# Hardness amplification proofs require majority

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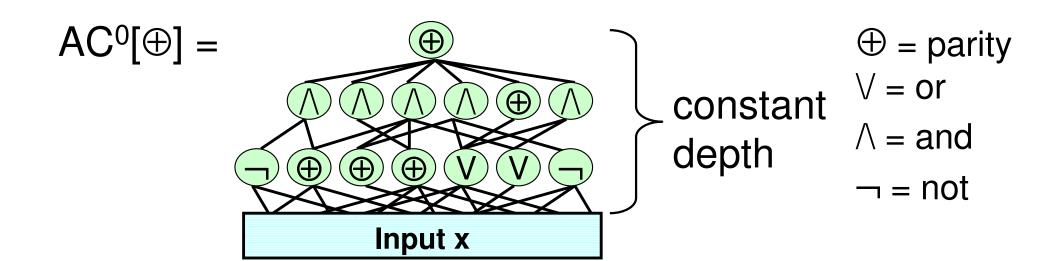
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## Circuit lower bounds

- Success with restricted circuits
   [Furst Saxe Sipser, Ajtai, Yao, Hastad, Razborov, Smolensky,...]
- Theorem[Razborov '87] Majority ∉ AC<sup>0</sup>[⊕]

Majority(x) = 
$$1 \Leftrightarrow \sum x_i > |x|/2$$



# Natural proofs barrier

Little progress for general circuit models

- Natural Proofs [Razborov Rudich] + [Naor Reingold]: Standard techniques cannot prove lower bounds for circuit classes that can compute Majority
- " We have lower bounds for AC<sup>0</sup>[⊕]
   because Majority ∉ AC<sup>0</sup>[⊕] "

# Average-case hardness

• Definition:  $f: \{0,1\}^n \to \{0,1\}$   $(1/2 - \varepsilon)$ -hard for class  $\mathbf{C}:$  for every  $M \in \mathbf{C}: \Pr_{\mathbf{x}}[f(\mathbf{x}) \neq M(\mathbf{x})] \geq 1/2 - \varepsilon$ 

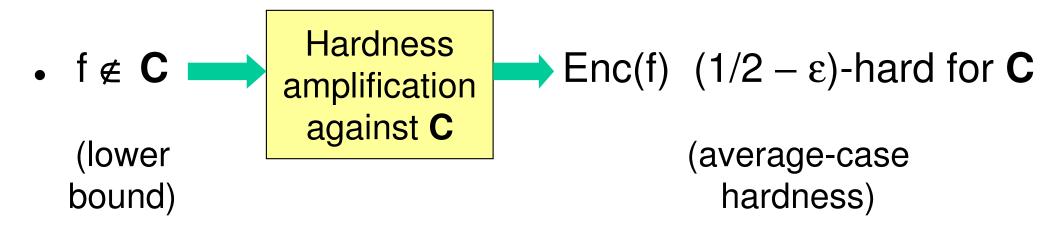
• E.g. **C** = general circuits of size n<sup>log n</sup>, AC<sup>0</sup>[⊕], ...

• Strong average-case hardness:  $1/2 - \varepsilon = 1/2 - 1/n^{\omega(1)}$ Need for cryptography

pseudorandom generators [Nisan Wigderson,...] lower bounds [Hajnal Maass Pudlak Szegedy Turan,...]

# Hardness amplification

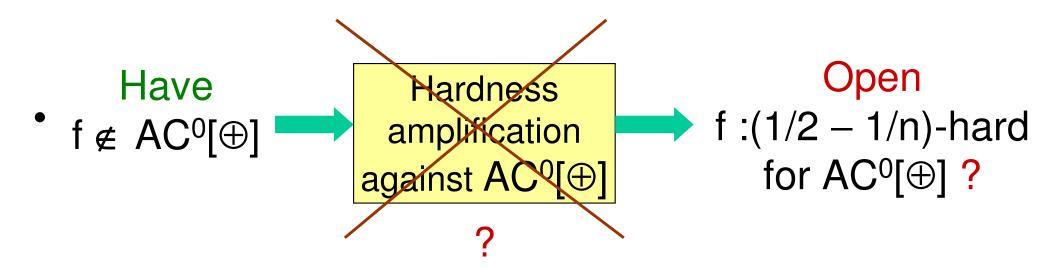
[Y,GL,L,BF,BFL,BFNW,I,GNW,FL,IW,CPS,STV,TV,SU,T,O,V,HVV,GK,IJK,...]



- Usually black-box, i.e. code-theoretic
   Enc(f) = Encoding of (truth-table of) f
   Proof of correctness = decoding algorithm in C
- Results hold when C = general circuits

# The problem we study

 Known hardness amplifications fail against any class C for which have lower bounds



 Conjecture[V. '04]: Black-box hardness amplification against class C ⇒ Majority ∈ C

## Our results

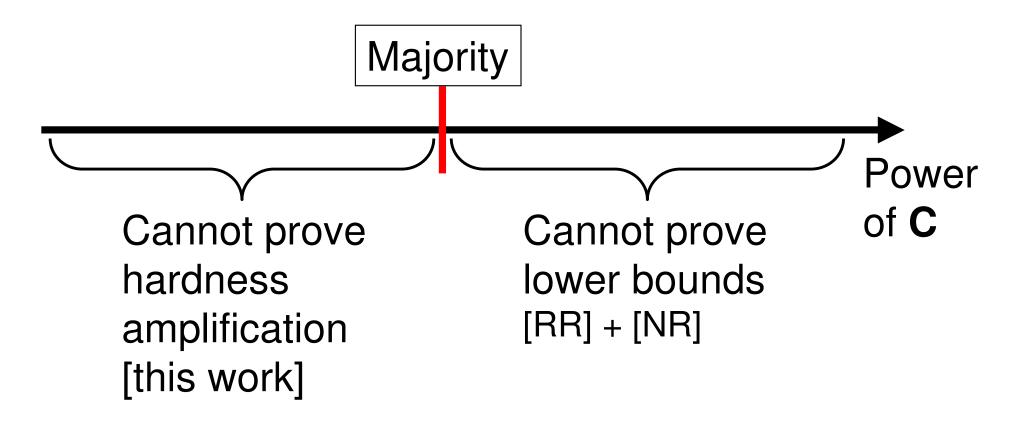
- Theorem[This work] Black-box (non-adaptive)
  - $(1/2 \varepsilon)$ -hardness amplification against class  $\mathbf{C} \Rightarrow$ 
    - (i)  $C \in C$  computes majority on  $1/\epsilon$  bits
    - (ii)  $C \in \mathbb{C}$  makes  $\geq n/\epsilon^2$  queries

• Generalizes to  $\delta \rightarrow (1/2 - \epsilon)$ -hardness amplification

- Both tight
  - (i) [Impagliazzo, Goldwasser Gutfreund Healy Kaufman Rothblum]
  - (ii) [Impagliazzo, Klivans Servedio]

## Our results + [Razborov Rudich] + [Naor Reingold]

"Lose-lose" reach of standard techniques:



"You can only amplify the hardness you don't know"

# Other consequences of our results

Boolean vs. non-Boolean hardness amplification
 Enc(f)(x) ∈ {0,1} requires majority

 $Enc(f)(x) \in \{0,1\}^t$  does not [Impagliazzo Jaiswal Kabanets Wigderson]

• Loss in circuit size: Lower bound for size s  $\Rightarrow (1/2 - \varepsilon)$ -hard for size s  $\cdot \varepsilon^2/n$ 

Decoding is more difficult than encoding

Encoding: Parity (⊕)

**Decoding: Majority** 

## Outline

Overview and our results

Formal statement of our results

Proof

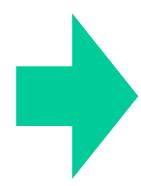
# Black-box hardness amplification

- In short:  $\forall f \forall h \approx \text{Enc}(f) \Rightarrow \exists C \in \mathbf{C} : C^h = f$
- Rationale:  $f \notin \mathbb{C} \Rightarrow \text{Enc}(f) (1/2 \varepsilon)$ -hard for  $\mathbb{C}$

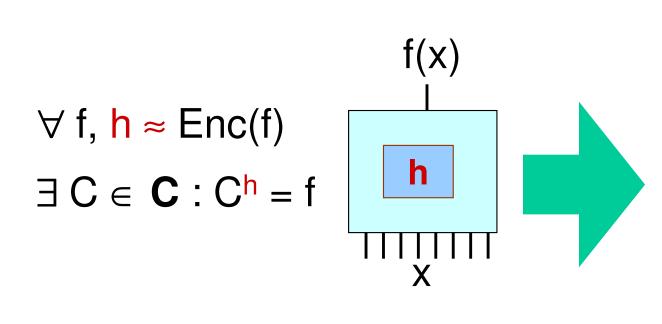
## Our results

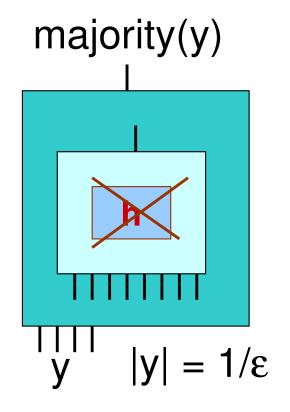
#### Theorem

Black-box non-adaptive  $(1/2 - \varepsilon)$ -hardness amplification against **C** 



∃ M ∈ **C** computes majority on 1/ε bits





## Outline

Overview and our results

Formal statement of our results

Proof

### **Proof**

- Recall Theorem: Black-box (non-adaptive)
  - $(1/2 \varepsilon)$ -hardness amplification against class  $\mathbf{C} \Rightarrow$ 
    - (i)  $C \in C$  computes majority on  $1/\epsilon$  bits
    - (ii)  $C \in \mathbb{C}$  makes  $q \ge n/\epsilon^2$  queries
- We show hypot.  $\Rightarrow$  C  $\in$  C : tells Noise 1/2 from 1/2  $-\epsilon$

(D) 
$$| Pr[C(N_{1/2},...,N_{1/2})=1] - Pr[C(N_{1/2-\epsilon},...,N_{1/2-\epsilon})=1] | >0.1$$

(i) ← (D) + manipulations Ack: Madhu Sudan
 (ii) ← (D) + tigthness of Chernoff bound

# Warm-up: uniform reduction

Want: non-uniform reductions (∀ f,h ∃ C)

For every 
$$f$$
,  $h$ :  $Pr_y[Enc(f)(y) \neq h(y)] < 1/2-\epsilon$   
there is circuit  $C \in \mathbf{C}$ :  $C^h(x) = f(x) \ \forall \ x$ 

• Warm-up: uniform reductions (∃ C ∀ f,h)

There is circuit  $C \in C$ :

For every f, h : 
$$Pr_y[Enc(f)(y) \neq h(y)] < 1/2-\epsilon$$
  
 $C^h(x) = f(x) \forall x$ 

## Proof in uniform case

• Random  $F: \{0,1\}^k \to \{0,1\}, X \in \{0,1\}^k$ Consider C(X) with oracle access to Enc(F)(y)  $\oplus$  H(y)

$$H(y) \sim N_{1/2} \Rightarrow C^{Enc(F) \oplus H}(X) = C^{H}(X) \neq F(X)$$
 w.h.p. C has no information about F

$$H(y) \sim N_{1/2-\epsilon} \Rightarrow C^{Enc(F) \oplus H}(X) = F(X)$$
 always  $Enc(F) \oplus H$  is  $(1/2-\epsilon)$ -close to  $Enc(F)$ 

• To tell  $z \sim \text{Noise } 1/2 \text{ from } z \sim \text{Noise } 1/2 - \varepsilon, |z| = q$ Run C(X); answer i-th query  $y_i$  with Enc(F)( $y_i$ )  $\oplus z_i$ 

Q.e.d

## Proof outline in non-uniform case

- Non-uniform: C depends on F and H (∀ f,h ∃ C)
- Proof outline:
  - 1) Fix C to C' that works for many f,h Condition F' := F | C', H' := H | C'
  - 2) Information-theoretic lemma

There is good set  $G \subseteq \{0,1\}^n$  s.t. if all  $y_i \in G$ :

$$Enc(F') \oplus H'(y_1,...,y_q) \approx Enc(F) \oplus H(y_1,...,y_q)$$

Can argue as for uniform case if all y<sub>i</sub> ∈ G

3) Deal with queries y<sub>i</sub> not in G

# Fixing C

• Random F :  $\{0,1\}^k \to \{0,1\}$ , H (x) ~  $N_{1/2} - \varepsilon$ 

Enc(F)⊕H is (1/2-ε)-close to Enc(F). We have (∀f,h∃C)
 With probability 1 over F,H there is C ∈ C:

$$C \operatorname{Enc}(F) \oplus H(x) = F(x) \quad \forall x$$

•  $\Rightarrow$  there is C'  $\in$  C : with probability 1/|C| over F,H

C' 
$$Enc(F) \oplus H(x) = F(x) \forall x$$

Note: C = all circuits of size poly(k), 1/|C| = 2-poly(k)

## The information-theoretic lemma

Lemma

```
Let V_1, \dots, V_t i.i.d., V_1', \dots, V_t' := V_1, \dots, V_t \mid E
E noticeable \Rightarrow there is large good set G \subseteq [t]: for every i_1, \dots, i_q \in G: (V'_{i_1}, \dots, V'_{i_q}) \approx (V_{i_1}, \dots, V_{i_q})
```

Proof: E noticeable ⇒ H(V<sub>1</sub>',...,V<sub>t</sub>') large
 ⇒ H(V'<sub>i</sub>|V'<sub>1</sub>,...,V'<sub>i-1</sub>) large for many i (∈ G)

Closeness[
$$(V_{i_1},...,V_{i_q}),(V'_{i_1},...,V'_{i_q})$$
]  $\geq H(V'_{i_1},...,V'_{i_q})$   
 $\geq H(V'_{i_q} \mid V'_{1},...,V'_{i_{q-1}}) + ... + H(V'_{i_1} \mid V'_{1},...,V'_{i_{1-1}})$  large Q.e.d.

• Also in [Edmonds Rudich Impagliazzo Sgall, Raz]

# Applying the lemma

•  $V_x = H(x) \sim \text{Noise } 1/2-\epsilon$ 

• 
$$E := \{ H : C'^{Enc(F) \oplus H}(x) = F(x) \forall x \}, Pr[E] \ge 1/|C|$$

H' = H | E = 
$$01110100101100010110 \cdots 0$$
   
**q queries G**

C' Enc(F')  $\oplus$  H' (x)  $\approx$  C' Enc(F)  $\oplus$  H (x)

• All queries in  $G \Rightarrow$  proof for uniform case goes thru

# Handling bad queries

- Problem: C(x) may query bad y ∈ {0,1}<sup>n</sup> not in G
- Idea: Fix bad query. Queries either in G or fixed ⇒ proof for uniform case goes thru
- Delicate argument:

Fixing bad query H(y) creates new bad queries

Instead, fix heavy queries: asked by C(x) for many x's

OK because new bad queries are light, affect few x's

## Conclusion

This work: Black-box (non-adaptive)
 hardness amplification against C ⇒ Majority ∈ C

Reach of standard techniques
 [This work] + [Razborov Rudich] + [Naor Reingold]
 "Can amplify hardness ⇔ cannot prove lower bound"

Open problems

Adaptivity? (OK in special cases [V., Gutfreund Rothblum]) 1/3-pseudorandom construction  $\Rightarrow$  majority?