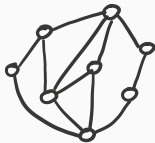


Testable Properties in General Graphs and Random Order Streaming

Artur Czumaj, *Hendrik Fichtenberger*, Pan Peng, Christian Sohler

Property Testing: in a Nutshell



planar ✓

Property Testing: in a Nutshell



planar ✓



non-planar ✗

Property Testing: in a Nutshell



planar ✓

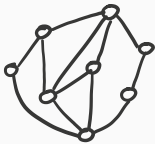


non-planar ✗



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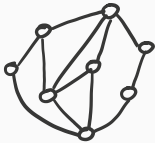
non-planar ✗



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time complexity: $\Omega(|V|)$

Property Testing: in a Nutshell



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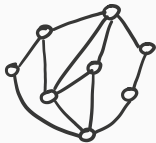
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Property Testing: in a Nutshell



planar ✓



slightly non-planar ✗



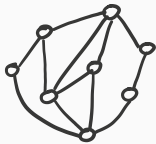
quite non-planar ✗



very non-planar ✗

time complexity: $\Omega(|V|)$

Property Testing: in a Nutshell



planar ✓



slightly non-planar ✓/✗



quite non-planar ✗



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time complexity: $\Omega(|V|)$

Property Testing: in a Nutshell



planar ✓



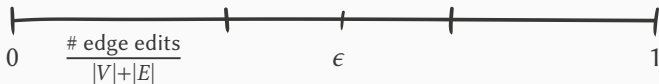
non-planar ✓/✗



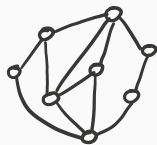
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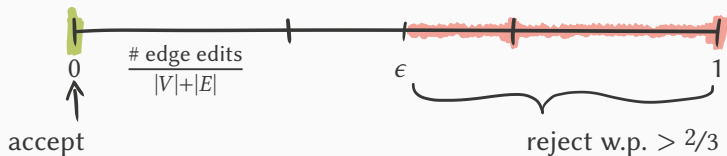
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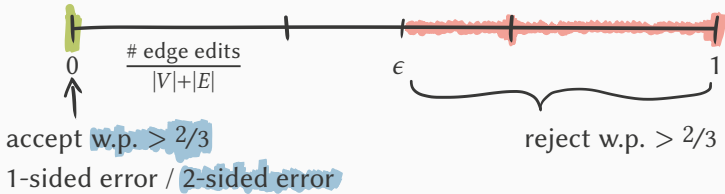
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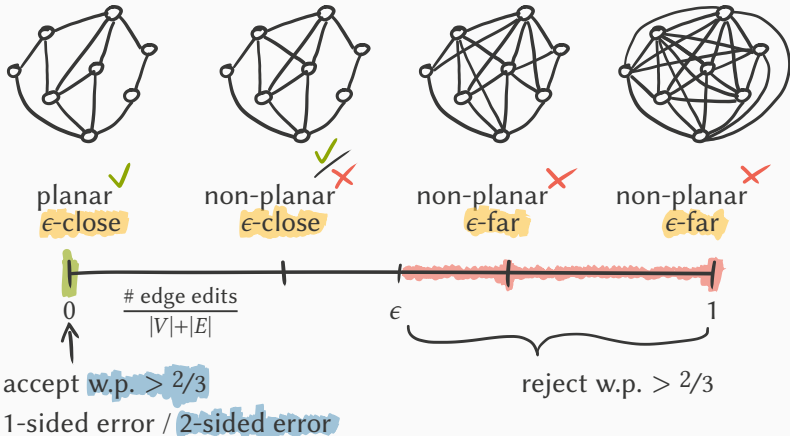
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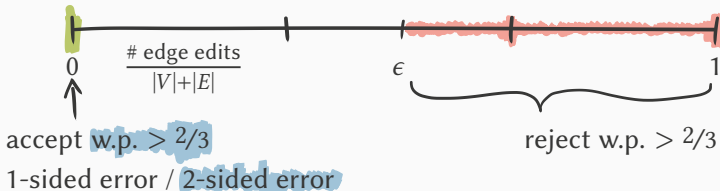
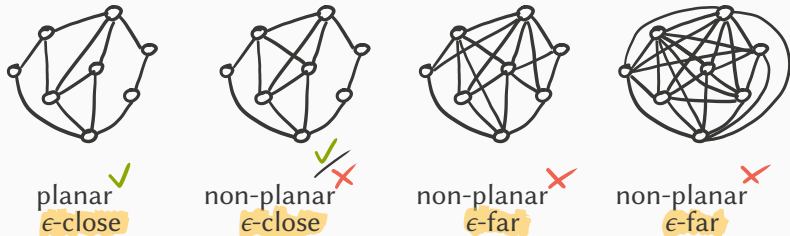
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Property Testing: in a Nutshell



Property Testing: in a Nutshell



complexity: # queries to data structure


The Bounded-Degree Model

- ☒ bounded-degree model: $\forall v \in V : d(v) \leq d, d \in O(1), n := |V|$
- ☒ input structure: adjacency lists (1 query $\hat{=}$ 1 entry)
- ☒ error: 1-sided

The Bounded-Degree Model

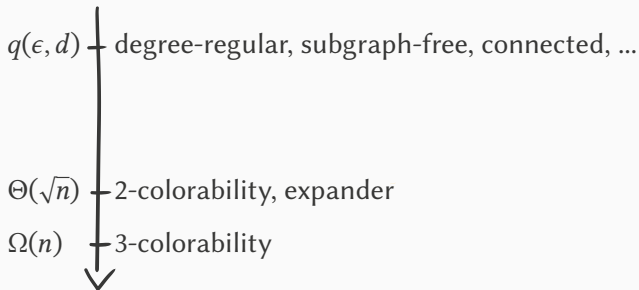
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$q(\epsilon, d)$ — degree-regular, subgraph-free, connected, ...



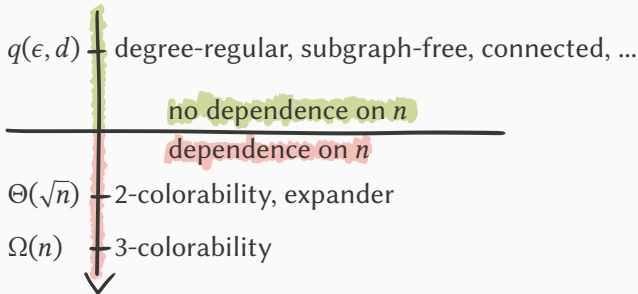
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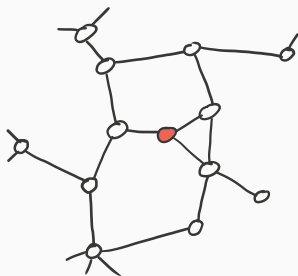
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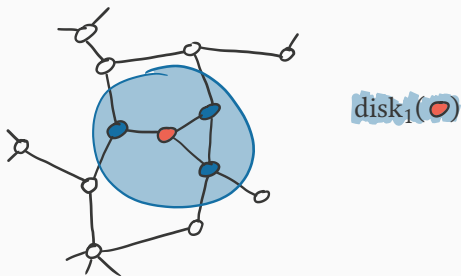
q-Disks / q-Hop Neighborhoods

$\text{disk}_q(v)$: unlabelled subgraph induced by BFS(v) of depth q



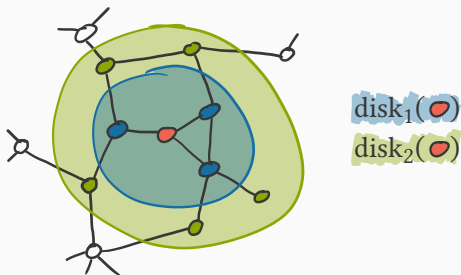
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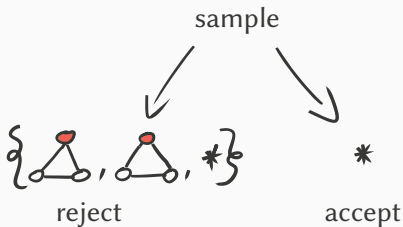


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Constant-Query Testers



Theorem [GR'09, ...]

A property tester for bounded-degree graphs with constant query complexity $q := q(\epsilon)$ can be transformed into an algorithm that

1. obtains a uniform sample S of $\Theta(q)$ many q -disks
2. rejects iff S is from a family of forbidden sets of q -disks

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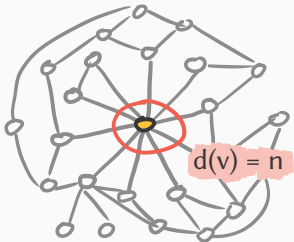
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What can a constant-query
property tester do?

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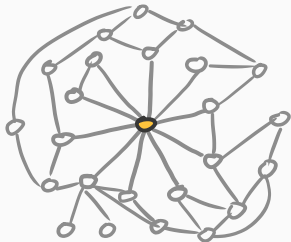
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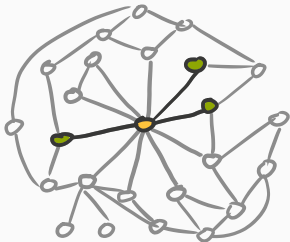
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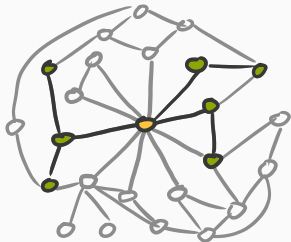
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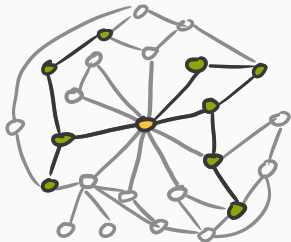
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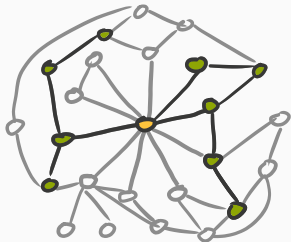
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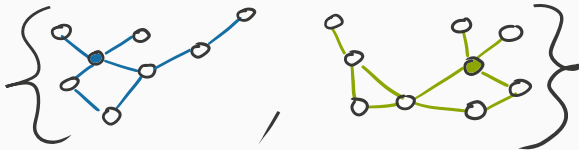
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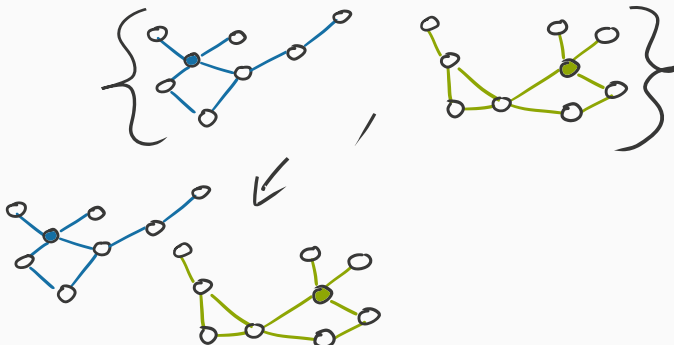
random / subsampling BFS

tester obtains at most q many q -disks (with bounded degree q)

Bounded Degree vs. General Graphs

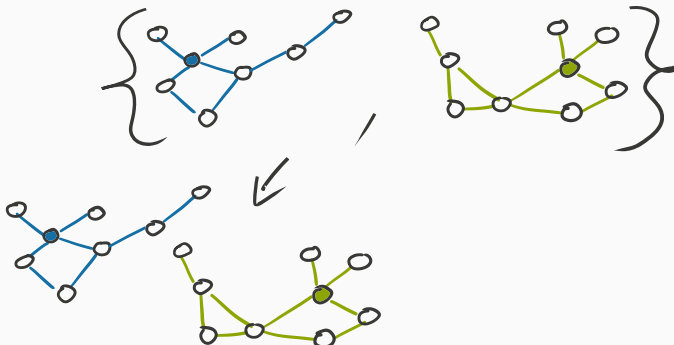


Bounded Degree vs. General Graphs



in bounded-degree graphs:
random q -disks disjoint w.h.p.

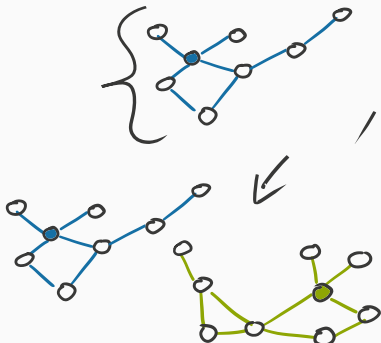
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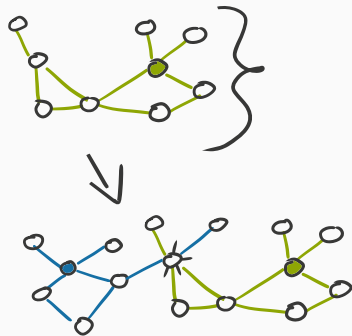
↓
bijective decomposition ✓
of BFS subgraphs into q -disks

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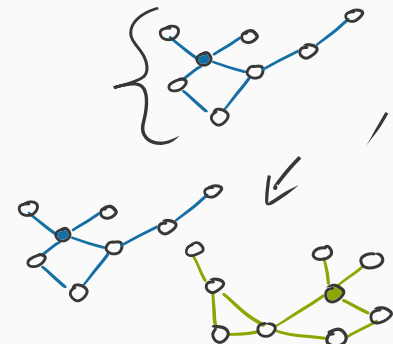
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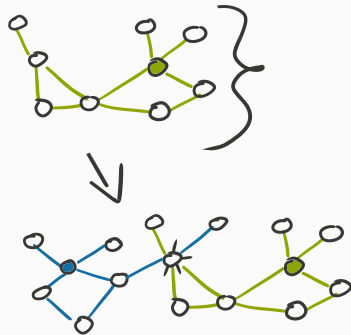
in general graphs:
 q -disks may intersect

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↓
ambiguous decomposition ✗

The Problem of Intersecting q -Disks

problem: two random BFS visit the same vertex

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 only likely for linear degree vertices

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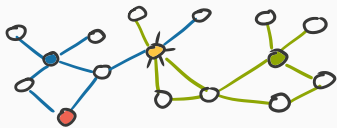
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solution: assign unique **color** to high degree vertices

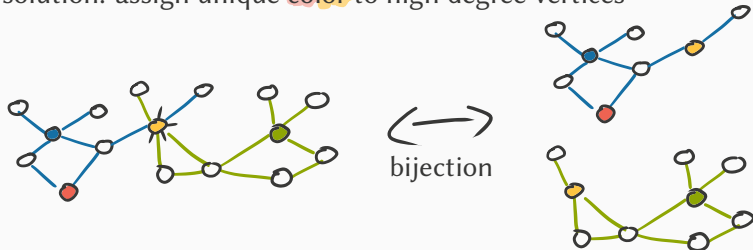


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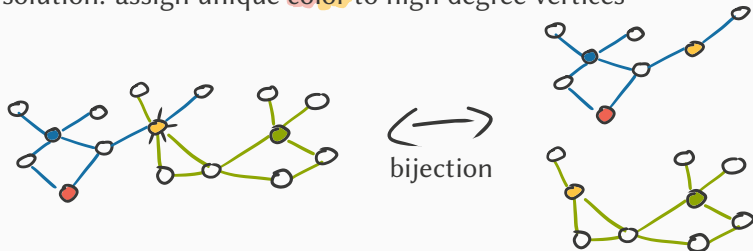


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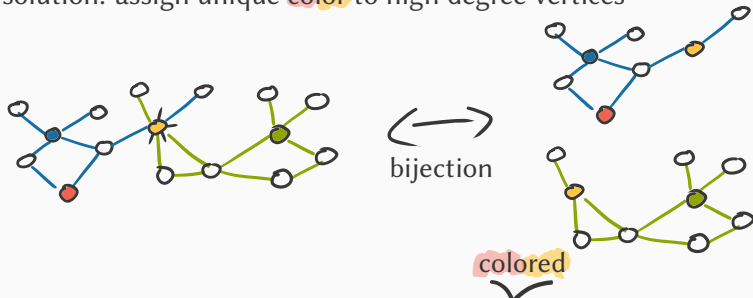
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Constant-Query Testers in the Random-Neighbor Model

Theorem

A property tester *for general graphs in the random-neighbor model* with constant query complexity $q := q(\epsilon)$ can be transformed into an algorithm that

1. obtains a uniform sample S of colored q -disks by performing $\Theta(q)$ random BFS (the number of colors is $O(1)$)
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why q -disks and not simply forbidden *subgraphs*?

The Streaming Model

- ✘ general graphs
- ✘ input structure: adjacency lists
- ✘ error: 1-sided

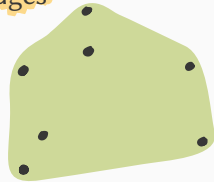
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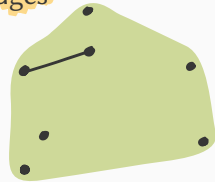
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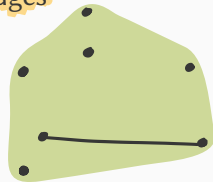
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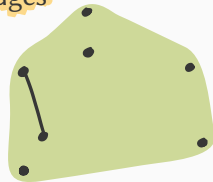
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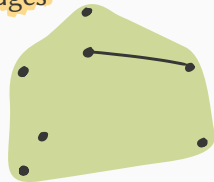
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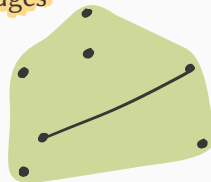
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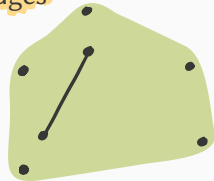
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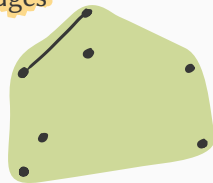
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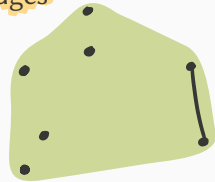
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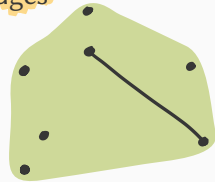
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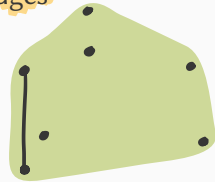
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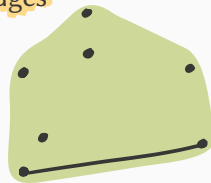
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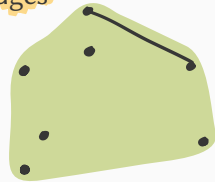
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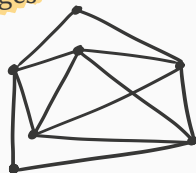
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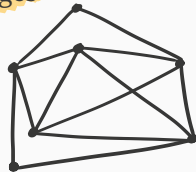
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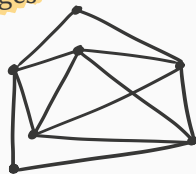
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objective: $o(n)$ space



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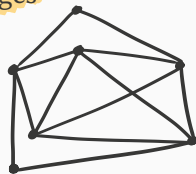


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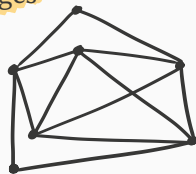


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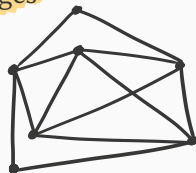


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- recent model: random-order streams

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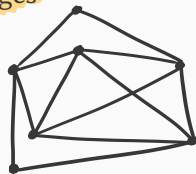
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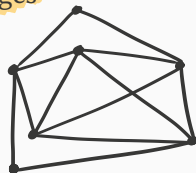
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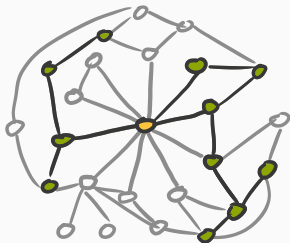
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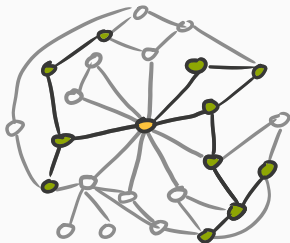
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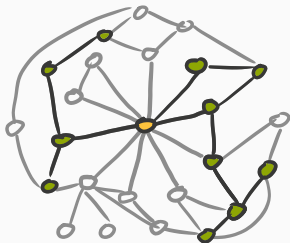
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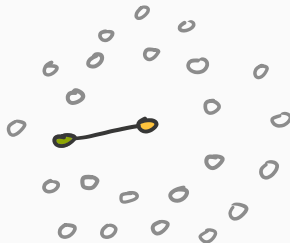
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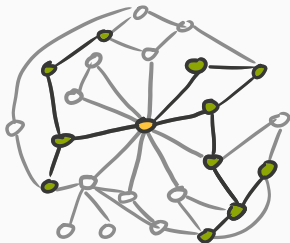
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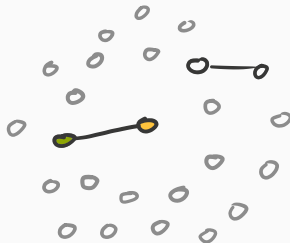
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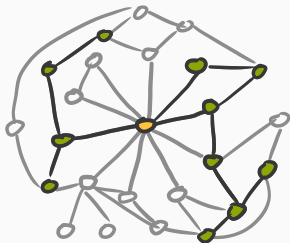
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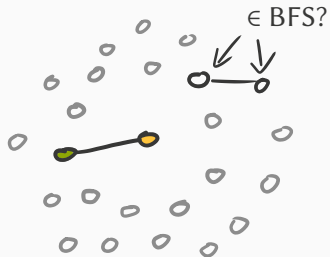
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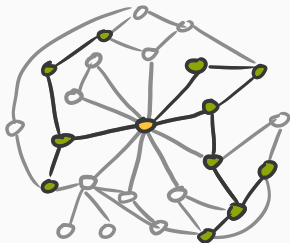
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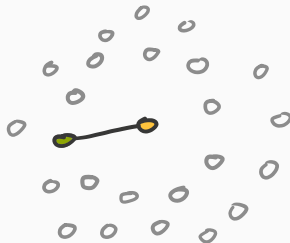
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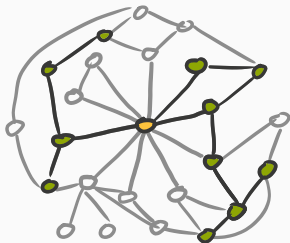


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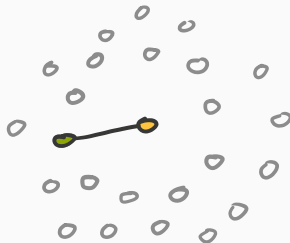
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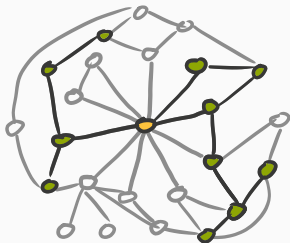
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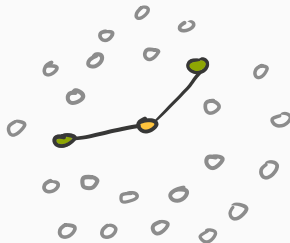
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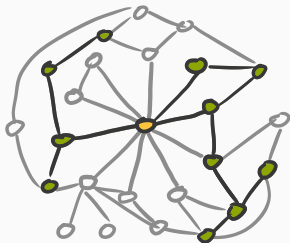
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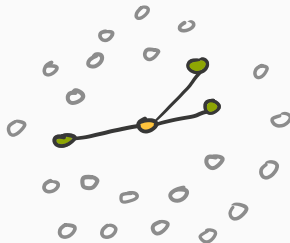
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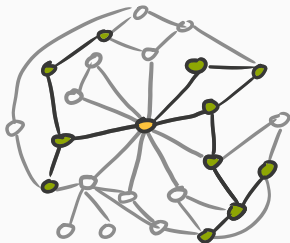
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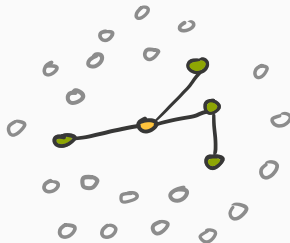
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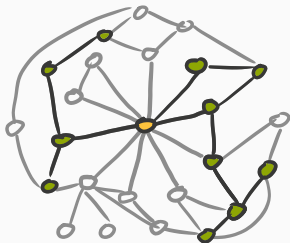
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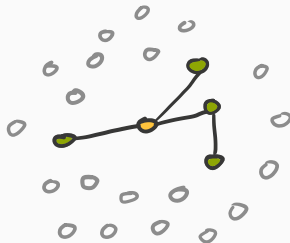
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then: bound probabilities to see colored q -disks independently

From Constant-Query to Streaming Testers

Theorem

Every constant-query property tester for general graphs in the random-neighbor model with one-sided error and constant query complexity admits a $O(\log n)$ space random order streaming tester.

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open problem: similar result for testers with two-sided error