



LUNDS UNIVERSITET  
Lunds Tekniska Högskola

# Chromatic Polynomial in Small Space

Algorithmic Engineering Aspects of Fast Zeta Transform-based Graph Colouring Algorithms



# This presentation

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- Introduction and theory
  - Graphs & algorithms
  - The BHKK algorithm
  - The Fast Zeta Transform
- My work
- Results
- Questions
  - There are no silly ones.

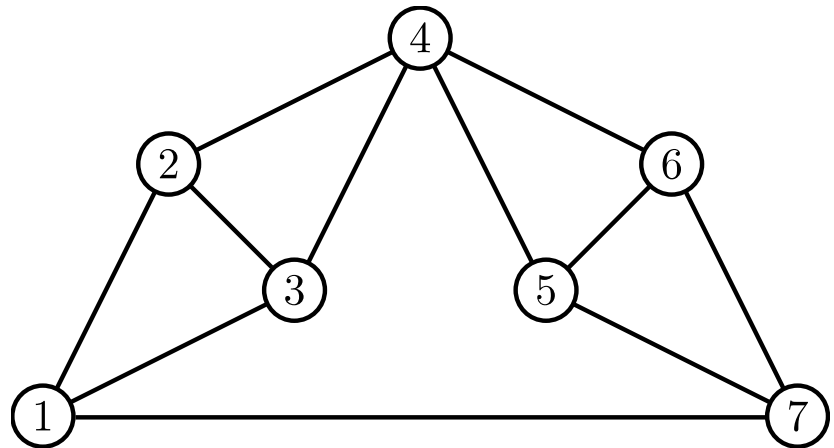
# Introduction, graphs

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- What is a graph?

- Vertices,  $V$ 
  - Order  $n$
- Edges,  $E$ 
  - Size  $m$

*The Moser Spindle graph*

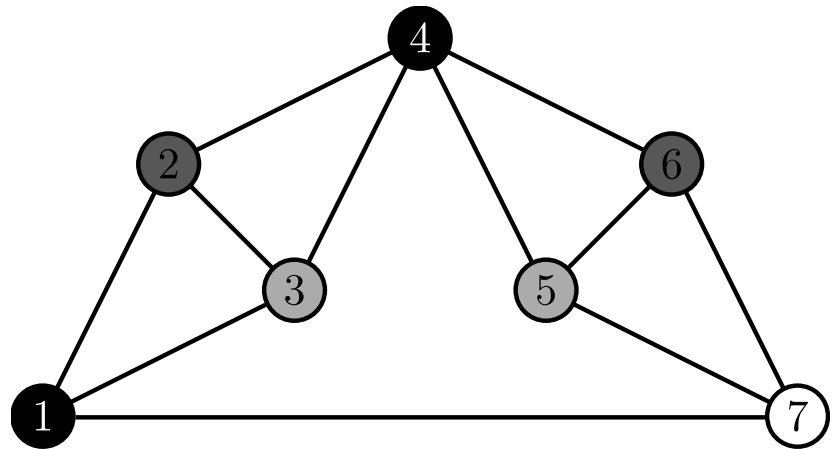


# Introduction, graphs

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  - Edges,  $E$
- How can we colour it?
  - Optimally
  - Counting

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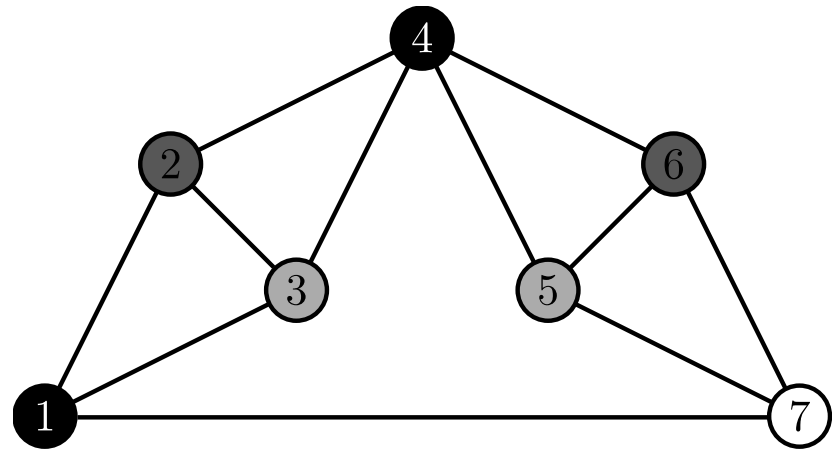


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  - What does it look like?

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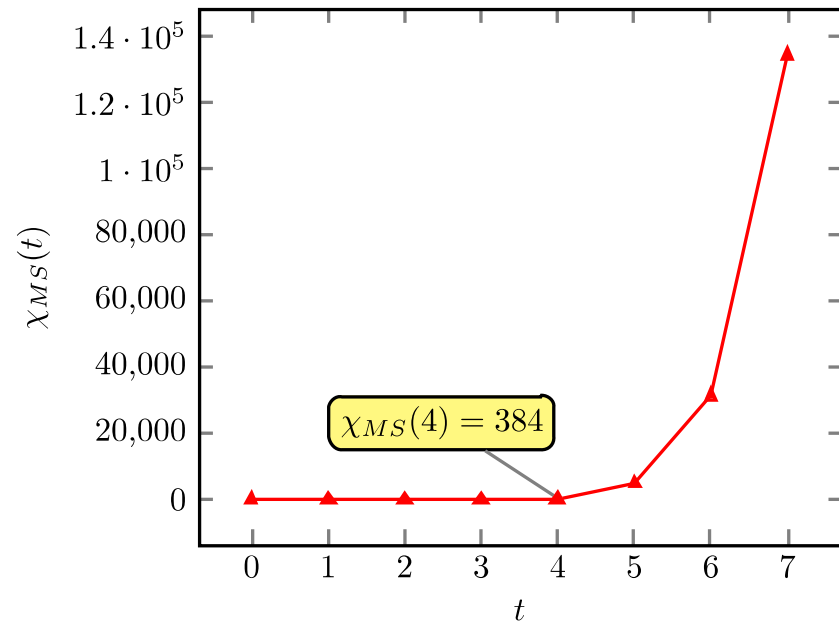


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The Moser Spindle graph chromatic polynomial



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# Introduction, algorithms

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- What is an algorithm?

Stone: "A set of rules that precisely define a sequence of operations."

Wikipedia: "A step-by-step procedure for calculations."

*Example:*

1. *Initialize data structures.*
2. *Magic*
3. *...*
4. *Profit.*

# Introduction, algorithms

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Step A. For  $q = 0, 1, \dots, n$ , do

1. Partition  $V$  into  $V_1$  and  $V_2$  of sizes  $n_1$  and  $n_2$ .

2. For each  $X_1 \subseteq V_1$ , do

a) For each independent  $Y_1 \subseteq X_1$ , do

$$h[V_2 \setminus N(Y_1)] \leftarrow h[V_2 \setminus N(Y_1)] + z^{|Y_1|}$$

b) For each independent  $Y_2 \subseteq V_2$ , do

$$l[Y_2] \leftarrow z^{|Y_2|}$$

c)  $h \leftarrow (h\zeta') \cdot l$

d)  $h \leftarrow h\zeta$

e) For each  $X_2 \subseteq V_2$ , do

$$r \leftarrow r + (-1)^{n-|X_1|-|X_2|} \cdot h[X_2]^q$$

3. Return coefficient  $c_n$  of  $z^n$  in  $r$ .

Step B. Construct interpolating polynomial  $\chi_G(t)$  on points  $(q, c_{nq})$ .

Step C. Return  $\chi_G(t)$ .



# The BHKK Algorithm

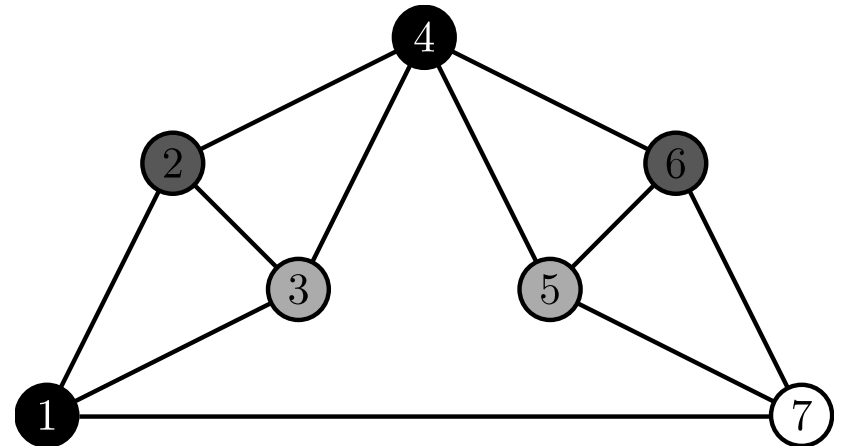
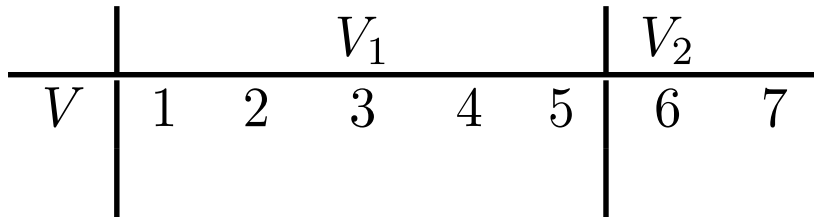
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- Björklund, Husfeldt, Kaski, Koivisto = BHKK
- Computes the Chromatic Polynomial
  - $O^*(2^n)$  time
  - $O^*(1.2916^n)$  space
    - Main improvement
  - Principle of inclusion-exclusion
  - Iteration over independent subsets
- Fast Zeta Transform

# The Fast Zeta Transform

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Split  $V$  into  $V_1$  and  $V_2$



# The Fast Zeta Transform

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b) For each independent  $Y_2 \subseteq V_2$ , do

$$l[Y_2] \leftarrow z^{|Y_2|}$$

$X \subseteq V_2$	$f(X)$		$X \subseteq V_2$	$f\zeta(X)$
$\{6, 7\}$	0	$\xrightarrow[\text{BHKK version}]{\text{Fast Zeta Transform, } \zeta}$	$\{6, 7\}$	$2z + 1$
$\{7\}$	$z$		$\{7\}$	$z + 1$
$\{6\}$	$z$		$\{6\}$	$z + 1$
$\emptyset$	1		$\emptyset$	1

# The Fast Zeta Transform

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Sets are encoded as integers (= bitsets). 1 in position  $i$  means element  $i$  is in the set ( $i = 1, \dots, n$ )

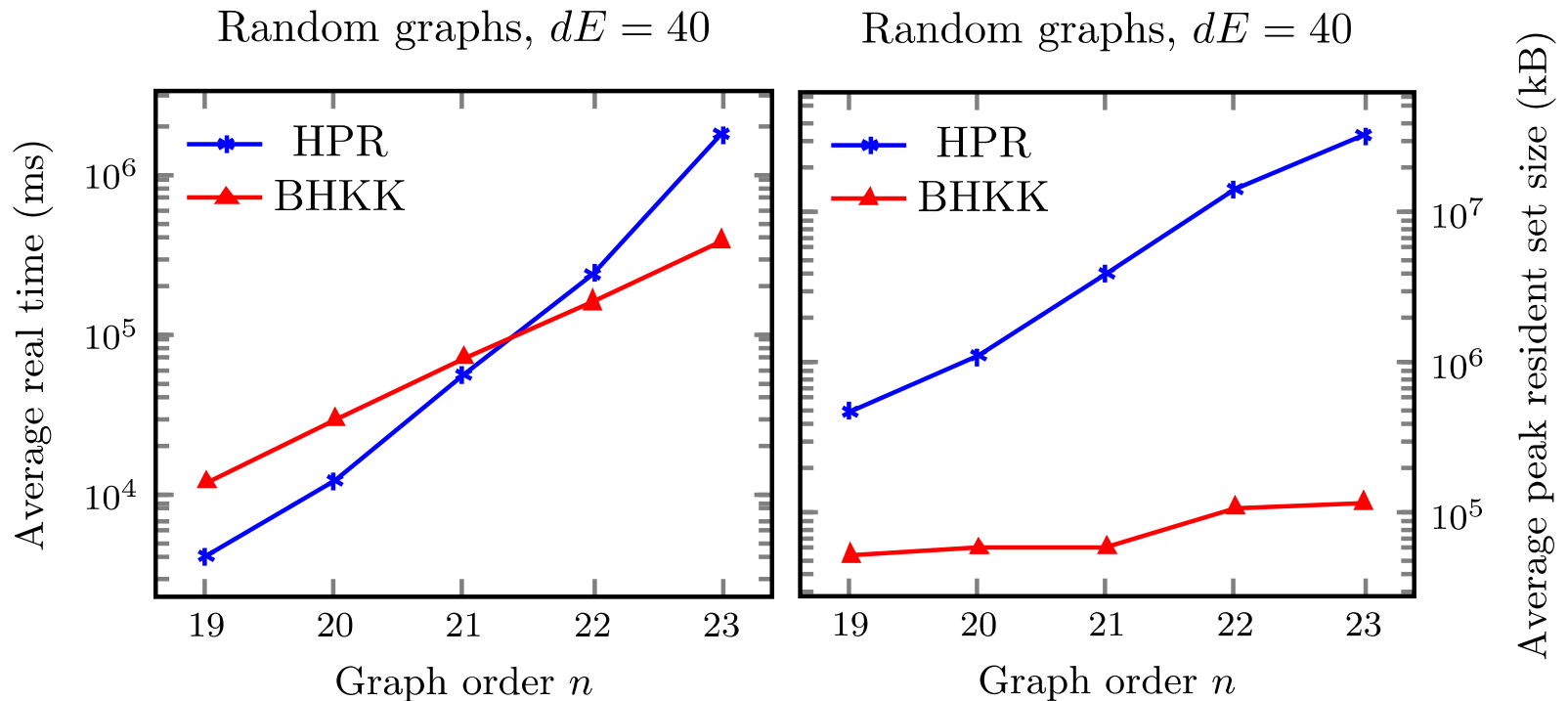
$X \subseteq V_2$	$f(X)$		$X \subseteq V_2$	$f\zeta(X)$
1100000 $\equiv 96$	0	$\xrightarrow[\text{BHKK version}]{\text{Fast Zeta Transform, } \zeta}$	1100000 $\equiv 96$	$2z + 1$
1000000 $\equiv 64$	$z$		1000000 $\equiv 64$	$z + 1$
0100000 $\equiv 32$	$z$		0100000 $\equiv 32$	$z + 1$
0000000 $\equiv 0$	1		0000000 $\equiv 0$	1

# My work

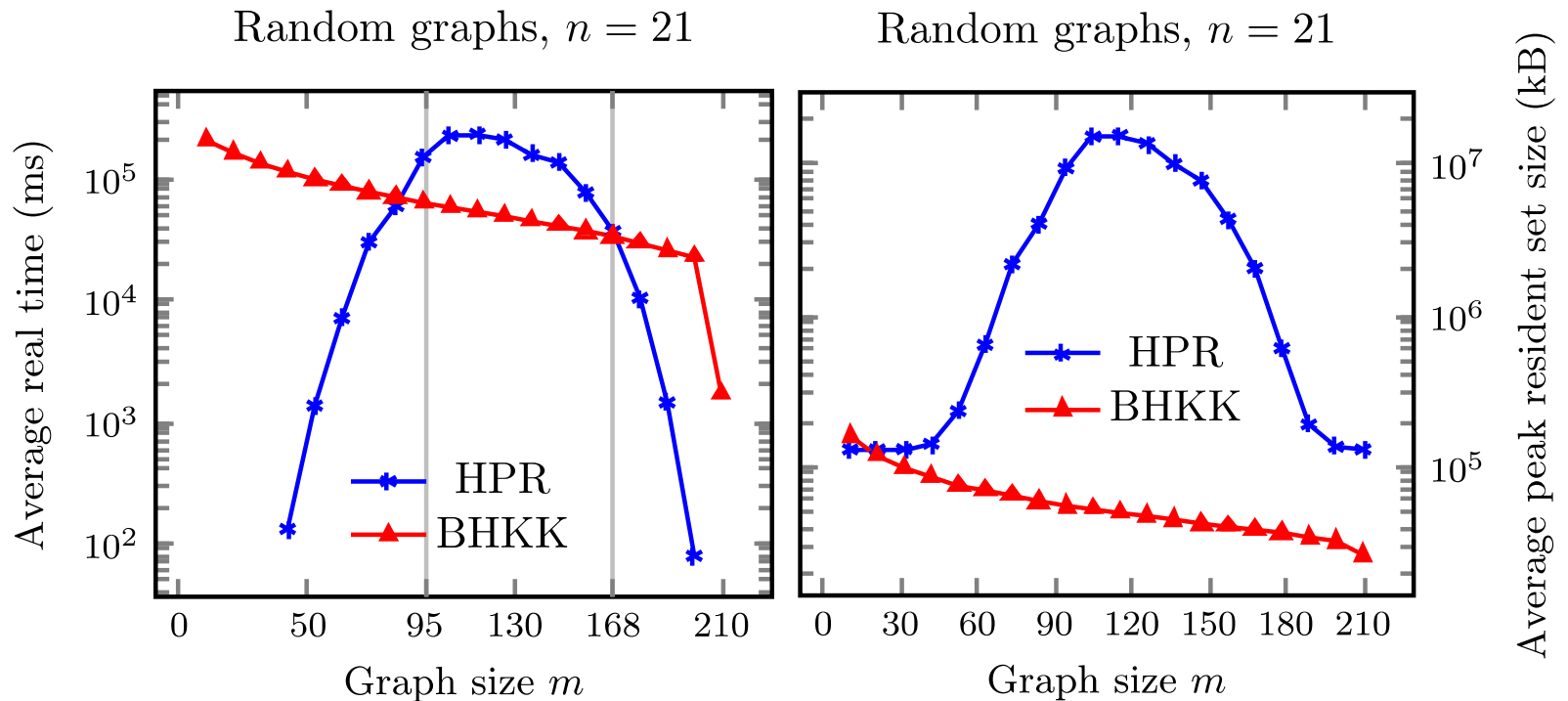
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- Implement the BHKK algorithm
  - Polynomial arithmetic externalized
  - Parallelization
- Run simulations, compare to competition
  - Haggard, Pearce, Royle = HPR algorithm
    - Deletion-contraction, dynamic programming
  - Random graphs
  - Optimizations

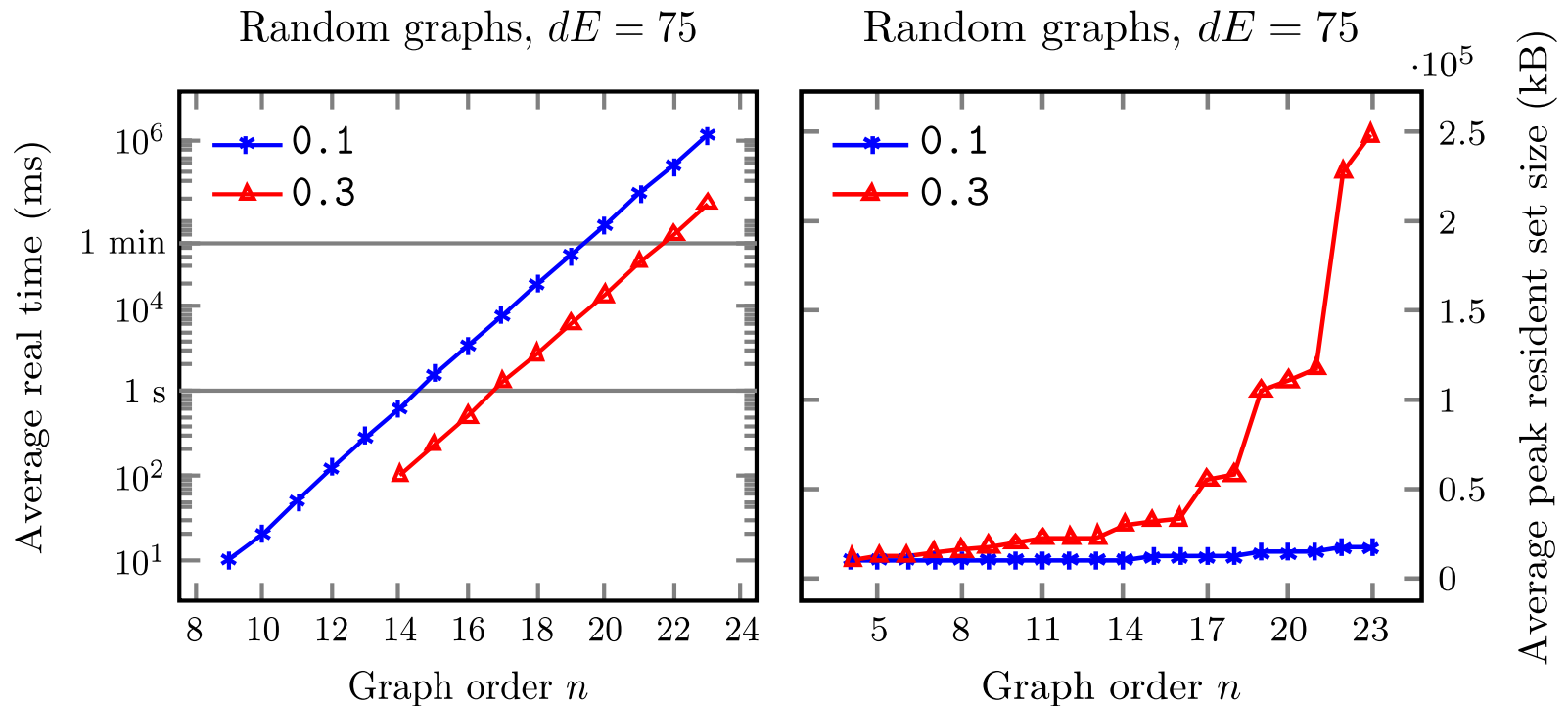
# Results, complexity



# Results, size dependency



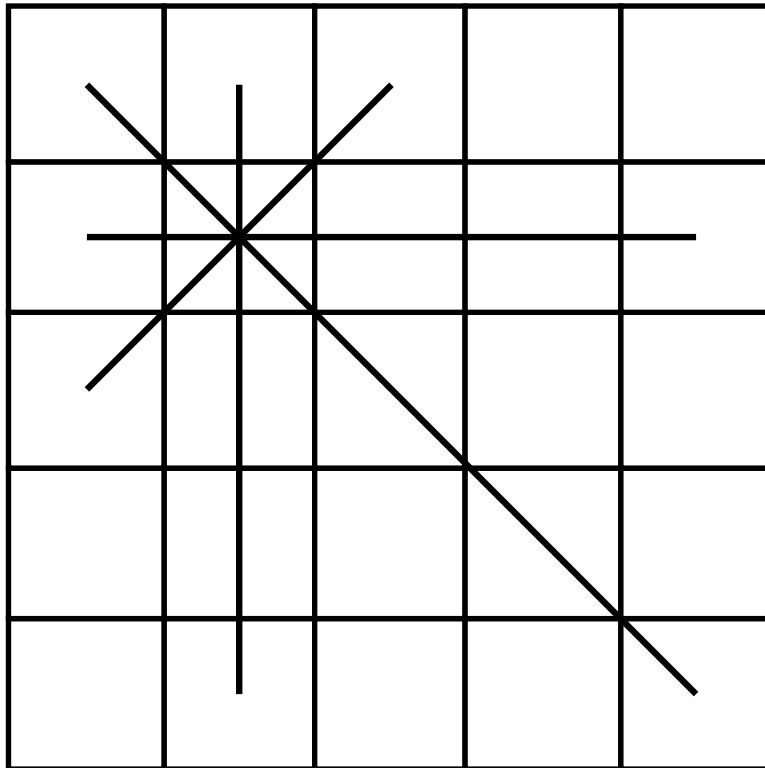
# Results, parallelization





# Results, Queen graph

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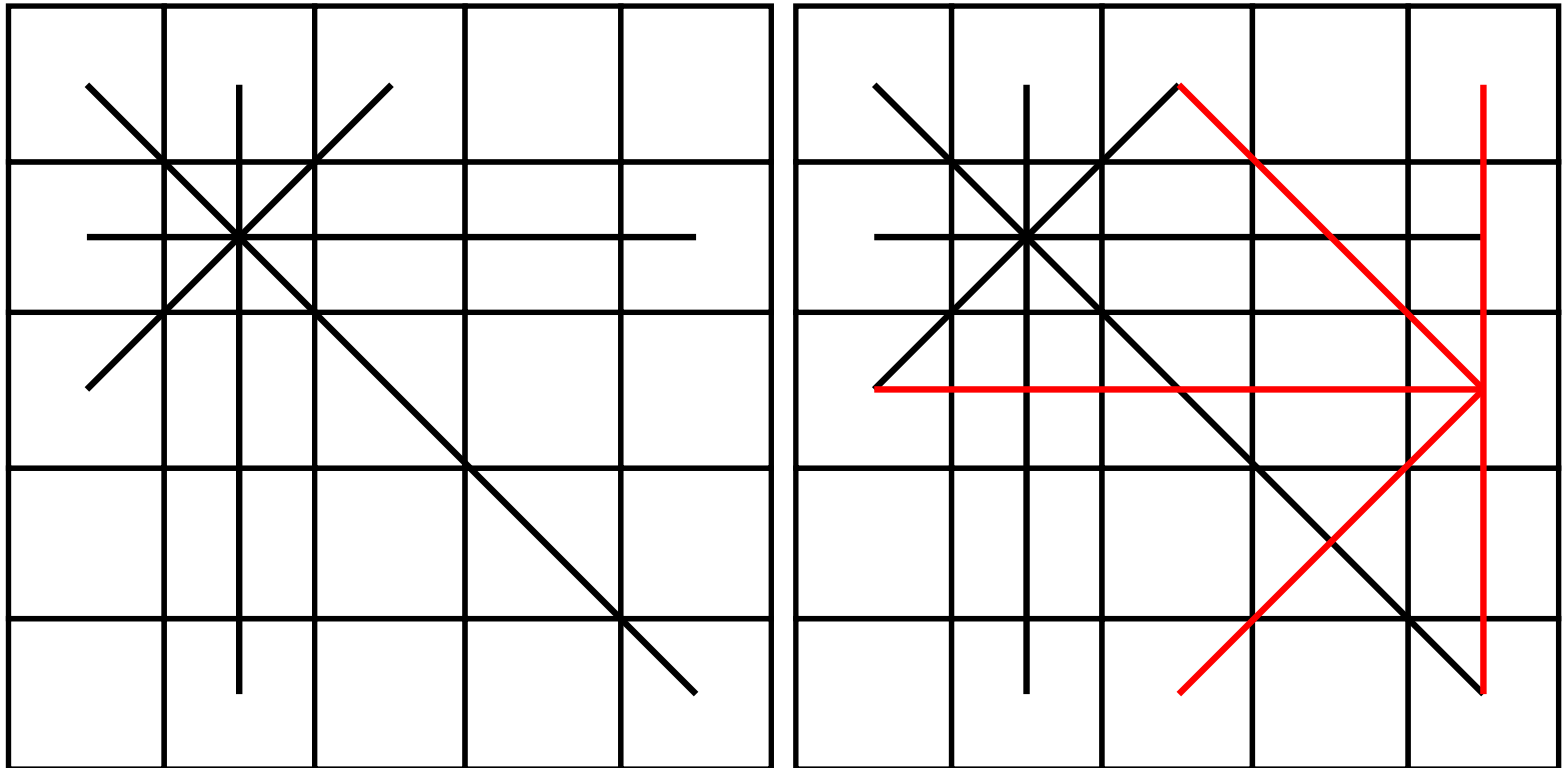


5x5 Queen graph

- Order 25
- Size 160
- Chromatic nbr 5

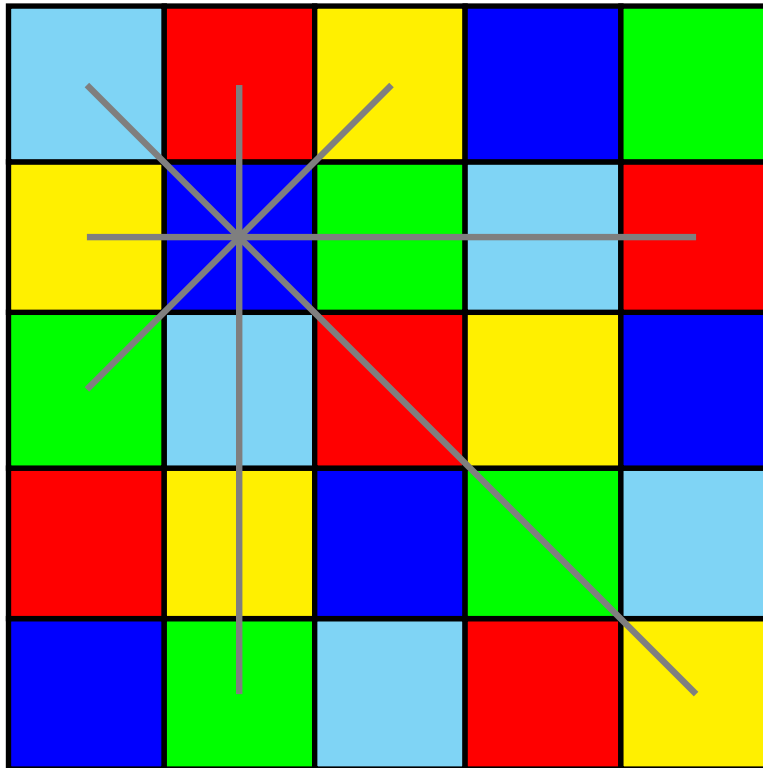
# Results, Queen graph

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# Results, Queen graph

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5x5 Queen graph

- Order 25
- Size 160
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# Results, Queen graph

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$$\begin{aligned}\chi_{Q_5}(t) = & t^{25} - 160t^{24} + 12400t^{23} - 619000t^{22} + 22326412t^{21} - 618664244t^{20} \\ & + 13671395276t^{19} - 246865059671t^{18} + 3702615662191t^{17} \\ & - 46639724773840t^{16} + 496954920474842t^{15} - 4497756322484864t^{14} \\ & + 34633593670260330t^{13} - 226742890673713726t^{12} \\ & + 1258486280066672806t^{11} - 5890734492089539317t^{10} \\ & + 23071456910844580538t^9 - 74774310771536397886t^8 \\ & + 197510077615138465516t^7 - 416375608854898733286t^6 \\ & + 680208675481930270860t^5 - 824635131668099993614t^4 \\ & + 692768396747228503860t^3 - 356298290543726707632t^2 \\ & + 83353136564448062208t\end{aligned}$$

# Results, Queen graph

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```
$ bins/chr_pol_pari input/adjm/dimacs/dim_36_290 12
Evaluating x(0)... = 0
Evaluating x(1)... = 0
Evaluating x(2)... = 0
Evaluating x(3)... = 0
Evaluating x(4)... = 0
Evaluating x(5)... = 0
Evaluating x(6)... = 0
Evaluating x(7)... = 100800
Evaluating x(8)... = 539993341440
Evaluating x(9)... = 28523818425553920
Evaluating x(10)... = 168848393250572582400
Evaluating x(11)... = 242888062409233489987200
Evaluating x(12)... = 125418745435123389172492800
Evaluating x(13)... = 29561851852939196036141575680
Evaluating x(14)... = 3746380075607039378376563735040
Evaluating x(15)... = 287237024180965294490230843867200
...
```



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# Open questions

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- How fast can we run on exponential amount of threads?
  - One subset per thread.
  - "Worst" subset is the one with most independent "secondary" subsets.
  - Requires ~33 million CPUs for Queen 5x5.
- How fast can we run if actively separating "bad" subsets?
  - We group subsets into 12 groups (or some other constant).
  - If we are unlucky, we might get all "bad" subsets in one group.