# A Chasm Between Identity and Equivalence Testing with Conditional Queries

Joint work with Jayadev Acharya and Gautam Kamath

#### Outline of the talk

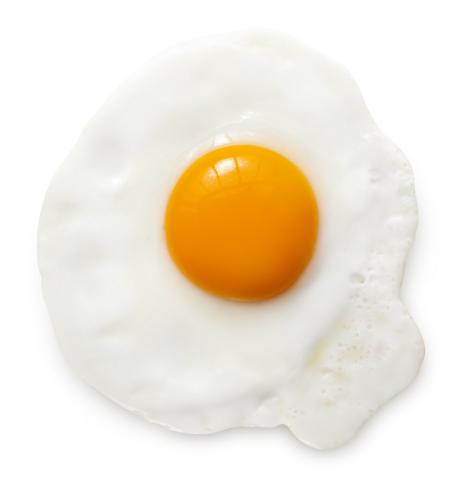
- Distribution Testing and Conditional Queries
- Our results
- Overview of the techniques and obstacles
- Open problems

### Distribution Testing

#### Subfield of **property testing**:

- Big (Unknown) Object O
- Fixed property (subset of Objects) P
- Is O in P, or *far* from every object in P?

## Distribution Testing



## Distribution Testing

```
Big Object: probability distribution D over n elements
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Type of queries: independent samples from D

Distance measure (for "far"): Total variation distance  $(L_1)$ 

## Distribution Testing: A Glimpse

Many results since seminal work of [BFRSW01]:

Testing uniformity:  $\Theta(\sqrt{n}/\epsilon^2)$  [GR00,Pan08] Testing identity:  $\Theta(\sqrt{n}/\epsilon^2)$  [BFF+01,VV14]

Testing equivalence:  $\Theta(n^{2/3}/\epsilon^{4/3})$  [BFR+10,CDVV14]

(+monotonicity, independence, membership to a class...)

Polynomial dependence on the domain size

Given a fixed known D\*, and samples from unknown arbitrary D, is D equal

Given samples from unknown arbitrary D, is D uniform or ε-far from it?

to  $D^*$  or  $\epsilon$ -far from it?

Given samples from two unknown arbitrary D, D', is D equal to D' or ε-far from it?

Many results since se

Testing uniformity:

Testing identity:

Testing equivalence:

 $\Theta(\sqrt{n}/\epsilon^2)$ 

[GR00, Pan08]

 $\Theta(\sqrt{n}/\epsilon^2)$ 

[BFF+01,VV14]

 $\Theta(n^{2/3}/\epsilon^{4/3})$ 

[BFR+10,CDVV14]

(+monotonicity, independence, membership to a class...)

Polynomial dependence on the domain size

## Distribution Testing: A Twist "Is $n^{\Theta(1)}$ our final answer?"

More power to the testers: conditional sampling [Chakraborty-Fischer-Goldhirsh-Matsliah'13, C-Ron-Servedio'12]

Tester chooses  $S \subseteq [n]$ Gets sample drawn from  $D_s$ 

## Distribution Testing: A Twist

- Generalizes sampling model
- Allows adaptivity
- (Several restricted variants)
- Natural in some settings

"Power of comparisons"

## Distribution Testing in O(1)

Testing uniformity: O(1) [CRS15]

Testing identity: O(1) [CRS15,FJO+15]

Testing equivalence: loglog n [CRS15,FJO+15]

"Should it be constant-query too?"

## Distribution Testing in O(1)

Testing uniformity: O(1) [CRS15]

Testing identity: O(1) [CRS15,FJO+15]

Testing equivalence:  $\Omega(\sqrt{\log \log n})$  [this work]

"Things are different now."

#### Our main result

**Theorem.** Any (adaptive) testing algorithm for equivalence in the conditional model must make  $\Omega(\sqrt{\log\log n})$  queries.

"Know thy enemy — it helps for testing."

#### Obstacles

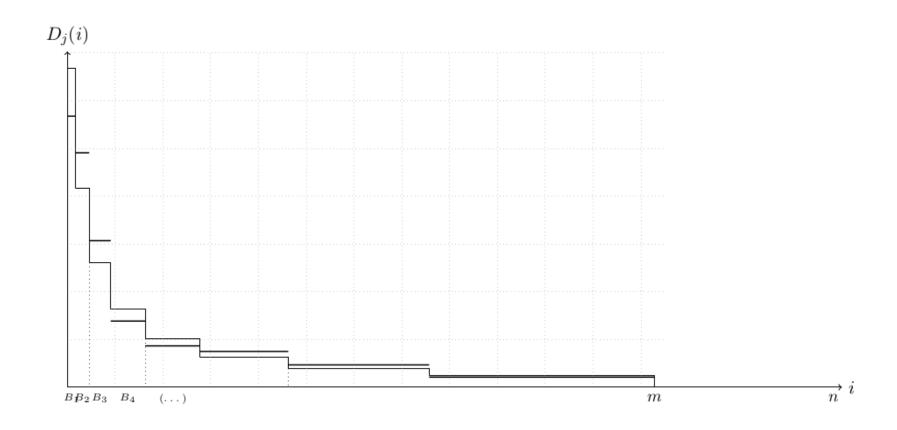
- How to deal with adaptivity?
   Lack of general lower bound techniques in this model.
- How to deal with arbitrary queries?
  The tester can pretty much do what it wants.
- Cannot rely on the "usual tricks"

  Heavy elements to hide the rest, only a few types of weights...

#### Ideas

- Bring in the concept of adaptive core tester of [CFGM13],
   + Yao's principle
- Adapt a lower bound construction of [CRS15] for a restricted conditional model (easy to beat in the full one).
- Hide it by scaling its support by a random factor.

#### Construction



#### Intuition

If you don't (roughly) guess the support size, you cannot learn anything...

But we show support size estimation is hard.

#### Open Questions

- Can we get ε in the picture?
- Does tolerant testing behave like this? (chasm!)
- Develop general techniques for proving lower bounds?
- Characterize problems that are still hard in this model?

## Thank You.

