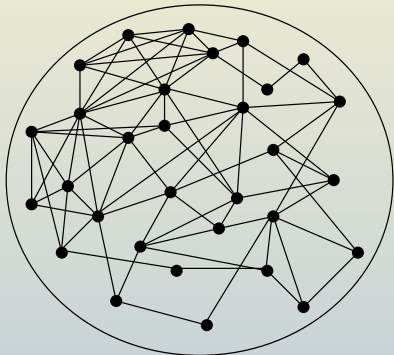


# Subgraph counting problems

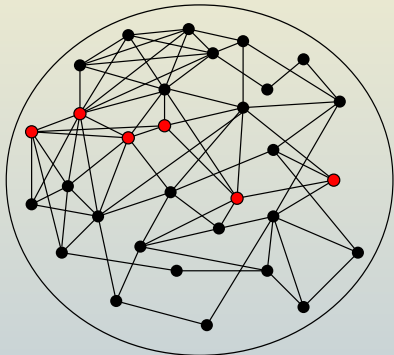
23rd March 2016

Kitty Meeks

Given a graph on  $n$  vertices, we are interested in subgraphs with  $k$  vertices that have particular properties.



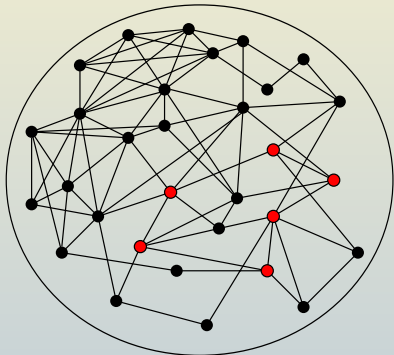
Given a graph on  $n$  vertices, we are interested in subgraphs with  $k$  vertices that have particular properties.



For example:

- Paths on  $k$  vertices

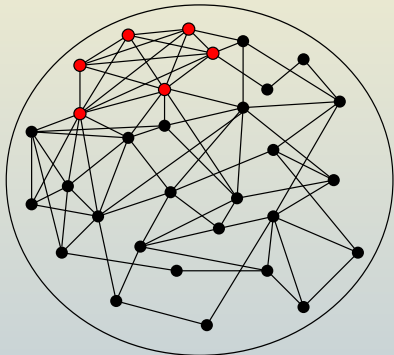
Given a graph on  $n$  vertices, we are interested in subgraphs with  $k$  vertices that have particular properties.



For example:

- Paths on  $k$  vertices
- Cycles on  $k$  vertices

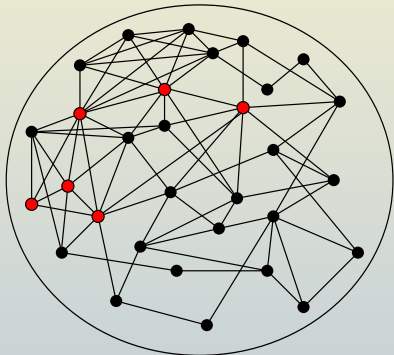
Given a graph on  $n$  vertices, we are interested in subgraphs with  $k$  vertices that have particular properties.



For example:

- Paths on  $k$  vertices
- Cycles on  $k$  vertices
- Cliques on  $k$  vertices

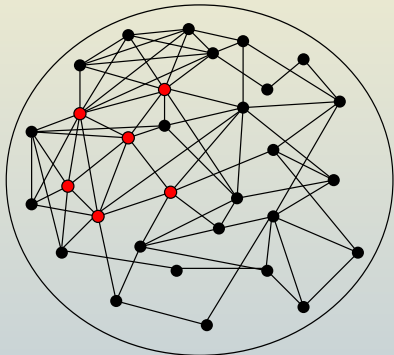
Given a graph on  $n$  vertices, we are interested in subgraphs with  $k$  vertices that have particular properties.



For example:

- Paths on  $k$  vertices
- Cycles on  $k$  vertices
- Cliques on  $k$  vertices
- Connected  $k$ -vertex induced subgraphs

Given a graph on  $n$  vertices, we are interested in subgraphs with  $k$  vertices that have particular properties.



For example:

- Paths on  $k$  vertices
- Cycles on  $k$  vertices
- Cliques on  $k$  vertices
- Connected  $k$ -vertex induced subgraphs
- $k$ -vertex induced subgraphs with an even number of edges

**DECISION**

Is there a witness?



**DECISION**

Is there a witness?

**APPROX COUNTING**

Approximately how  
many witnesses?

**DECISION**

Is there a witness?

**APPROX COUNTING**

Approximately how  
many witnesses?

**EXACT COUNTING**

Exactly how many  
witnesses?

**DECISION**

Is there a witness?

**EXTRACTION**

Identify a single  
witness

**APPROX COUNTING**

Approximately how  
many witnesses?

**EXACT COUNTING**

Exactly how many  
witnesses?

**DECISION**

Is there a witness?

**EXTRACTION**

Identify a single  
witness

**APPROX COUNTING**

Approximately how  
many witnesses?

**UNIFORM SAMPLING**

Pick a single witness  
uniformly at random

**EXACT COUNTING**

Exactly how many  
witnesses?

**DECISION**

Is there a witness?

**EXTRACTION**

Identify a single  
witness

**APPROX COUNTING**

Approximately how  
many witnesses?

**UNIFORM SAMPLING**

Pick a single witness  
uniformly at random

**EXACT COUNTING**

Exactly how many  
witnesses?

**ENUMERATION**

List all witnesses

Consider the  $k$ -cycle problem:

- if  $k = 3$  then we are interested in triangles
- if  $k = n$  then we are interested in Hamilton Cycles

Consider the  $k$ -cycle problem:

- if  $k = 3$  then we are interested in triangles
- if  $k = n$  then we are interested in Hamilton Cycles

We are interested in what happens as  $n$  and  $k$  both tend to infinity, independently, with  $k \ll n$ .

Consider the  $k$ -cycle problem:

- if  $k = 3$  then we are interested in triangles
- if  $k = n$  then we are interested in Hamilton Cycles

We are interested in what happens as  $n$  and  $k$  both tend to infinity, independently, with  $k \ll n$ .

- We can consider all possible  $k$ -vertex subgraphs in time  $O(n^k)$ .



Consider the  $k$ -cycle problem:

- if  $k = 3$  then we are interested in triangles
- if  $k = n$  then we are interested in Hamilton Cycles

We are interested in what happens as  $n$  and  $k$  both tend to infinity, independently, with  $k \ll n$ .

- We can consider all possible  $k$ -vertex subgraphs in time  $O(n^k)$ .
- We would like to be able to answer questions about  $k$ -vertex subgraphs in time  $f(k) \cdot n^{O(1)}$ ; in this case the problem belongs to the parameterised complexity class FPT.

Theorem (Based on Chen, Chor, Fellows, Huang, Juedes, Kanj and Xia, 2005)

*Assuming the Exponential Time Hypothesis, there is no algorithm to determine whether an  $n$ -vertex graph contains a clique on  $k$  vertices in time  $f(k) \cdot n^{o(1)}$ , for any function  $f$ .*

**DECISION**

Is there a witness?

**EXTRACTION**

Identify a single  
witness

**APPROX COUNTING**

Approximately how  
many witnesses?

**UNIFORM SAMPLING**

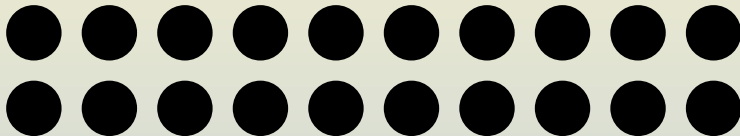
Pick a single witness  
uniformly at random

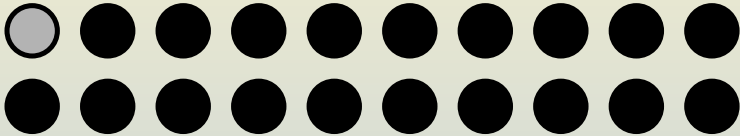
**EXACT COUNTING**

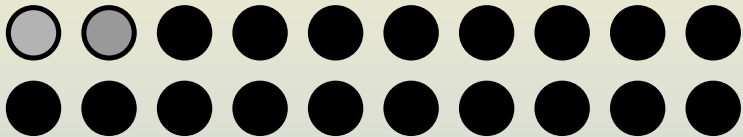
Exactly how many  
witnesses?

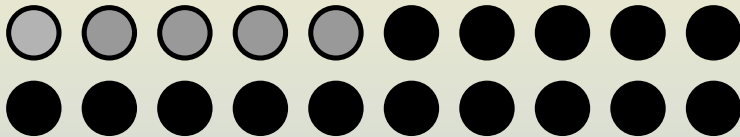
**ENUMERATION**

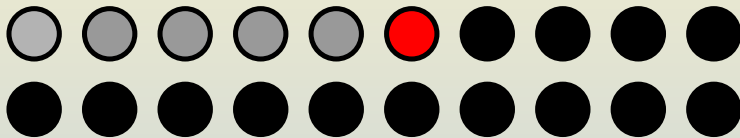
List all witnesses



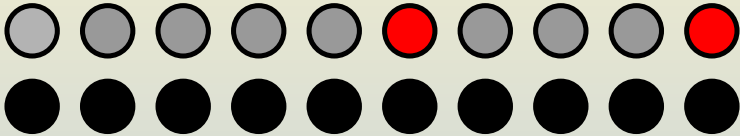


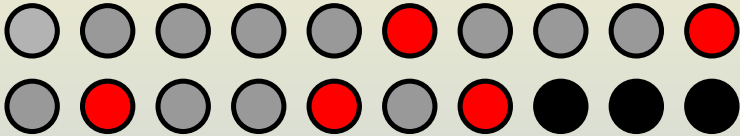


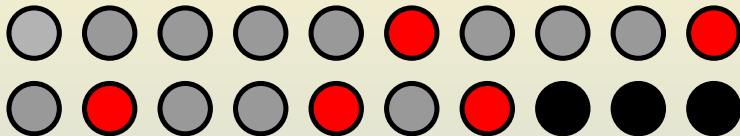












Theorem (Björklund, Kaski and Kowalik, 2014)

*There exists an algorithm that extracts a witness using at most*

$$2k \left( \log_2 \frac{n}{k} + 2 \right)$$

*queries to a deterministic decision algorithm.*

**DECISION**

Is there a witness?

**EXTRACTION**

Identify a single  
witness

**APPROX COUNTING**

Approximately how  
many witnesses?

**UNIFORM SAMPLING**

Pick a single witness  
uniformly at random

**EXACT COUNTING**

Exactly how many  
witnesses?

**ENUMERATION**

List all witnesses

**Question:** Does  $G$  contain a connected induced subgraph on  $k$  vertices?

We can find the maximum component size, and hence answer this question, in  $O(|V| + |E|)$  using a breadth first search.

**Question:** Does  $G$  contain a connected induced subgraph on  $k$  vertices?

We can find the maximum component size, and hence answer this question, in  $O(|V| + |E|)$  using a breadth first search.

Theorem (Jerrum & M., 2015)

*It is #W[1]-complete to count exactly the number of  $k$ -vertex connected induced subgraphs in a given input graph.*

**Question:** Does  $G$  contain a connected induced subgraph on  $k$  vertices?

We can find the maximum component size, and hence answer this question, in  $O(|V| + |E|)$  using a breadth first search.

Theorem (Jerrum & M., 2015)

*It is #W[1]-complete to count exactly the number of  $k$ -vertex connected induced subgraphs in a given input graph.*

Theorem (Jerrum & M., 2015)

*There is an efficient algorithm to count approximately the number of  $k$ -vertex connected induced subgraphs in a given input graph.*

**Question:** Does  $G$  contain a connected induced subgraph on  $k$  vertices?

We can find the maximum component size, and hence answer this question, in  $O(|V| + |E|)$  using a breadth first search.

Theorem (Jerrum & M., 2015)

*It is #W[1]-complete to count exactly the number of  $k$ -vertex connected induced subgraphs in a given input graph.*

Theorem (Jerrum & M., 2015)

*There is an efficient algorithm to count approximately the number of  $k$ -vertex connected induced subgraphs in a given input graph.*

**Many other examples:**  $k$ -vertex paths,  $k$ -vertex cycles,  $k$ -edge matchings,  $k$ -vertex regular induced subgraphs...



**DECISION**

Is there a witness?

**EXTRACTION**

Identify a single  
witness

**APPROX COUNTING**

Approximately how  
many witnesses?

**UNIFORM SAMPLING**

Pick a single witness  
uniformly at random

**EXACT COUNTING**

Exactly how many  
witnesses?

**ENUMERATION**

List all witnesses

## Proposition

*Suppose that, for each  $k$  and any graph  $G$  on  $n$  vertices, the number of  $k$ -vertex subgraphs of  $G$  that have our property is either*

- 1 *zero, or*
- 2 *at least*

$$\frac{1}{g(k)p(n)} \binom{n}{k}.$$

*Then there is an efficient algorithm to count witnesses approximately.*

## Proposition

*Suppose that, for each  $k$  and any graph  $G$  on  $n$  vertices, the number of  $k$ -vertex subgraphs of  $G$  that have our property is either*

- 1 *zero, or*
- 2 *at least*

$$\frac{1}{g(k)p(n)} \binom{n}{k}.$$

*Then there is an efficient algorithm to count witnesses approximately.*

**Examples:**  $k$ -vertex regular induced subgraphs;  $k$ -vertex induced subgraphs with an even number of edges.

## Proposition

*Suppose that, for each  $k$  and any graph  $G$  on  $n$  vertices, the number of  $k$ -vertex subgraphs of  $G$  that have our property is either*

- 1 *zero, or*
- 2 *at least*

$$\frac{1}{g(k)p(n)} \binom{n}{k}.$$

*Then there is an efficient algorithm to count witnesses approximately.*

**Examples:**  $k$ -vertex regular induced subgraphs;  $k$ -vertex induced subgraphs with an even number of edges.

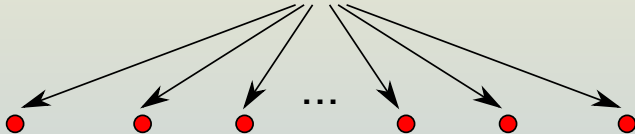
These problems are still hard for exact counting.

## Theorem

*Suppose that we have an  $f(k) \cdot n^{O(1)}$  decision algorithm for the **multicolour** version of the problem. Then we can enumerate (and hence count) all witnesses in time  $g(k) \cdot n^{O(1)} \cdot N$ , where  $N$  is the total number of witnesses.*

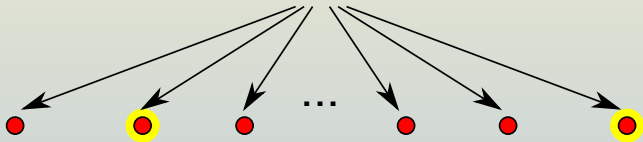
## Theorem

Suppose that we have an  $f(k) \cdot n^{O(1)}$  decision algorithm for the **multicolour** version of the problem. Then we can enumerate (and hence count) all witnesses in time  $g(k) \cdot n^{O(1)} \cdot N$ , where  $N$  is the total number of witnesses.



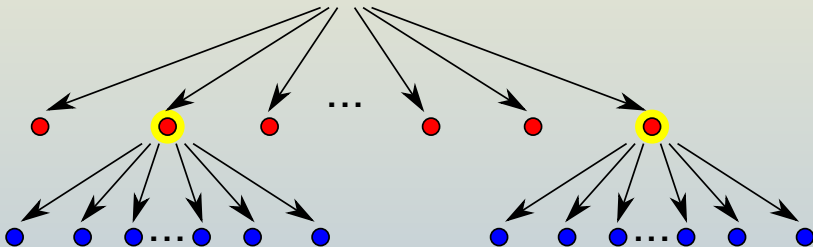
## Theorem

*Suppose that we have an  $f(k) \cdot n^{O(1)}$  decision algorithm for the **multicolour** version of the problem. Then we can enumerate (and hence count) all witnesses in time  $g(k) \cdot n^{O(1)} \cdot N$ , where  $N$  is the total number of witnesses.*



## Theorem

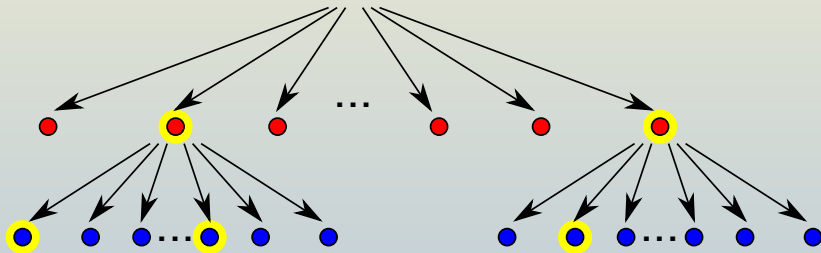
Suppose that we have an  $f(k) \cdot n^{O(1)}$  decision algorithm for the **multicolour** version of the problem. Then we can enumerate (and hence count) all witnesses in time  $g(k) \cdot n^{O(1)} \cdot N$ , where  $N$  is the total number of witnesses.





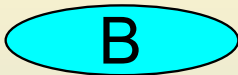
## Theorem

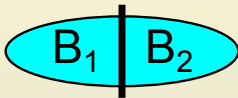
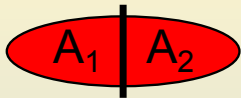
Suppose that we have an  $f(k) \cdot n^{O(1)}$  decision algorithm for the **multicolour** version of the problem. Then we can enumerate (and hence count) all witnesses in time  $g(k) \cdot n^{O(1)} \cdot N$ , where  $N$  is the total number of witnesses.

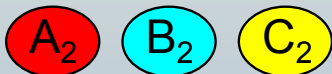
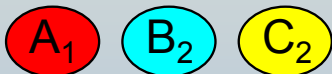
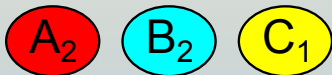
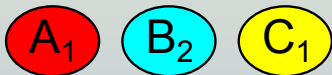
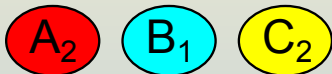
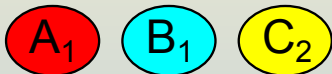
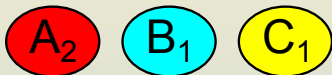
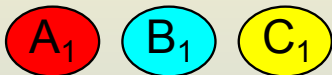
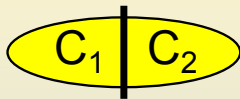
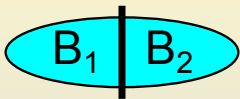
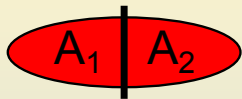


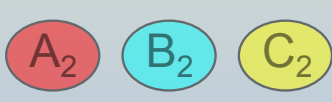
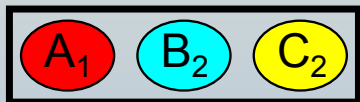
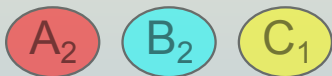
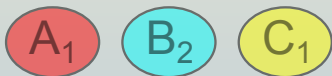
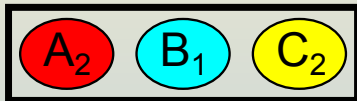
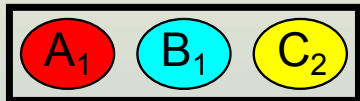
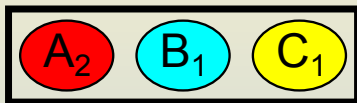
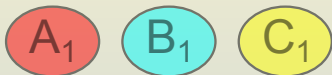
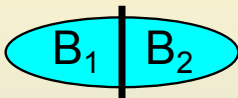
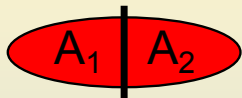
- **IDEA:** create many coloured instances, and enumerate the colourful copies in each (omitting duplicates)

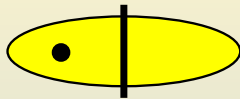
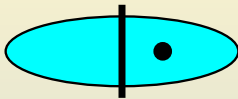
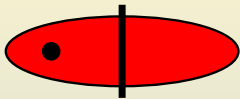
- **IDEA:** create many coloured instances, and enumerate the colourful copies in each (omitting duplicates)
- **PROBLEM:** although we're now looking for colourful witnesses, we still only have a decision algorithm for the uncoloured version...







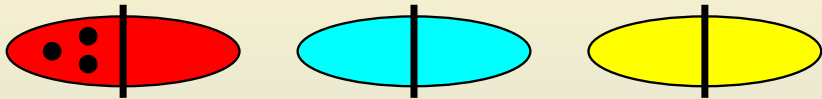




If a witness is colourful:

- It will always survive in exactly one combination



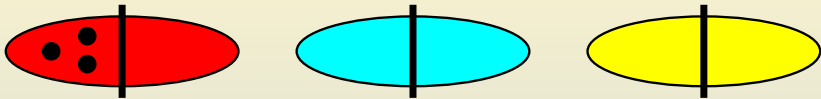


If a witness is colourful:

- It will always survive in exactly one combination

If a witness contains vertices of only  $\ell < k$  colours:

- the probability it survives in at least one combination is at most  $2^{-(k-\ell)}$
- if it survives in any combination, it will survive in exactly  $2^{k-\ell}$  combinations



If a witness is colourful:

- It will always survive in exactly one combination

If a witness contains vertices of only  $\ell < k$  colours:

- the probability it survives in at least one combination is at most  $2^{-(k-\ell)}$
- if it survives in any combination, it will survive in exactly  $2^{k-\ell}$  combinations

It can then be shown that, for **any** witness, the **expected** number of combinations in which it survives at each level is at most one.

## Theorem

*Suppose that we can decide if there is at least one witness in time  $f(k) \cdot n^{O(1)}$ . Then there is a randomised algorithm which enumerates all witnesses in expected time  $f(k) \cdot n^{O(1)} \cdot N$ , where  $N$  is the total number of witnesses in the instance.*

## Theorem

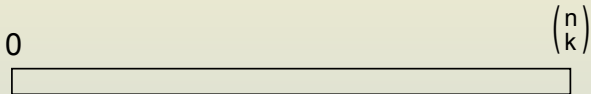
*Suppose that we can decide if there is at least one witness in time  $f(k) \cdot n^{O(1)}$ . Then there is a randomised algorithm which enumerates all witnesses in expected time  $f(k) \cdot n^{O(1)} \cdot N$ , where  $N$  is the total number of witnesses in the instance.*

## Corollary

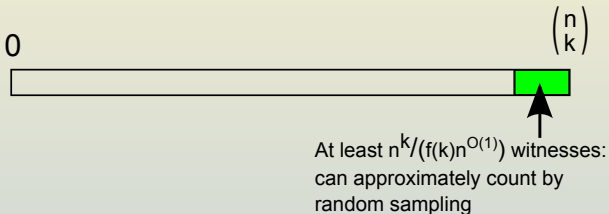
*Suppose that we can decide if there is at least one witness in time  $f(k) \cdot n^{O(1)}$  and that, for each  $k$  and any graph  $G$  on  $n$  vertices, the total number of witnesses is at most  $f(k)n^{O(1)}$ . Then there is an efficient algorithm to count witnesses approximately.*

- Can the randomised enumeration process be derandomised?

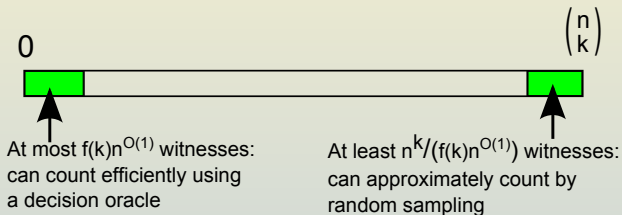
- Can the randomised enumeration process be derandomised?
- Can we close the gap?



- Can the randomised enumeration process be derandomised?
- Can we close the gap?

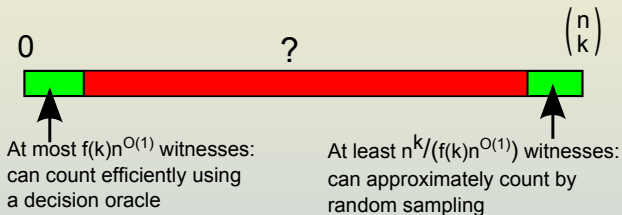


- Can the randomised enumeration process be derandomised?
- Can we close the gap?

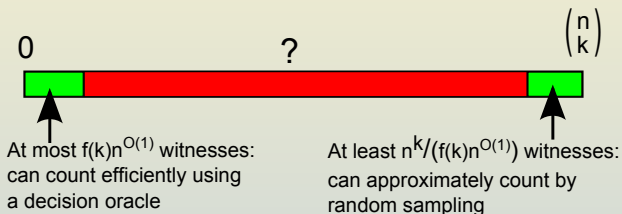




- Can the randomised enumeration process be derandomised?
- Can we close the gap?



- Can the randomised enumeration process be derandomised?
- Can we close the gap?



# Thank you