable Marriage Problem
- Lexicographical first maximal matching
- Telephone connection problem
- Others . . .

## Stable Marriage Problem (search version) (Gale-Shapley '62)

- Given  $n$  men and  $n$  women together with their preference lists
- Find a stable marriage between men and women, i.e.,
  - 1 a perfect matching
  - 2 satisfies the stability condition: no two people of the opposite sex like each other more than their current partners
  - 3 A stable marriage always exists, but may not be unique.

## Stable Marriage Problem (decision version)

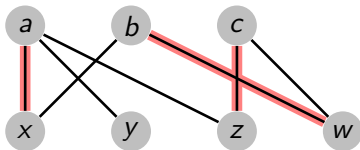
Is a given pair of  $(m, w)$  in the man-optimal (woman-optimal) stable marriage?

The Stable Marriage problem has been used to pair medical interns with hospital residencies in the USA.

# Lex-first maximal matching problem (CC-Complete)

## Lex-first maximal matching

- Let  $G$  be a bipartite graph.
- Successively match the bottom nodes  $x, y, z, \dots$  to the least available top node

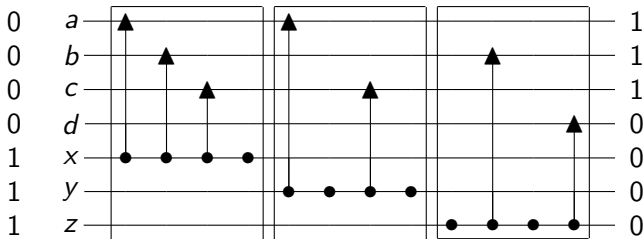
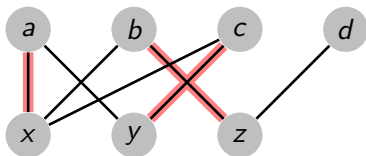


## Lex-first maximal matching decision problems

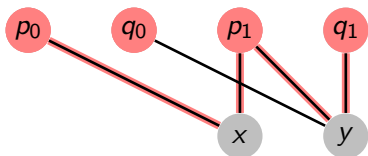
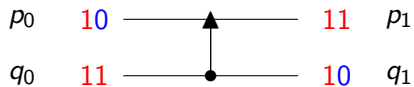
- **Edge** Is a given edge  $\{u, v\}$  in the lex-first maximal matching of  $G$ ?
- **Vertex** Is a given (top) vertex  $v$  in the lex-first maximal matching of  $G$ ?
- The problems are equivalent.



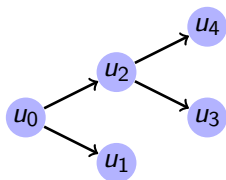
# Reducing vertex lex-first maximal matching to Ccv



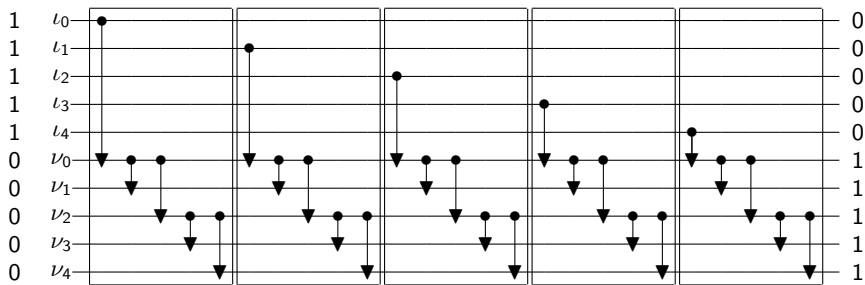
## Reducing $C_{CV}$ to lex-first maximal matching



# NL $\subseteq$ CC



- This result is due to Feder [1992].
- Dai Lê has a neat proof (See the appendix to our recent arXiv paper.)
- Show  $stCONN \leq_m^{AC^0} CCV$ .
- May assume that the given directed graph  $G = (V, E)$  has edges of the form  $(u_i, u_j)$ , where  $i < j$ .



## Two-Sorted Notation

- $x, y, z, \dots$  denote elements of  $\mathbb{N}$  (presented in unary)
- $X, Y, Z, \dots$  denote binary strings
- $|X|$  denotes the length of  $X$ .
- A complexity class is a set of relations of the form  $R(\vec{x}, \vec{X})$
- **$AC^0$  many-one reducibility**  
 $R_1(X) \leq_m^{AC^0} R_2(X)$  iff there exists an  $AC^0$  function  $F(X)$  such that

$$R_1(X) \leftrightarrow R_2(F(X))$$

- Thus  $CC$  is the class of relations  $R(\vec{x}, \vec{X})$  that are  $AC^0$  many-one reducible to  $CCV$ .

# Function Classes

- Given a class  $C$  of relations, we associate a class  $FC$  of functions as follows.
- A function  $F$  taking strings to strings is in  $FC$  iff
  - 1  $|F(X)| = |X|^{O(1)}$  ( $p$ -bounded)
  - 2 The bit graph  $B_F(i, X)$  is in  $C$
- Here  $B_F(i, X)$  holds iff the  $i$ th bit of  $F(X)$  is 1.

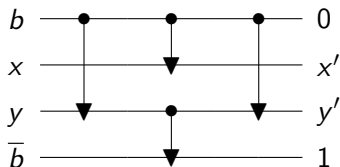
## Is FCC closed under composition?

- This question was left open in our earlier paper in CSL 2011 paper (before Yuval Filmus joined our project)
- Suppose  $F(X) = G(H(X))$ . Let  $Y = H(X)$ .
- The bit graph of  $G(Y)$  is  $AC^0$ -reducible to  $CCV$ .
- Thus the circuit computing  $G(Y)$  is described by  $Y' = AC^0(Y)$ .
- But  $Y = H(X)$  is the output of another comparator circuit.

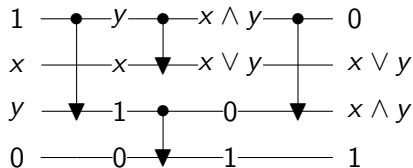
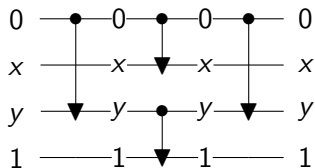
So we need a **universal** comparator circuit, taking  $Y'$  as input, to compute  $G(Y)$ .

# Universal comparator circuits [Filmus]

Here is a **gadget** which allows a conditional application of a comparator to two of its inputs  $x, y$ , depending on whether  $b$  is 0 or 1.



Operation of the gadget:



## Universal comparator circuits

- In order to simulate a single arbitrary comparator in a circuit with  $m$  wires we put in  $m(m - 1)$  gadgets in a row, for the  $m(m - 1)$  possible comparators.
- Simulating  $n$  comparators requires  $m(m - 1)n$  gadgets.
- Thus there is an  $AC^0$  function UNIV such that if  $m, n$  are arbitrary parameters, then

$$U = \text{UNIV}(m, n) = \langle m', n', U' \rangle$$

is a universal circuit with  $m'$  wires and  $n'$  gates which simulates all comparator networks with at most  $m$  wires and at most  $n$  comparators.

$$m' = 2m(m - 1)n + m$$

$$n' = 4m(m - 1)n$$



## Applications of universal comparator circuits

- FCC is closed under composition.
- CC is closed under (many-one) log-space reducibility.
- This is because  $NL \subseteq CC$ , so FCC includes all log space functions. And FCC is closed under composition.
- If  $R(X) \leftrightarrow CCV(F(X))$ , where  $F$  is log-space computable, then

$$\chi_R(X) = \chi_{CCV}(F(X))$$

where  $\chi_R$  is the characteristic function of  $R$ .

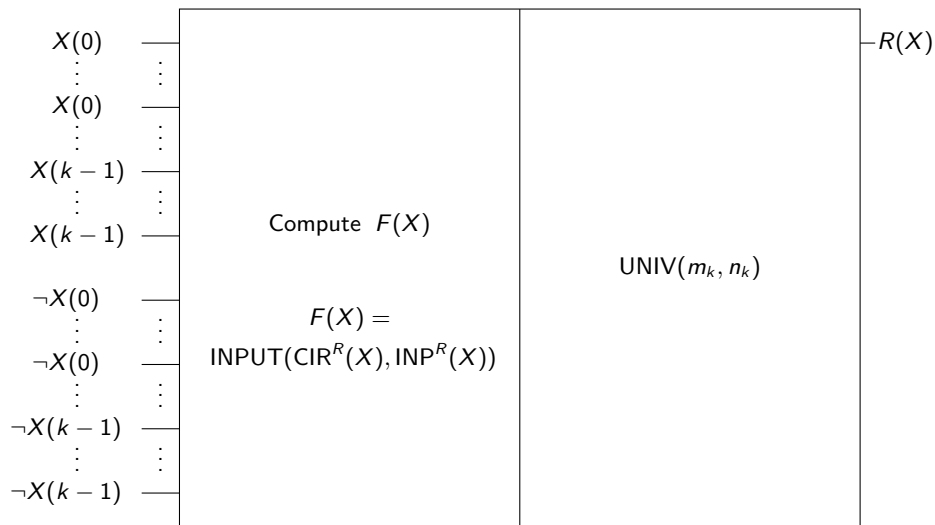
## Applications of universal comparator circuits Cont'd

- $R(X)$  is in CC iff there is an  $AC^0$ -uniform family  $\{C_k^R\}_{k \in \mathbb{N}}$  of comparator circuits, where  $C_k$  computes  $R(X)$  for  $|X| = k$ .
- The direction  $\Leftarrow$  is immediate.
- Proof of direction  $\Rightarrow$ : This is clear if  $R(X)$  is in  $AC^0$ . (An  $AC^0$  circuit converts into a polysize tree circuit, which converts to a comparator circuit.)
- If  $R(X) \in CC$ , then

$$R(X) \leftrightarrow CCV(F(X))$$

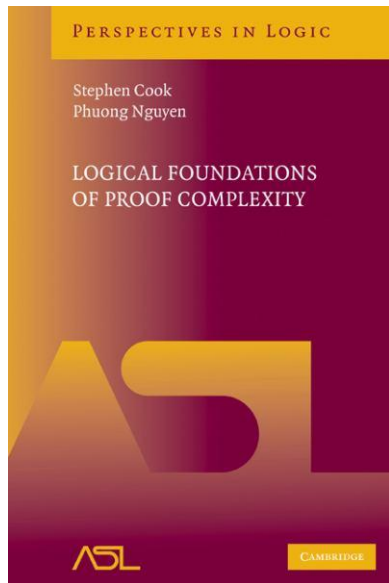
for some  $AC^0$  function  $F(X)$ . Apply a universal circuit to the output of  $F(X)$ .

# The circuit $C_k$ computing $R(X)$ for $|X| = k$



# Theory VCC for the class CC

- Reference:



## Two-sorted language $\mathcal{L}_A^2$ (Zambella '96)

Vocabulary  $\mathcal{L}_A^2 = [0, 1, +, \cdot, | \mid ; \in, \leq, =_1, =_2]$

- Standard model  $\mathbb{N}_2 = \langle \mathbb{N}, \text{finite subsets of } \mathbb{N} \rangle$
- $0, 1, +, \cdot, \leq, =$  have usual meaning over  $\mathbb{N}$
- $|X|$  = length of  $X$
- Set membership  $y \in X$

### Note

The natural inputs for Turing machines and circuits are finite strings.

- “number” variables  $x, y, z, \dots$  (range over  $\mathbb{N}$ )
- “string” variables  $X, Y, Z, \dots$  (range over finite subsets of  $\mathbb{N}$ )
- Number terms are built from  $x, y, z, \dots, 0, 1, +, \cdot$  and  $|X|, |Y|, |Z|, \dots$
- The only string terms are variable  $X, Y, Z, \dots$

### Definition ( $\Sigma_0^B$ formula)

- 1 All the number quantifiers are bounded.
- 2 No string quantifiers (free string variables are allowed)

## Two-sorted complexity classes

A **two-sorted complexity class** consists of relations  $R(\vec{x}, \vec{X})$ , where

- $\vec{x}$  are number arguments (in unary) and  $\vec{X}$  are string arguments

### Definition (Two-sorted $AC^0$ )

A relation  $R(\vec{x}, \vec{X})$  is in  $AC^0$  iff some alternating Turing machine accepts  $R$  in time  $\mathcal{O}(\log n)$  with a constant number of alternations.

### $\Sigma_0^B$ -Representation Theorem [from Immerman FO]

$R(\vec{x}, \vec{X})$  is in  $AC^0$  iff it is represented by a  $\Sigma_0^B$ -formula  $\varphi(\vec{x}, \vec{X})$ .

### Useful consequences

- 1 Don't need to work with uniform circuit families or alternating Turing machines when **defining  $AC^0$  functions or relations**.
- 2 Useful when working with  $AC^0$ -reductions

# The theory $V^0$ for $AC^0$ reasoning

Theories developed using Cook-Nguyen method **extend**  $V^0$ .

## The axioms of $V^0$

- 1 **2-BASIC axioms**: essentially the axioms of **Robinson arithmetic** plus
  - ▶ the defining axioms for  $\leq$  and the string length function  $| \cdot |$
  - ▶ the axiom of extensionality for finite sets (bit strings).
- 2  **$\Sigma_0^B$ -COMP** (Comprehension): for every  $\Sigma_0^B$ -formula  $\varphi(z)$  without  $X$ ,  
$$\exists X \leq y \forall z < y (X(z) \leftrightarrow \varphi(z))$$

## The $\Sigma_0^B$ -IND scheme is provable in $V^0$

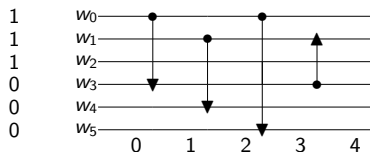
- 1  $[\varphi(0) \wedge \forall x (\varphi(x) \rightarrow \varphi(x + 1))] \rightarrow \forall x \varphi(x)$ , where  $\varphi \in \Sigma_0^B$ .
- 2 **The provably total functions in  $V^0$  are precisely  $FAC^0$ .**

## The two-sorted theory VCC [using the Cook-Nguyen method]

- VCC has vocabulary  $\mathcal{L}_A^2$
- Axiom of VCC = Axiom of  $V^0$  + one additional axiom asserting the existence of a solution to the CCV problem.



## Asserting the existence of a solution to CCV



- $X$  encodes a comparator circuit with  $m$  wires and  $n$  gates
- $Y$  encodes the input sequence
- $Z$  is an  $(n+1) \times m$  matrix, where column  $i$  of  $Z$  encodes values layer  $i$

The following  $\Sigma_0^B$  formula  $\delta_{CCV}(m, n, X, Y, Z)$  states that  $Z$  encodes the correct values of all the layers of the CCV instance encoded in  $X$  and  $Y$ :

$$\forall k < m (Y(k) \leftrightarrow Z(0, k)) \wedge \forall i < n \forall x < m \forall y < m,$$

$$(X)^i = \langle x, y \rangle \rightarrow \left[ \begin{array}{l} Z(i+1, x) \leftrightarrow (Z(i, x) \wedge Z(i, y)) \\ \wedge Z(i+1, y) \leftrightarrow (Z(i, x) \vee Z(i, y)) \\ \wedge \forall j < m [(j \neq x \wedge j \neq y) \rightarrow (Z(i+1, j) \leftrightarrow Z(i, j))] \end{array} \right]$$

$$VCC = V^0 + \exists Z \leq \langle m, n+1 \rangle + 1, \delta_{CCV}(m, n, X, Y, Z)$$

# Properties of VCC

## From long version of our CSL 2011 paper

- The provably total functions of VCC comprise FCC.
- VCC admits induction on CC concepts.
- VCC extends  $VNC^1$ . (Recall  $NC^1 \subseteq CC$ .)
- VCC proves that Lex-first Max Matching, and Stable Marriage, are complete for CC.

# Associate proof system CFrege with VC

## [Ch. 10, CN 2010]

- Each  $\Sigma_0^B$  formula  $\varphi(X)$  translates into a polysize family  $\{\varphi(X)[n]\}_{n \in \mathbb{N}}$  of bounded depth propositional formulas.
  - ▶ Here  $\varphi(X)[n]$  expresses  $\varphi(X)$  for  $|X| = n$ , using atoms  $p_i^X$  for the bits of  $X$ . (This method due to [Paris/Wilkie]).
- If  $\varphi(X)$  is true, then each translated formula  $\varphi(X)[n]$  is a tautology.
- If  $C$  is a circuit class such as  $AC^0$ ,  $NC^1$ ,  $P$  then CFrege is  $AC^0$ -Frege, Frege, EFrege, respectively.
- The lines in the CFrege-proof represent Boolean circuits of the appropriate kind (bounded-depth, formulas, circuits) respectively.
- A proof of  $\varphi(X)$  in the theory VC translates into a polysize family of CFrege proofs of the tautologies  $\{\varphi(X)[n]\}_{n \in \mathbb{N}}$
- The theory VC proves the soundness of CFrege.
- CFrege is the strongest proof system whose soundness is provable in VC.

## Suggestion for proof system CCFrege

- CCFrege is EFrege with restrictions on introduction of extension variables.
- Each extension variable is the value of some wire segment in a comparator circuit whose inputs do not involve extension variables.
- The extension variables are  $w_{ij}$ ,  $1 \leq i \leq m$ ,  $1 \leq j \leq n$ , where the comparator circuit has  $m$  wires and  $n$  gates.
- $w_{ij}$  is the value of the  $j$ th segment of wire  $i$ , where each wire gets a new segment after every gate.
- Let  $a_j$  be the wire number corresponding to the AND of gate  $j$ , and let  $o_j$  be the wire number corresponding to the OR of gate  $j$ .

Thus  $a_j \neq o_j$ , and  $0 \leq a_j, o_j \leq m$

## Defining formulas for the extension variables $w_{ij}$

- $w_{i0} \leftrightarrow A_i$ ,  $1 \leq i \leq m$ , where  $A_i$  has no extension variables.
- $w_{i,j+1} \leftrightarrow w_{ij}$  if  $i \neq a_j, i \neq o_j$
- $w_{i,j+1} \leftrightarrow (w_{ij} \wedge w_{o_j,j})$  if  $i = a_j$
- $w_{i,j+1} \leftrightarrow (w_{ij} \vee w_{a_j,j})$  if  $i = o_j$

# Properties of CCFrege

## Claim:

CCFrege corresponds to VCC:

- 1 A proof of a  $\Sigma_0^B$ -formula  $\varphi(X)$  in the theory VCC translates into a polysize family of CCFrege proofs of the tautologies  $\{\varphi(X)[n]\}_{n \in \mathbb{N}}$
- 2 The theory VCC proves the soundness of CCFrege.
- 3 CCFrege is the strongest proof system whose soundness is provable in VCC.

## Proof of (2)

- Given a CCFrege proof, VCC can evaluate the extension variables in terms of the values for the input variables, using its axiom asserting the existence of values for the wires of a comparator circuit.
- VCC proves by induction that all formulas in the proof are true.

## Conjecture: NC and CC are incomparable

- Lex-First Max Matching (LFMM) is in CC.

### Conjecture

LFMM is not in NC.  
(The obvious algorithm for LFMM is sequential.)

- The function  $A \rightsquigarrow A^n$  (where  $A$  is an  $n \times n$  integer matrix) is in  $NC^2$ , but we do not know how to put it in CC.

## Why do we think $NC^2 \subsetneq CC$ ?

- $NC^2$ -gates have multiple fan-out, but each end of a comparator gate has fan-out one.
- If either input of a comparator gate is 'flipped', then exactly one output is flipped.  
Thus comparator gates are **1-Lipschitz**.
- Flipping an input to a gate generates a unique **flip-path** in the circuit from that gate to some output of the circuit.
- But flipping an input to an  $NC^2$ -gate can generate many parallel flip-paths.

# Relativized CC and NC are incomparable

## Oracle gates for comparator circuits

- The oracle  $\alpha : \{0, 1\}^* \rightarrow \{0, 1\}^*$  is length preserving.
- $\alpha_n : \{0, 1\}^n \rightarrow \{0, 1\}^n$  is the restriction of  $\alpha$  to  $n$ .
- An oracle gate  $\alpha_n$  can be inserted anywhere in a relativized comparator circuit: select any  $n$  wires as inputs to the gate and any  $n$  wires as outputs.
- To make  $\alpha_n$  gates look more like comparator gates, we require that  $\alpha_n$  have the 1-Lipschitz property.
- We allow  $\neg$  gates in relativized  $\text{CC}(\alpha)$  circuits.  
(We can allow them in comparator circuits without changing CC.)
- Changing one input to one  $\alpha_n$  gate produces a unique flip path in the circuit from that gate to the outputs of the circuit.



## Theorem

*There is a relation  $R_1(\alpha)$  computable by a polysize family of comparator oracle circuits by which cannot be computed by any  $NC(\alpha)$  circuit family (even when  $\alpha$  is restricted to be 1-Lipschitz).*

## Proof Idea.

- $\alpha_n^k(\vec{0})$  is easily computed by relativized comparator circuits, but requires depth  $k$  circuits [ACN 07].
- The hard part is proving the depth lower bound when  $\alpha$  is 1-Lipschitz.



## Theorem

There is a relation  $R_2(\alpha)$  computable by an  $\text{NC}^2(\alpha)$  circuit family but not computable by any polysize family of comparator oracle circuits (even when  $\alpha$  is restricted to be 1-Lipschitz).

## Proof Idea.

- Let  $\alpha_i^k : \{0, 1\}^{dn} \rightarrow \{0, 1\}$  be a Boolean oracle.
- Define a function  $y = f[(\alpha_1^1, \dots, \alpha_n^1), \dots, (\alpha_1^m, \dots, \alpha_n^m)]$  as follows:

$$x_i^k = \alpha_i^k(\overbrace{x_1^{k+1}, \dots, x_1^{k+1}}^{d \text{ times}}, \dots, \overbrace{x_n^{k+1}, \dots, x_n^{k+1}}^{d \text{ times}}), \quad k \in [m], i \in [n],$$
$$x_i^{m+1} = 0, \quad i \in [n],$$
$$y = x_1^1 \oplus \dots \oplus x_n^1.$$



# Conclusion

The complexity class  $CC$  is interesting because

- It is **robust** (closed under a variety of reductions).
- It has **interesting complete problems**.
- It appears to be a **proper subset of  $P$**  and **incomparable with  $NC$  (and  $SC$ )**.
- It has a theory  $VCC$  which captures reasoning in  $CC$  and proves basic properties of  $CC$ .
- It has an associated propositional proof system  $CCFrege$ .