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# Erasures vs. Errors in Local Decoding and Property Testing

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# Goals

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Study the role of  
**erasures in local  
decoding**

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Study the role of  
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Use our  
understanding to  
**separate  
erasures and  
errors in  
property testing**

# Overview of Results

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- **Local list decoding in the presence of erasures**
  - Local list erasure-decoding **Hadamard Code**
  - **Constant vs.  $\Omega(\log n)$**  separation between erasure-resilient testing and tolerant testing

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  - **Constant vs.  $n^{\Omega(1)}$**  separation between erasure-resilient testing and tolerant testing

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- **Approximate local list decoding in the presence of erasures**
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- **Relationship between local decoding in the presence of erasures and in the presence of errors**

# Locally (Unique or List) Decodable Codes

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- **Locally decodable codes** [Babai Fortnow Levin Szegedy 91, Gemmel Lipton Rubinfeld Sudan Wigderson 91, Gemmel Sudan 92, Blum Luby Rubinfeld 93, Polishchuk Spielman 94, Beimel Ishai Kushilevitz Raymond 02, Yekhanin 08, Ben-Aroya Efremenko TaShma 10, Dvir Gopalan Yekhanin 11, Efremenko 12, ...]
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  - Given oracle access to codeword, with high probability, obtain a list of descriptions of local decoders of each candidate message
  - Decodes from a larger fraction of corruptions



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**Can locally decodable codes perform better with erasures than with errors?**

# Local List Decoding of Hadamard Code

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- Hadamard:  $\{0,1\}^k \rightarrow \{0,1\}^{2^k}$ ;  $\text{Hadamard}(x) = (\langle x, y \rangle)_{y \in \{0,1\}^k}$

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Type of corruptions	Corruption tolerance $\alpha$	List size, $\ell$	Number of queries, $q$	Upper bound	Lower bound
Errors	$\alpha \in \left(0, \frac{1}{2}\right)$	$\Theta\left(\frac{1}{\left(\frac{1}{2} - \alpha\right)^2}\right)$	$\Theta\left(\frac{1}{\left(\frac{1}{2} - \alpha\right)^2}\right)$	[Goldreich Levin 89]	[Blinovsky 86, Guruswami Vadhan 10, Grinberg Shaltiel Viola 18]

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Erasures	$\alpha \in (0,1)$	$O\left(\frac{1}{1 - \alpha}\right)$	$\Theta\left(\frac{1}{1 - \alpha}\right)$	<b>new</b>	Implicit in [Grinberg Shaltiel Viola 18]

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- Hadamard:  $\{0,1\}^k \rightarrow \{0,1\}^{2^k}$ ;  $\text{Hadamard}(x) = (\langle x, y \rangle)_{y \in \{0,1\}^k}$
- Impossible to decode when fraction of errors is  $\geq 1/2$ .

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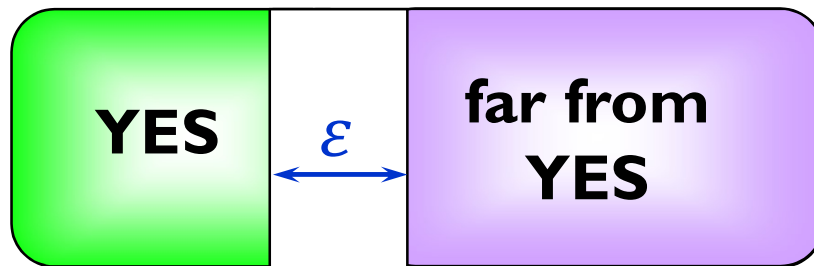
**Erasures decoding better than error-decoding**

An improvement in dependence on  $\alpha$  was suggested by Venkat Guruswami

# Property Testing

## Property Tester

[Rubinfeld Sudan 96,  
Goldreich Goldwasser Ron 98]



Accept  
w.h.p.

Don't  
care

Reject  
w.h.p.

Property = Set of all YES  
instances

1 1 3 3 5 5 7 7 9 9

sorted array

2 1 4 3 6 5 8 7 9 0

1/2-far from sorted

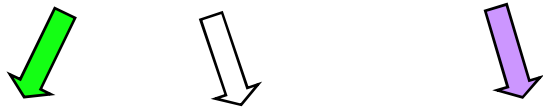
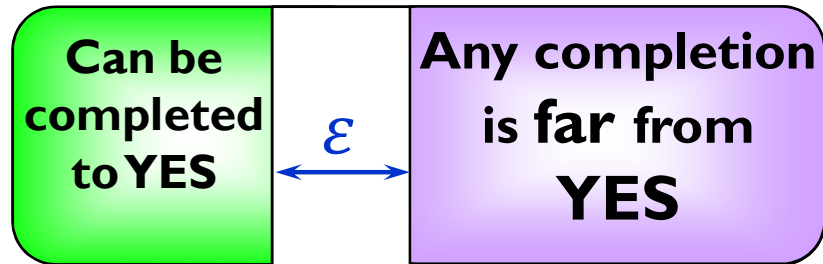
Two objects are at distance  $\epsilon$  = they differ in an  $\epsilon$  fraction of places

# Erasure-Resilient and Tolerant Property Testing

## Erasure-Resilient Property Tester

[Dixit Raskhodnikova Thakurta Varma 16]

$\leq \alpha$  fraction of the input is erased  
adversarially



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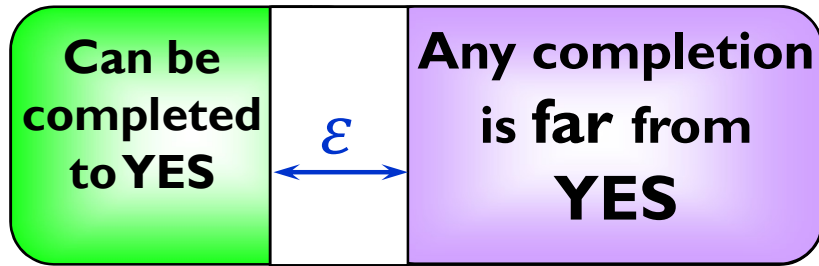
**$\alpha$ -erasure-resilient  $\epsilon$ -testing**

# Erasure-Resilient and Tolerant Property Testing

## Erasure-Resilient Property Tester

[Dixit Raskhodnikova Thakurta Varma 16]

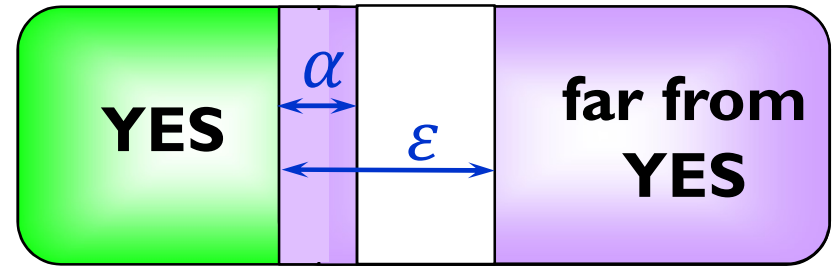
$\leq \alpha$  fraction of the input is erased  
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## Tolerant Property Tester

[Parnas Ron Rubinfeld 06]

$\leq \alpha$  fraction of the input is erroneous



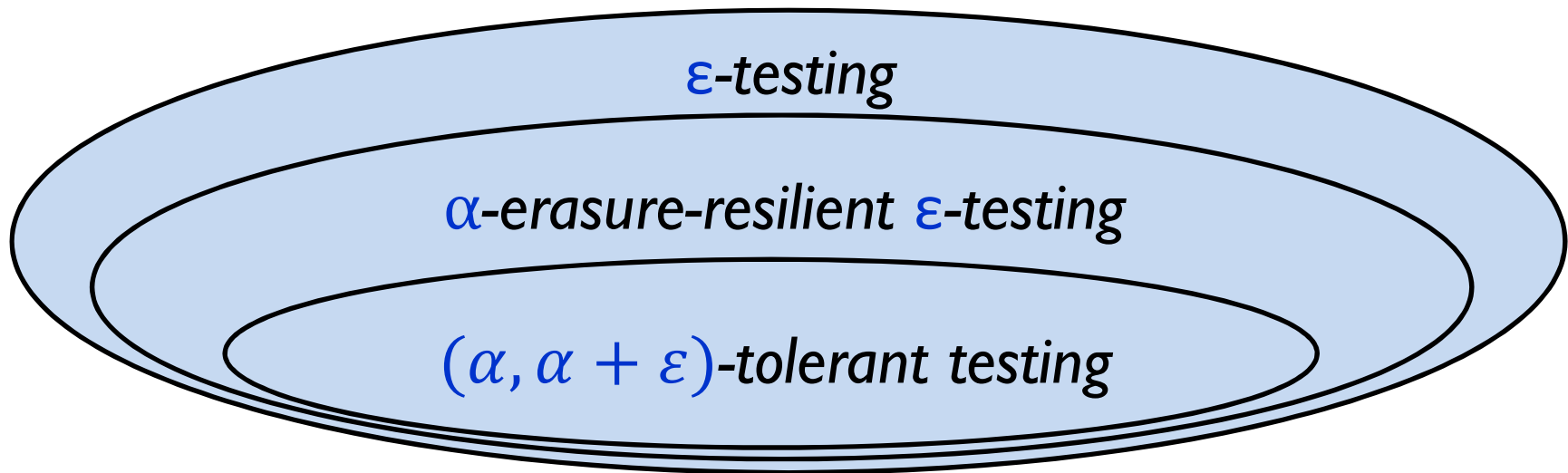
**$\alpha$ -erasure-resilient  $\epsilon$ -testing**

**$(\alpha, \epsilon)$ -tolerant testing**



# Relationships Between Models

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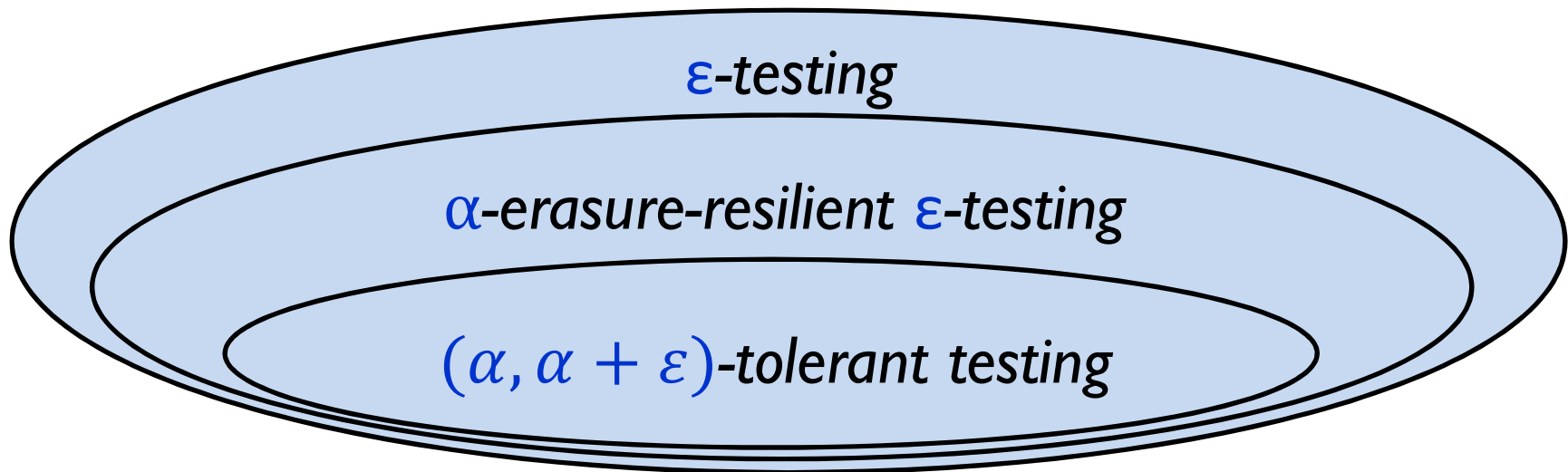


# Relationships Between Models

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Containments are strict:

- [Fischer Fortnow 05]: standard vs. tolerant
- [Dixit Raskhodnikova Thakurta Varma 16]: standard vs. erasure-resilient
- **Our Result:** erasure-resilient vs. tolerant



# Our First Separation Result

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## First Separation Theorem

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There is a property of  $n$ -bit strings that

- can be erasure-resiliently tested with **constant** query complexity,
- but requires  $\Omega(\log n)$  queries for tolerant testing.

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## Main Tools

Separation between erasures  
and errors in local list  
decoding Hadamard codes

PCPs of proximity [BenSasson  
Goldreich Harsha Sudan Vadhan 06, Dinur  
Reingold 06, Dinur 07]  
(~ PCPs for property testing  
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Error-tolerant testing is harder than  
erasure-resilient testing in general.

# Strengthened Separation Result

## Strengthened Separation Theorem

There is a property of  $n$ -bit strings that

- can be erasure-resiliently tested with **constant** query complexity,
- but requires  ~~$\Omega(\log n)$~~   $n^{\Omega(1)}$  queries for tolerant testing.

## Main Tools

Separation between erasures  
and errors in **approximate**  
local list decoding ~~Hadamard~~  
~~codes~~

PCPs of proximity [BenSasson  
Goldreich Harsha Sudan Vadhan 06, Dinur  
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(~ PCPs for property testing  
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Error-tolerant testing is **much** harder than  
erasure-resilient testing in general.

# Errors and Erasures in Local Decoding

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- **Local decoding implies local erasure-decoding**
  - locally decodable from at most an  $\alpha$  fraction of errors  $\Rightarrow$  locally decodable from at most an  $2\alpha$  fraction of erasures
  - Also holds for local list decoding and approximate local list decoding

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  - locally decodable from at most an  $\alpha$  fraction of errors  $\Rightarrow$  locally decodable from at most an  $2\alpha$  fraction of erasures
  - Also holds for local list decoding and approximate local list decoding
- **Local erasure-decoding implies local decoding** (up to some parameters)
  - locally decodable from at most an  $\alpha$  fraction of erasures using  $q$  queries  $\Rightarrow$  locally decodable from at most an  $\alpha/O(q^2 \cdot 9^q)$  fraction of errors using  $O(q \cdot 3^q)$  queries



# Open Questions

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- Even stronger separation between erasure-resilient and tolerant testing -- constant vs. linear?
- Separation between errors and erasures for a "natural" property?
- Constant-query, constant list size, local list erasure-decodable codes with inverse polynomial rate?

**Thank you!**