## AND testing and robust

## judgment aggregation

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## Introduction

The accused should be convicted if they have both the means and the motive. Here is what the three judges had to say:


## Introduction

- This shows that Majority is not admissible for AND.
- A judgment aggregation function $f:\{0,1\}^{n} \longrightarrow\{0,1\}$ is admissible for $A N D$ if for all $x, y \in\{0,1\}^{n}$, we have $f(x \wedge y)=f(x) \wedge f(y)$.
- Which functions are admissible?
- Dictators: $f(x)=x_{i}$
- Constants: $f(x)=0, f(x)=1$
- Oligarchies (ANDs): $f(x)=x_{1} \wedge \cdots \wedge x_{m}$


## Introduction

Theorem: ANDs and constants are only functions admissible for AND.

Are there other solutions which are admissible whp?

$$
\text { (i.e., } \operatorname{Pr}[f(x \wedge y)=f(x) \wedge f(y)] \approx 1)
$$

Theorem (Nehama): If $f$ is approx admissible, it is approx an AND: $\operatorname{Pr}[f(x \wedge y)=f(x) \wedge f(y)] \geq 1-\varepsilon \Longrightarrow f$ is $O(n \varepsilon)$-close to an AND

## Arrow's theorem

An election is being held using ranked ballots. The outcome has to be a ranking as well. The final relative ranking of two candidates should depend only on the voters' relative rankings of these two candidates (IIA).


## Linearity testing

The patient should be declared sane if the sandwich has chocolate or pickles, but not both. Here is what three psychiatrists had to say, based on their observations:


## Universal Algebraic Interpretation

- In universal algebra, a function admissible for AND is called an AND polymorphism.
- Similarly, a function admissible for Arrow is an NAE polymorphism (NAE = Not All Equal), and a function admissible for linearity testing is an XOR polymorphism.
- Only polymorphisms of NAE are dictators.
- Only polymorphisms of XOR are XORs.
- We are trying to understand approximate polymorphisms.


## Truth-functionality

- A set of allowed rows is called truth-functional if the last column is a function of the previous ones, and this is the only constraint.
- Both AND and XOR are truth-functional. NAE isn't.
- Dokow and Holzman showed that in the binary truthfunctional setting, AND and XOR (on any number of inputs) are the only interesting cases.
- In all other cases, the only polymorphisms are dictators and, sometimes, constants.


## Property Testing Interpretation

- Linearity testing: to test if $f:\{0,1\}^{n} \longrightarrow\{0,1\}$ is an XOR, sample random $x, y$ and check $f(x \oplus y)=f(x) \oplus f(y)$.
- If $f$ is XOR, test always succeeds ("completeness").
- If test succeeds whp, $f$ is close to XOR ("soundness").
- Oligarchy testing: to test if $f:\{0,1\}^{n} \longrightarrow\{0,1\}$ is an AND, sample random $x, y$ and check $f(x \wedge y)=f(x) \wedge f(y)$.
- Completeness easy to check, want to prove soundness.
- Goldreich and Ron (TR20-068): $\tilde{O}(1 / \varepsilon)$ test.


## Linearity testing

How do we prove soundness?

- Method 1: Self-correction (BLR)
- For most $x, y: f(x)=f(y) \oplus f(x \oplus y)$.
- "Guess" correct value at $x$ is majority of $f(y) \oplus f(x \oplus y)$.
- Method 2: Fourier analysis (BCHKS)
- Express success probability of test using Fourier expansion of $f$.
- Deduce $f$ can be approximated by single Fourier character.


## AND testing

Given $f:\{0,1\}^{n} \longrightarrow\{0,1\}$ s.t. $f(x y)=f(x) f(y)$ whp, want to deduce that $f$ is close to an AND.

- Method 1: Self-correction
- Cannot express $f(x)$ in terms of $f(y), f(x y)$. "Information is lost."
- Method 2: Fourier analysis
- Formula for $\operatorname{Pr}[f(x y)=f(x) f(y)]$ isn't nice any more. For linearity testing, lucky that XORs=monomials.


## Our approach

Suppose $f(x y)=f(x) f(y)$ w.p. $\approx 1$.

- Fix $x$, and take expectation over $y$ :
- $T_{\downarrow} f(x) \approx \lambda f(x)$, where $\lambda=\mathbb{E}[f]$, where $T_{\downarrow} f(x)$ is average of $f(z)$ on all values $z \leq x$.
- In total, $T_{\downarrow} f \approx \lambda f$ (in appropriate norm).
- Determine approximate eigenvectors of $T_{\downarrow}$.
- Uses low pass effect of $T_{\downarrow}$ via Bourgain’s junta theorem.


## Open problems

1. Improve dependence on $\varepsilon$ from quasi-poly to poly.
2. Generalize to arbitrary truth-functional setting.

- In all remaining cases, answer should be dictator.
- Known for Arrow's theorem using Fourier analysis (Kalai).

3. "List-decoding" version:

- What if $\operatorname{Pr}[f(x \wedge y)=f(x) \wedge f(y)]$ is better than random?
- If $\operatorname{Pr}[f(x \oplus y)=f(x) \oplus f(y)]>1 / 2$ then $f$ correlates with some XOR.

