# Identifying codes and VC-dimension 

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VC-dimension


?

## Part I

## Identifying codes

## Modelization with a graph

Identifying code $C=$ subset of vertices which is

- dominating : $\forall u \in V, N[u] \cap C \neq \emptyset$,
- separating : $\forall u, v \in V, N[u] \cap C \neq N[v] \cap C$.


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## Some facts about identifying codes

- Introduced in 1998 by Karpvosky, Chakrabarty and Levitin
- Exists iff there is no twins


Twins: $N[u]=N[v]$

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- Lower bound:
$\rightarrow A$ vertex is identified by a nonempty subset of $C \Rightarrow|V| \leq 2^{\gamma^{I D}(G)}-1$

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\gamma^{I D}(G) \geq \log (|V|+1)
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Tight example:


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## In restricted classes of graphs?

Example 1: Class of interval graphs


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Example 1: Class of interval graphs


Proposition Foucaud, Naserasr, Parreau, Valicov, 2012+
If $G$ is an interval graph, $\gamma^{I D}(G) \geq \sqrt{2|V|}$.

## In restricted classes of graphs?

Example 2: Class of split graphs


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Stable set


Clique

## Proposition

For infinitely many split graphs $G, \gamma^{I D}(G)=\log (|V|+1)$.

## Proposition Foucaud, 2013

Min-Id-Code is log-APX-hard for split graphs.

Part II

VC-dimension

## Shattered set

- $\mathcal{H}=(V, \mathcal{E})$ an hypergraph
- A set $X \subseteq V$ is shattered if for all $Y \subseteq X$, there exists $e \in \mathcal{E}$, s.t $e \cap X=Y$.


A 2-shattered set


A 3-shattered set

## Vapnik Chervonenkis (VC) dimension of an hypergraph

- A set $X$ is shattered if $\forall Y \subseteq X, \exists e \in \mathcal{E}$, s.t $e \cap X=Y$.
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VC dimension of a graph / of a class of graph

- VC-dimension of $G$ : VC-dim of the hypergraph of closed neighborhoods


VC-dim $(G)=2$

## VC dimension of a graph / of a class of graph

- VC-dimension of G: VC-dim of the hypergraph of closed neighborhoods


$$
\text { VC-dim }(G)=2
$$

- VC-dimension of a class $\mathcal{C}$ : maximal VC-dimension over $\mathcal{C}$
- Class of interval graphs has VC-dimension 2.
- Class of split graphs has infinite VC-dimension.


## Split graphs have infinite VC-dimension

For any $k$, there is a split graph with VC-dimension $k$.


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## Intervals have finite VC-dimension

There is no interval graph with VC-dimension 3.
Assume there is a shattered set $\{1,2,3\}$.
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Interval graphs have VC-dimension at most 2.

## Part III

## Identifying codes and VC-dimension

## Back to identifying codes

| Graph class | Lower bound (order) | Approx |
| :---: | :---: | :---: |
| All | $\log n$ | $\log$ APX-h |
| Split | $\log n$ | $\log$ APX-h |
| Interval | $n^{1 / 2}$ | open |
| Unit Interval | $n$ | 2 |
| Bipartite | $\log n$ | $\log$ APX-h |
| Line graphs | $n^{1 / 2}$ | 4 |
| Chordal | $\log n$ | $\log$ APX-h |
| Planar | $n$ | 7 |
| Cograph | $n$ | 1 |

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| Unit Interval | $n$ | 2 |  |
| Bipartite | $\log n$ | $\log$ APX-h | 2 |
| Line graphs | $n^{1 / 2}$ | 4 | $\infty$ |
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| Line graphs | $n^{1 / 2}$ | 4 | 4 |
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## A dichotomy result

## Theorem



## Infinite <br> 

There are infinitely many $G$,

$$
\gamma^{I D}(G) \approx \log |V|
$$

Finite $d$

$$
\Downarrow
$$

For all $G$,

$$
\gamma^{I D}(G) \geq(|V|-1)^{1 / d}
$$

## Proof - Case with finite VC dimension

## Proposition

If $\mathcal{C}$ has finite $V C$-dimension $d, \forall G \in \mathcal{C}, \gamma^{I D}(G) \geq(|V|-1)^{1 / d}$.

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Proof: direct consequence of:

## Sauer's Lemma

Let $X$ be a subset of vertices of graph $G$ of VC-dimension $d$. The number of distinct traces on $X$ is at most $\sum_{i=1}^{d}\binom{|X|}{i} \leq|X|^{d}+1$.


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Identifying code $\quad \gamma^{I D}(G)$

All vertices $|V| \leq \gamma^{I D}(G)^{d}+1$

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| Interval | $n^{1 / 2}$ | open | 2 |
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| Line graphs | $n^{1 / 2}$ | 4 | 4 |
| Planar | $n$ | 7 | 4 |
| Cograph | $n$ | 1 | 2 |
| Permutation | $n^{1 / 3}$ | open | 3 |
| Unit disk graphs | $n^{1 / 3}$ | open | 3 |

- Lower bound not optimal (ex: Line graphs)


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- Lower bound not optimal (ex: Line graphs)
- What about approximation ?


## Inapproximability in infinite VC dimension

Theorem
If $\mathcal{C}$ has $\infty$ VC-dimension, Min-Id-Code is log-APX-hard on $\mathcal{C}$.

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If $\mathcal{C}$ has $\infty$ VC-dimension, Min-Id-Code is log-APX-hard on $\mathcal{C}$.
Consequence of:

## Proposition

If $\mathcal{C}$ has infinite VC-dimension, $\mathcal{C}$ contains:

- all bipartite graphs, or
- all split graphs, or
- all cobipartite graphs.
and


## Theorem Foucaud, 2013

Min-Id-Code is log-APX-hard on bipartite, split and cobipartite graphs.

## In the finite case?

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| Interval | $n^{1 / 2}$ | open | 2 |
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Is there a constant approximation in finite VC-dimension?

## A class of finite VC-dimension with no good approximation

## Theorem

Min-ID-Code cannot be approximed within a o $(\log |V|)$ factor in polynomial time for the class of bipartite $C_{4}$-free graphs.

- Class of VC-dimension 2
- Reduction from Set covering with intersection 1.


## What about open approximation ?

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| Chordal | $\log n$ | $\log$ APX-h | $\infty$ |
| Interval | $n^{1 / 2}$ | 6 | 2 |
| Unit Interval | $n$ | 2 | 2 |
| Line graphs | $n^{1 / 2}$ | 4 | 4 |
| Planar | $n$ | 7 | 4 |
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## Thank you for your attention!

