

A Study on Fixed-Parameter Algorithms and Property Testing

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Outline

- 1 Introduction
 - Fixed-parameter algorithms
 - Property testing
 - Motivations
- 2 Our contributions

Introduction:

Fixed-parameter algorithms



Fixed-parameter algorithms

A parameterized problem

A language $L \subseteq \Sigma^* \times \mathbb{Z}^+$ that consists of input pairs (I, k) .

- The first component: problem instance (Σ : finite alphabet).
 - The second component: **parameter**.
-
- **Fixed-parameter algorithms:**
 - Solving parameterized problems in $O(f(k) \cdot \text{poly}(n))$ time.
 - $f(k)$: an arbitrary function solely depending on k .
 - Characteristics of fixed-parameter algorithms:
 - They can be used to solve **NP**-hard problems exactly.
 - **Efficient when k is small.**
 - Problems admit such algorithms: **FPT** (fixed-parameter tractable).

Fixed-parameter algorithms (contd.)

This research field has been very active since 1990s.

- Articles in this field appear in important conferences.
 - FOCS, STOC, SODA, ICALP, STACS, MFCS, SWAT, ISAAC, ESA, WG, IPEC, etc.
 - IPEC: International Symposium on [Parameterized and Exact Computation](#).
- At least three monographs & books in this field.
 - R. G. Downey & M. R. Fellows: *Parameterized Complexity*. Springer-Verlag, New York, 1999.
 - J. Flum & M. Grohe: *Parameterized Complexity Theory*. Springer-Verlag, 2006.
 - R. Niedermeier: *Invitation to Fixed-Parameter Algorithms*. Oxford University Press, 2006.
- Well-known experts in this field:
 - H. L. Bodlaender, J. Chen, E. Demaine, M. R. Fellows, R. Niedermeier, P. Rossmanith, etc.

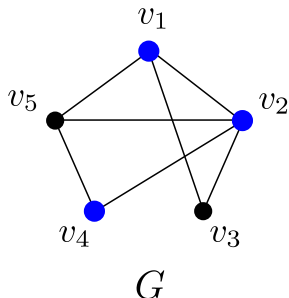


Fixed-parameter algorithms (contd.)

- The main tasks in this field:
 - Find the “parameters” which make **NP**-hard problems difficult.
 - Improve known **FPT** results.
 - e.g., $O(2^k n^2) \rightarrow O(1.62^k n^2) \rightarrow \dots \rightarrow O(1.2738^k + kn)$.
- Common types of parameters:
 - Target size (e.g., the size of a vertex cover)
 - Structure of the input (e.g., the treewidth of a graph)

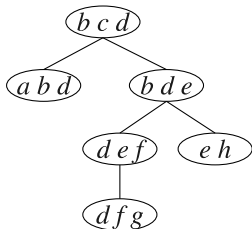
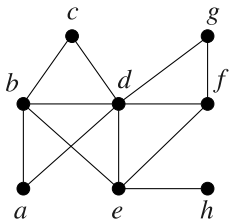
A parameter associated with the **target**: vertex cover

- Given a graph $G = (V, E)$,
 $C \subseteq V$ is a **vertex cover**:
 each edge in E has at least one of its endpoints in C .
- The Vertex Cover problem:
 Determine if a graph has a vertex cover of size $\leq k$:
 ▷ **FPT**: $O(1.2738^k + kn)$
 [Chen *et al.* 2010].



A parameter associated with the input structure: treewidth

- Tree-decomposition of a graph:



- The *width* of the tree-decomposition: $|\text{maximum bag}| - 1$.
- The **treewidth** of G : the minimum width over all tree-decompositions of G .

A parameter associated with the **input structure**: treewidth

- Roughly speaking, treewidth measures **how close a graph is to being a tree**.
- Many **NP**-hard graph problems can be solved in polynomial time or even linear time when the treewidth of the input graph is bounded.
 - the Maximum Independent Set problem
 - the Minimum Dominating Set problem
 - the Hamiltonian Cycle problem
 - \vdots

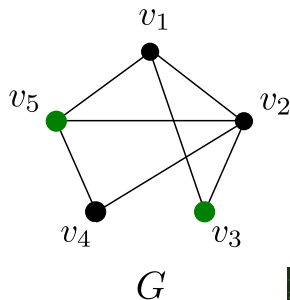
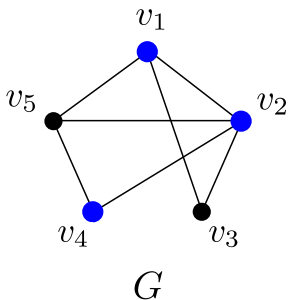
Fixed-parameter *intractable*?

- $I \subseteq V$ is an independent set:
 - None of pairs of the vertices in I are adjacent.
- ★ A well-known fact:
 - A graph G has a vertex cover of size k
 $\Leftrightarrow G$ has an independent set of size $k' = n - k$.

The Independent Set problem, the Clique problem,
the Dominating Set problem, ..., etc.

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- \exists an $O(f(k') \cdot \text{poly}(n))$ algorithm \mathcal{A} for the Independent Set problem
 $\Rightarrow \mathcal{A}$ can be used to solve the Vertex Cover problem efficiently even when $k = n - k'$ is large.
- Fixed-parameter intractable problems:
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Introduction: Property testing



Property testing

- General notion: Rubinfeld & Sudan (*SIAM J. Comput.* 1996).
 - Graph property testing: Goldreich, Goldwasser & Ron (*J. ACM* 1998).

Task of property testing

Input: An input I and a specified property \mathcal{P}

Task: Fulfill the following requirements in $o(|I|)$ time.

- If I **satisfies** $\mathcal{P} \Rightarrow$ answer “yes” with prob. $\geq \frac{2}{3}$; (= 1: 1-sided error)
- If I is **far from satisfying** $\mathcal{P} \Rightarrow$ answer “no” with prob. $\geq \frac{2}{3}$.
- A notion of “approximating” yes/no problems in **sublinear** time.
 - $f(n) = o(g(n))$ if $\lim_{n \rightarrow \infty} f(n)/g(n) = 0$.
- **Property testers:** algorithms accomplishing the above task.

Property testing (contd.)

This research field has been very active since 1996.

- Articles in this field appear in important conferences.
 - FOCS, STOC, SODA, ICALP, STACS, ESA, APPROX+RANDOM, etc.
- Surveys for this field:
 - ★ [Goldreich 1998], [Fischer 2001], [Ron 2001], [Alon & Shapira 2005].
- Well-known experts in this field:
 - N. Alon, A. Czumaj, L. Fortnow, O. Goldreich, D. Ron, R. Rubinfeld, A. Shapira, L. Trevisan, etc.

Property testing (ϵ -far)

- In property testing, we use ϵ -far to say that the input is far from a certain property.
- ϵ : the least fraction of the input that needs to be modified.
- For example, $L = (0, 2, 1, 4)$ over $\{0, 1, 2, 3, 4\}$ is $1/4$ -far from being monotonically nondecreasing.
 - $(0, 2, 1, 4) \Rightarrow (0, 2, 3, 4)$.

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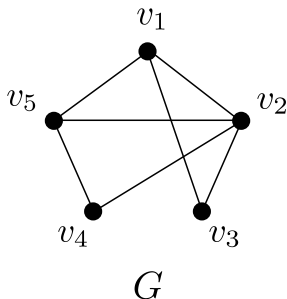
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G is $\frac{1}{2}$ -far from having a vertex cover of size ≤ 2 .

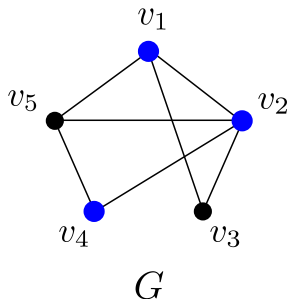
	v_1	v_2	v_3	v_4	v_5
v_1	–	1	1	0	1
v_2	–	–	1	1	1
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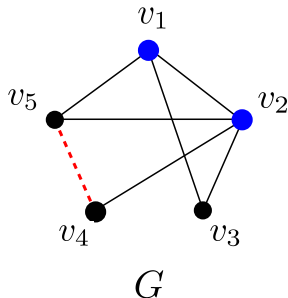
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Property testing (ϵ -far)

G is $(1/10)$ -far from having a vertex cover of size ≤ 2 .

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Property testing (contd.)

- A property is
 - **testable**: it admits a property tester of time complexity **independent of the input size**.
 - **easily-testable**: it admits a **1-sided-error** property tester of time complexity $O(\text{poly}(1/\epsilon))$.
- A property tester is **non-adaptive**: it makes queries to the input **without** knowing the results of previous ones.
- Time complexity = $\Omega(\#queries)$.

The sparse / dense model for testing graph properties

★ The sparse model

- $f_G : V(G) \times [d] \mapsto V(G) \cup \emptyset$
(adjacency list)
 - $[d] := \{1, 2, \dots, d\}$
 - $f_G(v, i) = u$: (u, v) is the i th edge incident to v .
 - $f_G(v, i) = \emptyset$: there is no such edge.
- ϵ -far:
 $\geq \epsilon dn$ edge insertions or removals are required.

★ The dense model

- $M_G : V(G) \times V(G) \mapsto \{0, 1\}$
(adjacency matrix)
 - $M_G(v, u) = 1$: u and v are adjacent.
- ϵ -far:
 $\geq \epsilon n^2$ edge insertions or removals are required.

Testable & easily testable results

Some graph properties that are testable, and even easily testable.

★ In the sparse model

- connectivity & k -connectivity (easily-testable)
- being cycle-free
- being Eulerian (easily-testable)
- minor-closed properties
- ...

★ In the dense model

- being H -free (easily-testable iff H is bipartite)
- being induced H -free (not easily-testable if $H \notin \{P_2, \bar{P}_2, P_3, \bar{P}_3, P_4, \bar{P}_4, C_4, \bar{C}_4\}$)
- k -colorability (easily-testable)
- Having a clique of size $\geq \rho n$ for $\rho \in (0, 1)$
- Hereditary graph properties
- ...

Non-testable results

Some graph properties that are NOT (or remain unknown) to be testable.

★ In the sparse model

- bipartiteness
- k -colorability for general $k \geq 3$
- Having a dominating set of size $\leq \rho n$ for $\rho \in (0, 1)$
- Having a vertex cover of size $\leq \rho n$ for $\rho \in (0, 1)$
- ...

★ In the dense model

- first-order graph properties with a quantifier alternation of type 'EA'
- ...

Motivations

- Some properties cannot be tested efficiently, even non-testable.
- **FPT** problems can be efficiently solved when the parameters are small.
- We wish to know:
 - the parameters that make property testing difficult;
 - whether some properties can be tested more efficiently when some parameters are small.

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Motivations: parameterized property testing

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- **FPT** problems can be efficiently solved when the parameters are small.
- We wish to know:
 - the parameters that make property testing difficult;
 - whether some properties can be tested more efficiently when some parameters are small.
- ★ A new concept: [Parameterized property testing](#)
 - Introducing parameters to the standard property testing.

Parameterized property testing

Parameterized property testers

Input: An input instance I , $\epsilon \in (0, 1)$, and a parameter $k \in \mathbb{Z}^+$.

Property: \mathcal{P} .

Task: Testing if I has the property \mathcal{P} in $O(f(k, 1/\epsilon) \cdot o(|I|))$ time.

- $f(k, 1/\epsilon)$: a function solely depending on k and ϵ .
- $O(f(k, 1/\epsilon))$ time \Rightarrow parameterized testable.

Parameterized property testing (previous work)

Positive results:

- k -colorability in the dense model:
 - $O(k^2 \ln^2 k / \epsilon^4)$ [Alon & Krivelevich 2002].
- being H -free (without having H as a subgraph; $|H| = h$) in the dense model:
 - $O(h^2(1/2\epsilon)^{h^2/4})$ [Alon 2002].
- k -connectivity in the sparse model: (weakly uniform)
 - $O(d(ck/\epsilon d)^k \log(k/\epsilon d))$ [Yoshida & Ito 2008].
 - For $n \leq \max\{120k^3, 400k^3/\epsilon d\} \Rightarrow$ Using an $O(\text{poly}(n)) = O(\text{poly}(k/\epsilon d))$ algorithm.

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Parameterized property testing (previous work)

A negative result:

- k -colorability for $k \geq 3$ in the *sparse* model:
 - $\Omega(n)$ [Bogdanov, Obata & Trevisan 2002].



Parameterized property testing (trivial to test for small k 's)

Properties are trivial to test when k is small (in the sparse model):

- **Having a simple k -path / k -cycle** (\in **FPT**).
 - ★ $O(k)$ edge insertions for any graph. (e.g., $k < \epsilon dn$)
 - Answer “yes” for any input graph.
- **Having a dominating set of size $\leq k$** (\notin **FPT**).
 - ★ k vertices have $\leq k \cdot d$ neighbors.
 - Answer “no” for any input graph.
- **Having a clique / an independent set of size $\leq k$** (\notin **FPT**).
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When k is large, just run the exact algorithms. \Rightarrow **weakly uniform**

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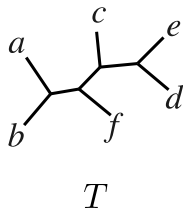
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Tackle a problem in computational biology through three aspects

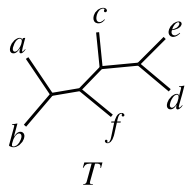
- In this dissertation, we study a problem related to **consistency of quartet topologies**.
 - It's a problem originated from computational biology,
 - **evolutionary tree reconstruction**.
- ★ We tackle the problems through the following algorithmic aspects:
 - fixed-parameter algorithms
 - property testing
 - parameterized property testing

Evolutionary trees

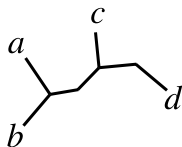
- S : a set of taxa; $|S| = n$.
- An **evolutionary tree** T on S :
 - An *unrooted, leaf-labeled* tree;
 - The leaves are bijectively labeled by the taxa in S ;
 - Each internal node has degree *three*.



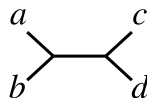
Evolutionary trees & quartets (contd.)



(i)

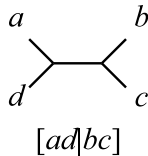
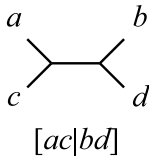
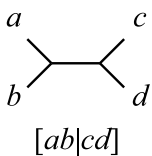


(ii)

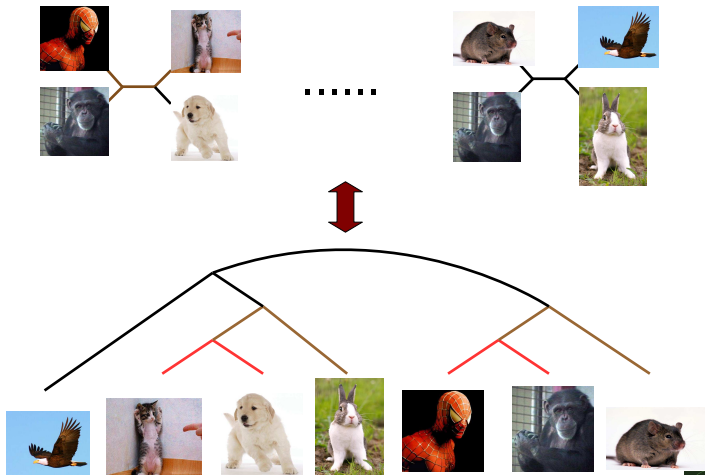


(iii)

Evolutionary trees & quartets (contd.)



Evolutionary trees & quartets (contd.)



A set Q of quartet topologies over $\{a, b, c, d, e, f\}$:

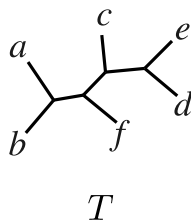
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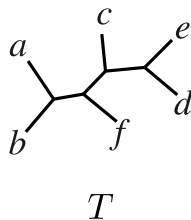


Quartet errors w.r.t. T .

- Determine if Q has 0 quartet error: **NP-complete** [Steel 1992].

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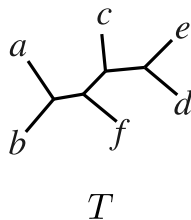


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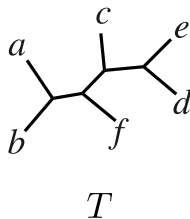


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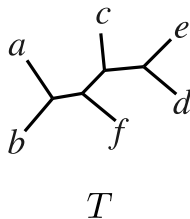


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- Compute # quartet errors of Q : NP-hard [Berry *et al.* 1999];
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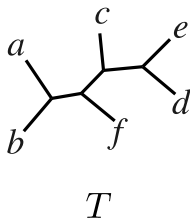


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Contribution: Fixed-parameter algorithms for MQI

- MQI: minimum quartet inconsistency

The parameterized MQI problem

Input: A **complete** set Q of quartet topologies, $k \in \mathbb{Z}^+$.

Task: Determine if Q has $\leq k$ quartet errors.

- Previous results:
 - ★ $O(4^k n + n^4)$ [Gramm & Niedermeier 2003].
- Our results:
 - $O(3.0446^k n + n^4)$, $O(2.0162^k n^3 + n^5)$, $O^*((1 + \varepsilon)^k)$.
 - $O^*((1 + \varepsilon)^k)$: $\varepsilon \downarrow$, the polynomial factor \uparrow .
 - ★ Chang, Lin, & Rossmanith: *Theory Comput. Syst.*, 2010.

Contribution: Fixed-parameter algorithms for MQI

- MQI: minimum quartet inconsistency

The parameterized MQI problem

Input: A **complete** set Q of quartet topologies, $k \in \mathbb{Z}^+$.

Task: Determine if Q has $\leq k$ quartet errors.

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Contribution: Testing tree-consistency of quartet topologies

The property: **tree-consistent**

- Q is tree-consistent: 0 quartet errors.

Testing tree-consistency of a complete Q

Input: A **complete** set Q of quartet topologies, $0 < \epsilon < 1$.

Task: Testing if Q is tree-consistent.

- Determine if a complete Q is tree-consistent: $O(n^4)$ [Erdős *et al.* 1999].

Our result:

- An $O(n^3/\epsilon)$ property tester (1-sided error & non-adaptive).
 - ★ Chang, Lin, & Rossmanith: *Theory Comput. Syst.*.
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Contribution: Parameterized property testing for tree-consistency

Missing quartets: quartets whose topologies are *missing*.

- T_{miss} : a set of k missing quartets.

Testing tree-consistency with k missing quartets

Input: A set Q of quartet topologies, a set T_{miss} of k missing quartets,
 $0 < \epsilon < 1$.

Task: Testing if Q is tree-consistent.

- Determine if Q is tree-consistent: **NP**-complete [Steel 1992].

Our results:

- Indicate: deterministically solvable in $O(3^k n^4)$ time.
 - An $O(k3^k n^3/\epsilon)$ property tester (1-sided error, non-adaptive & uniform)
- ★ Lin: *Proc. Workshop on Combin. Math. Comput. Theory*, 2011.

Contribution: Parameterized property testing for tree-consistency

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 - ★ Lin: *Proc. Workshop on Combin. Math. Comput. Theory*, 2011.



Summary of our contributions in quartet consistency

Property (Problem)	PC	PT	PPT
MQI	$O(3.0446^k n + n^4)$ $O(2.0162^k n^3 + n^5)$ $O^*((1 + \epsilon)^k)$	–	–
\mathcal{P}_{tree}	–	$O(n^3/\epsilon)$	$O(k3^k n^3/\epsilon)$

PC: parameterized complexity; PT: property testing; PPT: parameterized property testing.
MQI: minimum quartet inconsistency; \mathcal{P}_{tree} : tree-consistency.

Two more results on parameterized property testing



Parameterized property testing for two graph properties

For the following two problems in **NP-hard** \cap **FPT**:

- the **Vertex Cover problem** and
- the **Treewidth problem**,

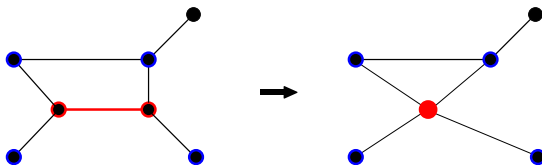
we propose parameterized property testers for their corresponding properties.

Parameterized property testers (Vertex Cover)

- The property: **Having a vertex cover of size $\leq k$.**
 - Denoted it by $\mathcal{P}_{VC \leq k}$.
- Previous results:
 - **FPT:** $O(1.2738^k + kn)$ [Chen *et al.* 2010]
 - **Property testing:**
 - $2^2 \cdot \dots \cdot 2^2 \left. \vphantom{2^2} \right\} O(\text{poly}(1/\epsilon)) 2$'s (dense model) [Alon & Shapira 2008]
 - $\Omega(\sqrt{n})$ for $\mathcal{P}_{VC \leq \rho n}$ (sparse model) [Goldreich & Ron 2002]
- **Our result:** (in the sparse model)
 - ★ $O(1.2738^k + k^2/\epsilon + kd/\epsilon)$ (1-sided error, adaptive & weakly uniform).
 - Joint work with M.-S. Chang, L.-J. Hung, A. Langer & P. Rossmanith.

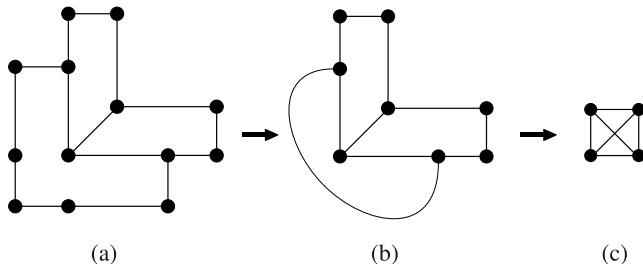
Parameterized property testers (Treewidth)

- Edge contractions.



Parameterized property testers (Treewidth)

- H is a **minor** of G :
 - H can be obtained from G by edge removals, vertex removals and edge *contractions*.



Parameterized property testers (Treewidth)

- Minor-closed properties: closed under taking minors.
- G satisfies a minor-closed property \mathcal{P}
 $\Leftrightarrow \exists$ a finite \mathcal{F} s.t. H is not a minor of G for each $H \in \mathcal{F}$.
[Robertson & Seymour 1983–2004]
- “Having treewidth $\leq k$ ” is minor-closed [Kloks 1994].
 - Yet the obstruction set \mathcal{F} is not explicitly known for $k > 3$.

Parameterized property testers (Treewidth)

- The property: **Having treewidth $\leq k$** .
 - Denoted it by $\mathcal{P}_{tw \leq k}$.
- Previous results:
 - **FPT**: $2^{\Theta(k^3)} \cdot k^{O(1)} \cdot n$ [Bodlaender 1996]
 - **Property testing**: $2^{\text{poly}(1/\epsilon)}$ (sparse model) [Hassidim *et al.* 2009]
 - for minor-closed properties
- **Our results**: (in the sparse model)
 - $2^{d^{O(kd^3/\epsilon^2)}}$
 - $d^{(k/\epsilon)^{O(k^2)}} + 2^{\text{poly}(k,d,1/\epsilon)}$.
 - ★ Both are **uniform** w.r.t. k, d, ϵ ; (2-sided error, adaptive).
 - ★ **Without** using the obstruction set of forbidden minors.
 - Joint work with M.-S. Chang, L.-J. Hung, A. Langer & P. Rossmanith.

A summary of our contributions



Summary of our contributions

Property (Problem)	PC	PT	PPT
MQI	$O(3.0446^k n + n^4)$ $O(2.0162^k n^3 + n^5)$ $O^*((1 + \epsilon)^k)$	–	–
\mathcal{P}_{tree}	–	$O(n^3/\epsilon)$	$O(k3^k n^3/\epsilon)$
$\mathcal{P}_{VC \leq k}$	$O(1.2738^k + kn)$	$2^2 \left. \begin{matrix} \dots \\ \dots \end{matrix} \right\} O(\text{poly}(1/\epsilon)) \text{ 2's}$	$O(1.2738^k + k^2/\epsilon + kd/\epsilon) \ddagger$
$\mathcal{P}_{VC \leq \rho \cdot n}$	–	$\Omega(\sqrt{n}) \ddagger$	–
$\mathcal{P}_{tw \leq k}$	$2^{\Theta(k^3)} \cdot k^{O(1)} \cdot n$	$O(2^{\text{poly}(1/\epsilon)}) \ddagger$	$2^{d^{O(kd^3/\epsilon^2)}} \ddagger$ $d^{(k/\epsilon)^{O(k^2)}} + 2^{\text{poly}(k, d, 1/\epsilon)} \ddagger$

PC: parameterized complexity; PT: property testing; PPT: parameterized property testing.

MQI: minimum quartet inconsistency; \mathcal{P}_{tree} : tree-consistency; $\mathcal{P}_{VC \leq k}$: having a vertex cover of size $\leq k$;
 \mathcal{P}_{tw} : having treewidth $\leq k$; \ddagger : sparse model; \ddagger : dense model.



Summary of our contributions (Testers)

Property	Sublinear	Testable (easily)	Non-adaptive	1/2-sided error	uniform
\mathcal{P}_{tree}	Yes	? (?)	Yes	1	Yes
$\mathcal{P}_{VC \leq k}$	Yes	Yes (no)	No	1	weakly
$\mathcal{P}_{tw \leq k}$	Yes	Yes (?)	No	2	Yes

- ★ Parameterized easily testable: 1-sided error, uniform & $O(\text{poly}(k, d, 1/\epsilon))$ time.



Thanks for your attention.