The Maximum Induced Planar Subgraph problem

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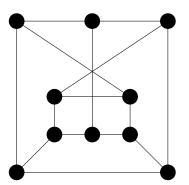
Joint work with Keith Edwards (Dundee) and Kerri Morgan



MAXIMUM INDUCED PLANAR SUBGRAPH (MIPS)

Input: Graph G

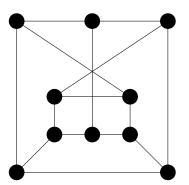
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- ightharpoonup |P| is maximum.



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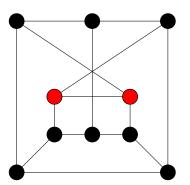
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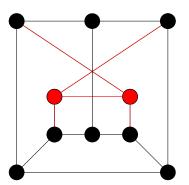
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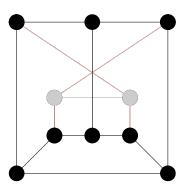
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Input: Graph G

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Complexity of MIPS

MIPS is

- ► NP-hard to solve exactly (Krishnamoorthy & Deo, 1979; Lewis & Yannakakis, 1980)
- ▶ also hard to approximate (Lund & Yannakakis, 1993): $\exists \varepsilon > 0$: cannot get performace ratio $n^{-\varepsilon}$ unless P = NP.
- ▶ approximable with performance ratio $\Omega(n^{-1}(\log n/\log\log n)^2)$ (Halldórsson, 2000)

Bounded degree MIPS

"Real" graphs have low degrees.

Approximation algorithms: max degree $\leq d$:

Halldórsson & Lau, 1997: proportion of vertices included:

$$\frac{1}{\lceil (d+1)/3 \rceil}$$

- linear time
- ► subgraphs found have max degree ≤ 2
- Edwards & Farr, GD 2001: proportion of vertices included:

$$\frac{3}{d+1}$$

- ▶ time *O*(*mn*)
- subgraphs found are series-parallel

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- Experiments
- Connection with fragmentability
- Future work

```
Input: G = (V, E)

P := \emptyset, R := V

Loop: if v \in R has degree \leq 0 in P, move it to P.

Output: P
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Stops when every vertex in R has degree ≥ 1 in P.

Input: G = (V, E) $P := \emptyset$, R := VLoop: if $v \in R$ has degree ≤ 0 in P, move it to P. Output: P

Stops when every vertex in R has degree ≥ 1 in P. Count E(P,R) from each side:

$$d|P| \geq |R|$$
 $d|P| \geq n - |P|$
 $(d+1)|P| \geq n$
 $|P| \geq \frac{n}{d+1}$

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Proportion:
$$\frac{1}{d+1}$$
 (Turán)

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Loop: if $v \in \mathbb{R}$ has degree ≤ 1 in the non-null portion P_1 of P,

move it to P.

Output: P

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```

Loop: if $v \in R$ has degree ≤ 1 in the non-null portion P_1 of P,

move it to P.

Output: P

Stops when every vertex in R has degree ≥ 2 in P_1 .

Input:
$$G = (V, E)$$

 $P := \emptyset$, $R := V$

Loop: if $v \in \mathbb{R}$ has degree ≤ 1 in the non-null portion P_1 of P_2

move it to P. Output: P

Stops when every vertex in R has degree > 2 in P_1 .

 $P_0 := \{ \text{isolated vertices in } \langle P \rangle \}; \qquad P_1 = P \setminus P_0.$

Count $E(P_1, R)$ from each side:

$$(d-1)|P_1| \geq 2|R|$$

 $(d-1)|P_1| \geq 2n-2|P|$
 $(d+1)|P_1|+2|P_0| \geq 2n$
 $|P|=|P_1|+|P_0| \geq \frac{2n}{d+1}$

Input:
$$G = (V, E)$$

 $P := \emptyset$, $R := V$

Loop: if $v \in R$ has degree ≤ 1 in the non-null portion P_1 of P,

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 $(d+1)|P_1| + 2|P_0| \ge 2n$
 $|P| = |P_1| + |P_0| \ge \frac{2n}{d+1}$

Proportion: $\frac{2}{d+1}$ (Alon, Mubayi, Thomas, 2001)

```
Algorithm from Edwards & Farr, 2002 (outline): Input: G = (V, E) P := \emptyset, R := V P_0 := forest portion of \langle P \rangle; P_1 = P \setminus P_0. Loop: if v \in R has d_{P_1}(v) \leq 2, can either move it to P (increases |P|) or swap it with an appropriate vertex in P. (This swap may require d_{P_0}(v) \leq 1.) Output: P
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Count E(P,R), or $E(P_1,R)$, from each side.

Obtain: Proportion: $\frac{3}{d+1}$

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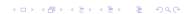
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Finds an induced series-parallel subgraph.



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Algorithm from Morgan & Farr, 2007 (outline): Input: G = (V, E)
P := \emptyset, R := V
P_1 := union of components of size \geq 3 of \langle P \rangle. Firstly: P := maximal induced forest of G, then make some easy additions to P. Loop: if v \in R has degree \leq 2 in P_1, can either move it to P (increases |P|) or swap it with an appropriate vertex in P. Output: P
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Algorithm from Morgan & Farr, 2007 (outline):
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P := \emptyset. R := V
P_1 := \text{union of components of size} > 3 \text{ of } \langle P \rangle.
Firstly: P := \text{maximal induced forest of } G,
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Loop: if v \in R has degree < 2 in P_1.
       can either move it to P (increases |P|)
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When stopped, every vertex in R has degree ≥ 3 in P_1 .

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When stopped, every vertex in R has degree ≥ 3 in P_1 . Count $E(P_1, R)$ from each side.

Obtain: Proportion: $\overline{d+5/3}$

Proportion of vertices removed

Max degree $\leq d$:

proportion
$$\leq \frac{d-2}{d+1}$$

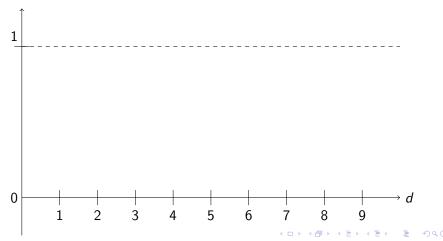
E & F 2001,2002

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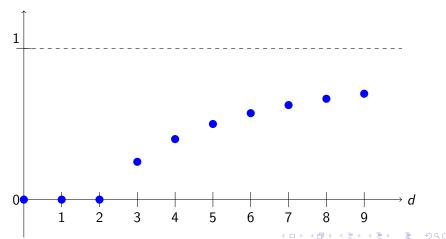


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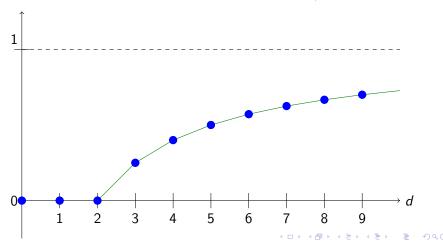


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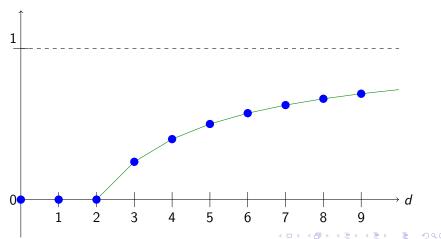


Proportion of vertices removed

Ave degree $\leq d$:

$$proportion \leq \frac{d-2}{d+1} - \frac{3(d-\lfloor d\rfloor)(\lceil d\rceil-d)}{(d+1)(\lfloor d\rfloor+1)(\lceil d\rceil+1)}$$

E & F 2001,2002 2003,2007



1. isolated vertex:



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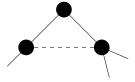


1. isolated vertex: delete

2. leaf:

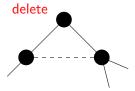
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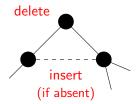
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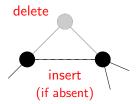
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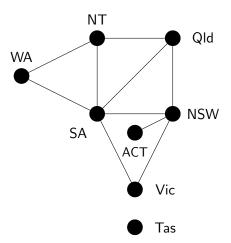
 $G \longrightarrow \begin{array}{c} \text{do series-parallel reductions} \\ \text{for as long as possible} \end{array} \longrightarrow \begin{array}{c} r(G) \\ \text{reduced} \end{array}$

graph

r(G)

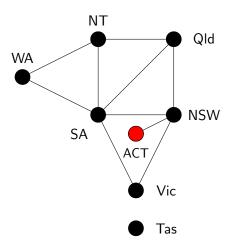
Example:

G:



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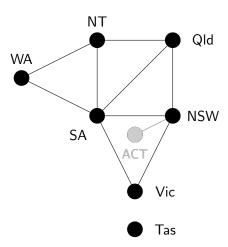
Example:



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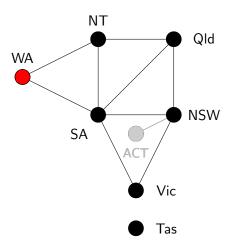
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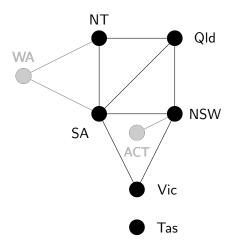
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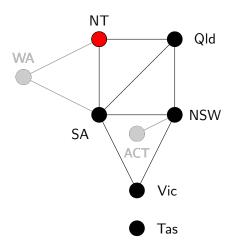
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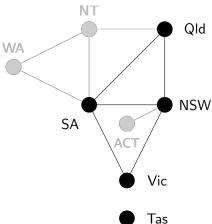
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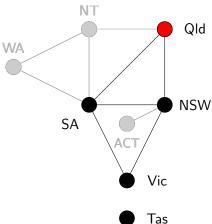
G:



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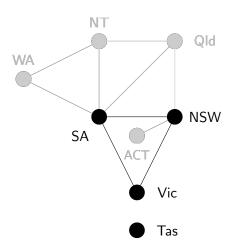
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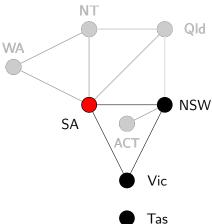
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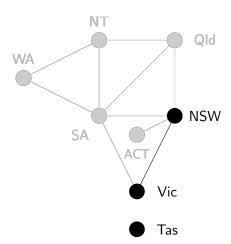
Example:

G:



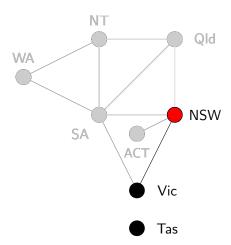
r(G)

Example:



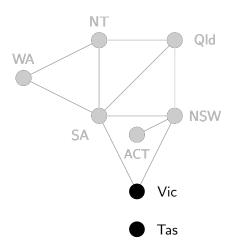
r(G)

Example:



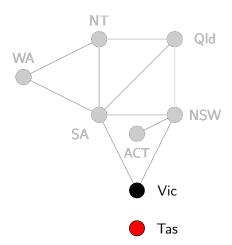
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r(G)

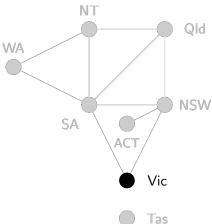
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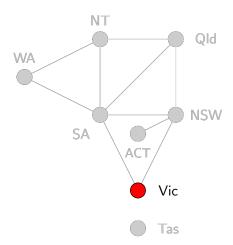
G:





r(G)

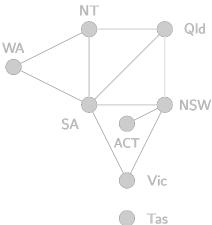
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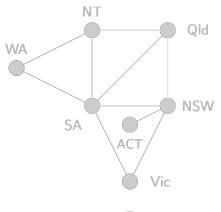
G:





Example:

G :



 \dots so r(G) is empty



Fact

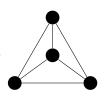
G is series-parallel $\Leftrightarrow r(G)$ is empty.

Fact

G is series-parallel \Leftrightarrow r(G) is empty.

Theorem (Duffin, 1965)

G is series-parallel \Leftrightarrow G contains no subdivision of K_4 .

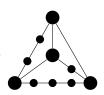


Fact

G is series-parallel \Leftrightarrow r(G) is empty.

Theorem (Duffin, 1965)

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Algorithm 1.

- 1. **Input:** Graph *G*.
- 2. P := V(G) // vertices to be kept $R := \emptyset$ // vertices to be removed $\rho := \left| \sum_{v \in V(r(G))} \frac{d_{r(G)}(v) - 2}{d_{r(G)}(v) + 1} \right|$
- 3. **while** ($|R| < \rho$ and $r(\langle P \rangle)$ is nonempty) { $w := \text{vertex in } P \text{ with maximum degree in } r(\langle P \rangle)$ $P := P \setminus \{w\}$ $R := R \cup \{w\}$ }
- 4. **Output:** $\langle P \rangle$.

Theorem (E & F, 2003, 2007)

If G has min degree \geq 3, then Algorithm 1 finds a series-parallel subgraph of G, and the number |R(G)| of vertices removed satisfies

$$|R(G)| \leq \sum_{v \in V(G)} \frac{d(v) - 2}{d(v) + 1}.$$

Theorem (E & F, 2003, 2007)

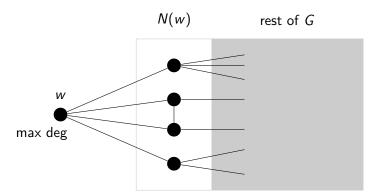
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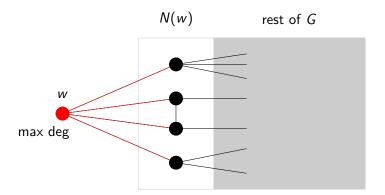
$$|R(G)| \leq \sum_{v \in V(G)} \frac{d(v) - 2}{d(v) + 1}.$$

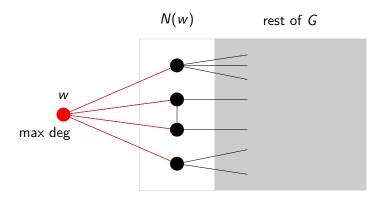
Proof. Induction on n.

Inductive basis: empty graph (min degree \geq 3: no vertices of degree 0,1,2).

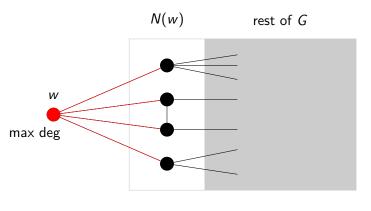
Now let G be any graph with min degree $\geq 3 \dots$



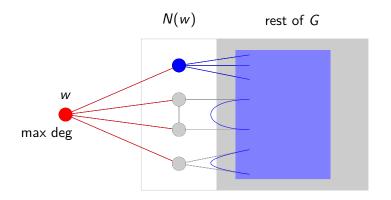




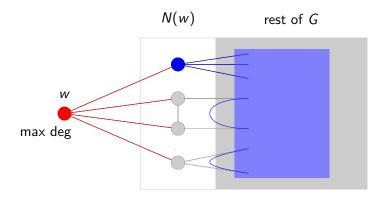
$$|R(G)| \leq 1 +$$



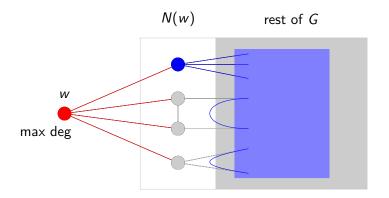
$$|R(G)| \leq 1 + |R(G-w)|$$



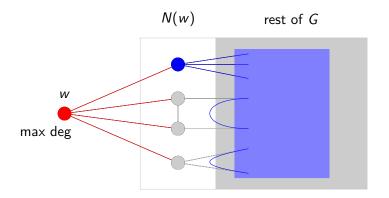
$$|R(G)| \leq 1 + |R(r(G-w))|$$



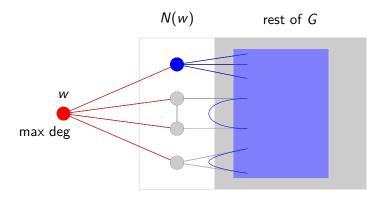
$$|R(G)| \le 1 + |R(r(G - w))|$$
 induction:



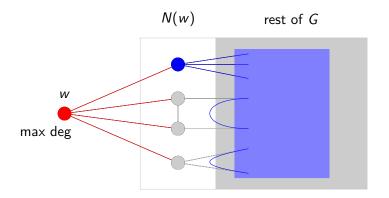
$$|R(G)| \le 1 + \underbrace{|R(r(G-w))|}_{\text{induction:}} \le \underbrace{\sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}}_{\text{otherwise}}$$



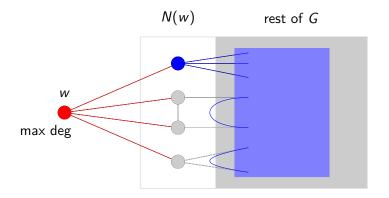
$$|R(G)| \le 1 + \underbrace{|R(r(G-w))|}_{\text{induction:}} \le \underbrace{\sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}}_{\text{otherwise}}$$



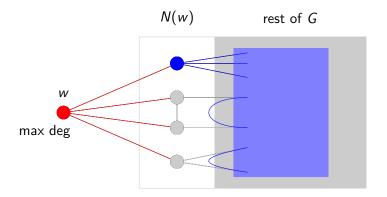
$$|R(G)| \le 1 + \underbrace{|R(r(G-w))|}_{\text{induction:}} \le \underbrace{\sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}}_{\text{otherwise}}$$



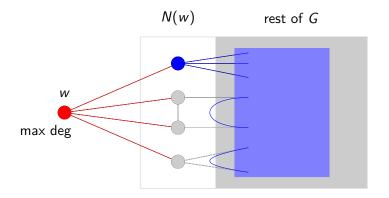
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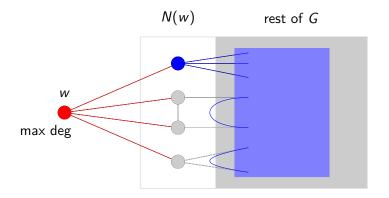
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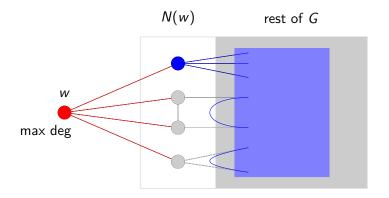
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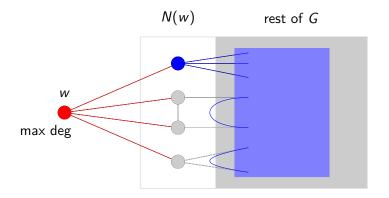
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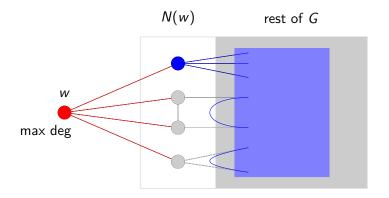
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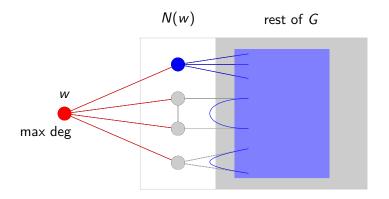
$$|R(G)| \le 1 + \underbrace{|R(r(G-w))|}_{\text{induction:}} \le \underbrace{\sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}}_{\text{induction:}}$$



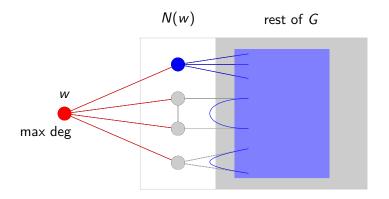
$$|R(G)| \le 1 + \underbrace{|R(r(G-w))|}_{\text{induction:}} \le \underbrace{\sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}}_{\text{induction:}}$$



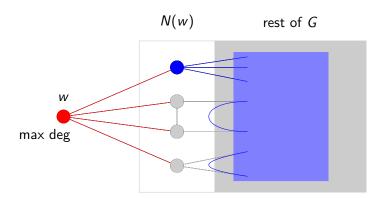
$$|R(G)| \le 1 + \underbrace{|R(r(G-w))|}$$
induction: $\le \sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}$



$$|R(G)| \le 1 + \underbrace{|R(r(G-w))|}_{\text{induction:}} \le \underbrace{\sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}}_{\text{induction:}}$$

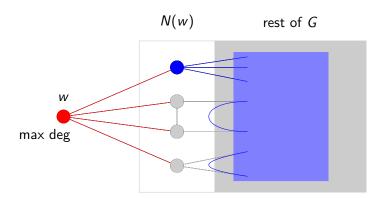


$$|R(G)| \le 1 + \underbrace{|R(r(G-w))|}_{\text{induction:}} \le \underbrace{\sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}}$$



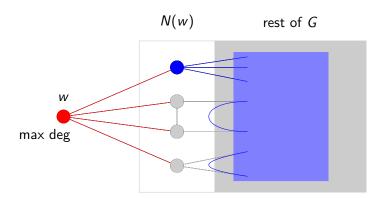
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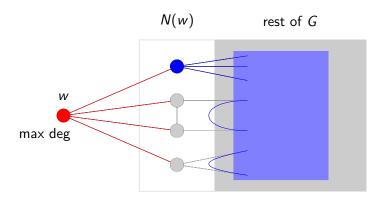
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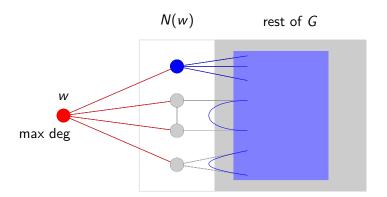
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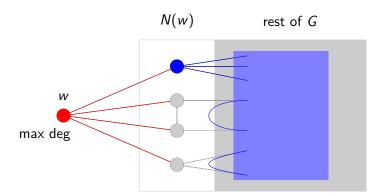
$$|R(G)| \leq 1 +$$

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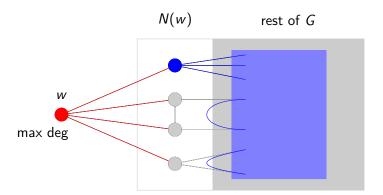
$$|R(G)| \leq 1 +$$

$$\sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}$$



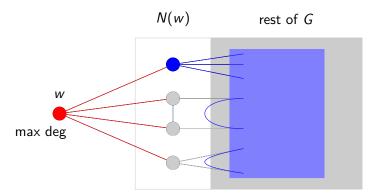
$$|R(G)| \leq 1 +$$

$$\sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}$$

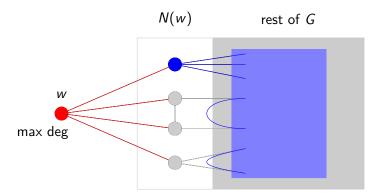


$$|R(G)| \leq 1 +$$

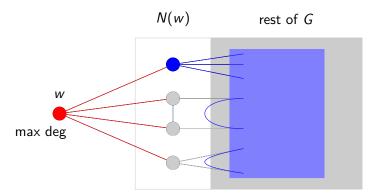
$$\sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}$$



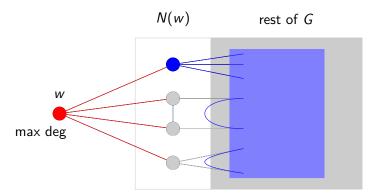
$$|R(G)| \le 1 + \sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}$$



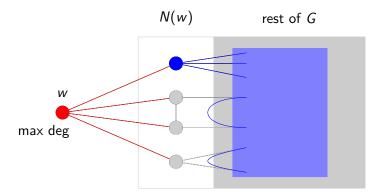
$$|R(G)| \le 1 + \sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}$$



$$|R(G)| \le 1 + \sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}$$

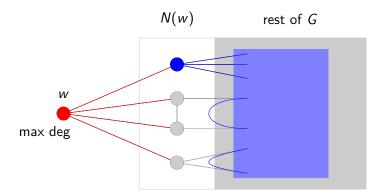


$$|R(G)| \le \sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}$$

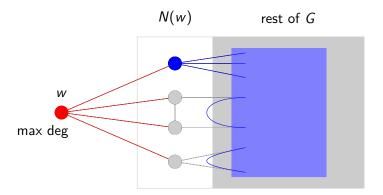


$$|R(G)| \le \sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}$$

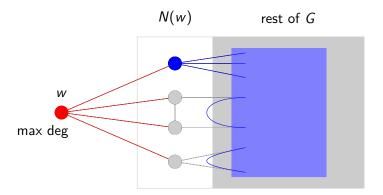
$$|R(G)| \le \sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}$$



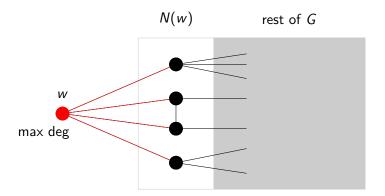
$$|R(G)| \le \sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}$$



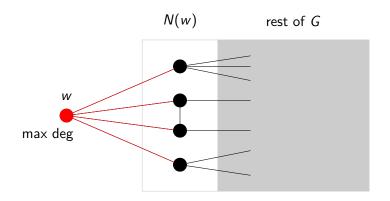
$$|R(G)| \le \sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}$$



$$|R(G)| \le \sum_{v \in V(r(G-w))} \frac{d_{r(G-w)}(v) - 2}{d_{r(G-w)}(v) + 1}$$

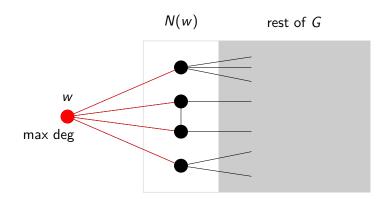


$$|R(G)| \leq \sum_{v \in V(-G-w)} \frac{d_{G-w}(v) - 2}{d_{G-w}(v) + 1}$$



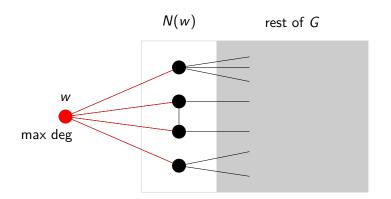
$$|R(G)| \le 1 + \sum_{v \in V(G-w)} \frac{d_{G-w}(v) - 2}{d_{G-w}(v) + 1}$$

$$\sum_{v \in N(w)} \frac{d_{G-w}(v) - 2}{d_{G-w}(v) + 1} + \sum_{v \in V(G-w-N(w))} \frac{d_{G-w}(v) - 2}{d_{G-w}(v) + 1}$$



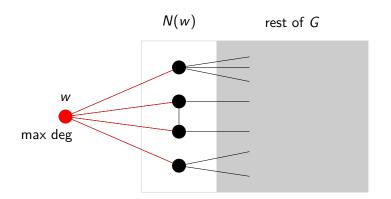
$$|R(G)| \leq 1 +$$

$$\sum_{v \in N(w)} \frac{d_{G-w}(v)}{d_{G-w}(v)} - \frac{2}{+1} + \sum_{v \in V(G-w-N(w))} \frac{d_{G-w}(v) - 2}{d_{G-w}(v) + 1}$$



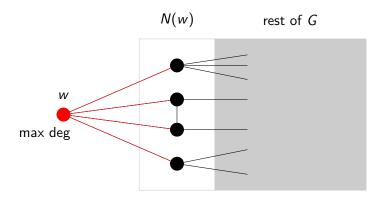
$$|R(G)| \leq 1 +$$

$$\sum_{v \in N(w)} \frac{d}{d} \frac{(v) - 1 - 2}{(v) - 1 + 1} + \sum_{v \in V(G - w - N(w))} \frac{d}{d} \frac{(v) - 2}{(v) + 1}$$



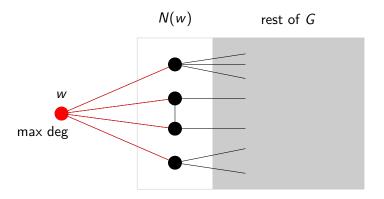
$$|R(G)| \leq 1 +$$

$$\sum_{v \in N(w)} \frac{d}{d} \frac{(v) - 1 - 2}{(v) - 1 + 1} + \sum_{v \in V(G - w - N(w))} \frac{d}{d} \frac{(v) - 2}{(v) + 1}$$



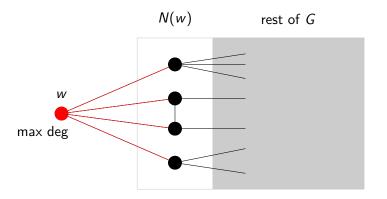
$$|R(G)| \le 1 + \sum_{v \in N(w)} \frac{d(v) - 3}{d(v)} + \sum_{v \in V(G - w - N(w))} \frac{d(v) - 2}{d(v) + 1}$$

$$\sum_{v \in N(w)} \frac{d}{d} \frac{(v) - 1 - 2}{(v) - 1 + 1} + \sum_{v \in V(G - w - N(w))} \frac{d}{d} \frac{(v) - 2}{(v) + 1}$$



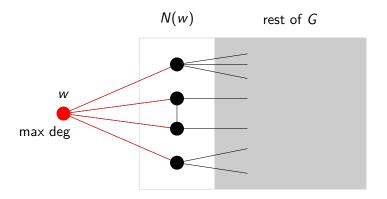
$$|R(G)| \le 1 + \sum_{v \in N(w)} \frac{d(v) - 3}{d(v)} + \sum_{v \in V(G - w - N(w))} \frac{d(v) - 2}{d(v) + 1}$$

$$\sum_{v \in N(w)} \frac{d}{d} \frac{(v) - 1 - 2}{(v) - 1 + 1} + \sum_{v \in V(G - w - N(w))} \frac{d}{d} \frac{(v) - 2}{(v) + 1}$$



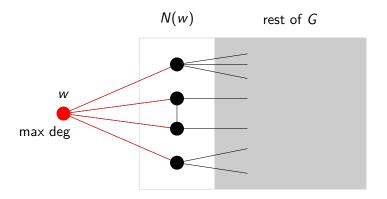
$$|R(G)| \le 1 + \sum_{v \in N(w)} \frac{d(v) - 3}{d(v)} + \sum_{v \in V(G - w - N(w))} \frac{d(v) - 2}{d(v) + 1}$$

$$\sum_{v \in N(w)} \frac{d \qquad (v) - 1 - 2}{d \qquad (v) - 1 + 1} + \sum_{v \in V(G - w - N(w))} \frac{d \qquad (v) - 2}{d \qquad (v) + 1}$$



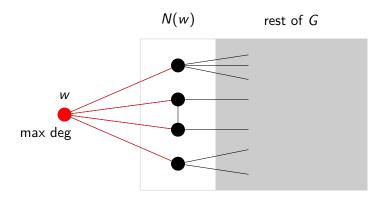
$$|R(G)| \le 1 + \sum_{v \in N(w)} \frac{d(v) - 3}{d(v)} + \sum_{v \in V(G - w - N(w))} \frac{d(v) - 2}{d(v) + 1}$$

$$\sum_{v \in N(w)} \frac{d}{d} \frac{(v) - 1 - 2}{(v) - 1 + 1} + \sum_{v \in V(G - w - N(w))} \frac{d}{d} \frac{(v) - 2}{(v) + 1}$$



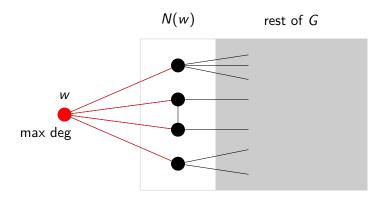
$$|R(G)| \le 1 + \sum_{v \in N(w)} \frac{d(v) - 3}{d(v)} + \sum_{v \in V(G - w - N(w))} \frac{d(v) - 2}{d(v) + 1}$$

$$\sum_{v \in N(w)} \frac{d}{d} \frac{(v) - 1 - 2}{(v) - 1 + 1} + \sum_{v \in V(G - w - N(w))} \frac{d}{d} \frac{(v) - 2}{(v) + 1}$$



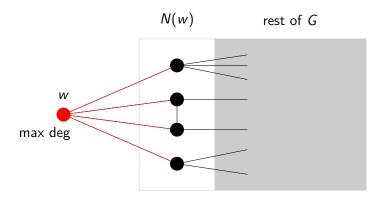
$$|R(G)| \le 1 + \sum_{v \in N(w)} \frac{d(v) - 3}{d(v)} + \sum_{v \in V(G - w - N(w))} \frac{d(v) - 2}{d(v) + 1}$$

$$\sum_{v \in N(w)} \frac{d}{d} \frac{(v) - 1 - 2}{(v) - 1 + 1} + \sum_{v \in V(G - w - N(w))} \frac{d}{d} \frac{(v) - 2}{(v) + 1}$$



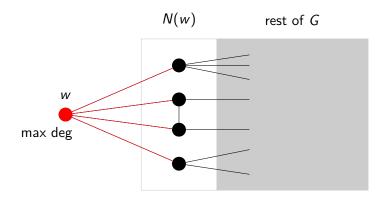
$$|R(G)| \le 1 + \sum_{v \in N(w)} \frac{d(v) - 3}{d(v)} + \sum_{v \in V(G - w - N(w))} \frac{d(v) - 2}{d(v) + 1}$$

$$\sum_{v \in N(w)} \frac{d}{d} \frac{(v) - 1 - 2}{(v) - 1 + 1} + \sum_{v \in V(G - w - N(w))} \frac{d}{d} \frac{(v) - 2}{(v) + 1}$$



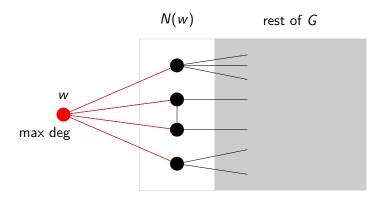
$$|R(G)| \le 1 + \sum_{v \in N(w)} \frac{d(v) - 3}{d(v)} + \sum_{v \in V(G - w - N(w))} \frac{d(v) - 2}{d(v) + 1}$$

$$\sum_{v \in N(w)} \frac{d}{d} \frac{(v) - 1 - 2}{(v) - 1 + 1} + \sum_{v \in V(G - w - N(w))} \frac{d}{d} \frac{(v) - 2}{(v) + 1}$$

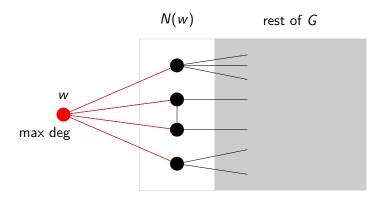


$$|R(G)| \le 1 + \sum_{v \in N(w)} \frac{d(v) - 3}{d(v)} + \sum_{v \in V(G - w - N(w))} \frac{d(v) - 2}{d(v) + 1}$$

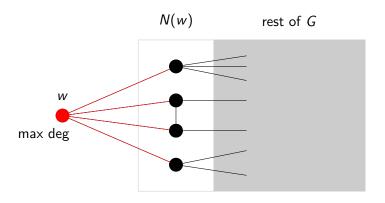
$$\sum_{v \in N(w)} \frac{d}{d} \frac{(v) - 1 - 2}{(v) - 1 + 1} + \sum_{v \in V(G - w - N(w))} \frac{d}{d} \frac{(v) - 2}{(v) + 1}$$



$$|R(G)| \le 1 + \sum_{v \in N(w)} \frac{d(v) - 3}{d(v)} + \sum_{v \in V(G - w - N(w))} \frac{d(v) - 2}{d(v) + 1}$$

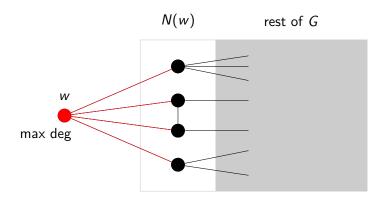


$$|R(G)| \le 1 + \sum_{v \in N(w)} \frac{d(v) - 3}{d(v)} + \sum_{v \in V(G - w - N(w))} \frac{d(v) - 2}{d(v) + 1}$$



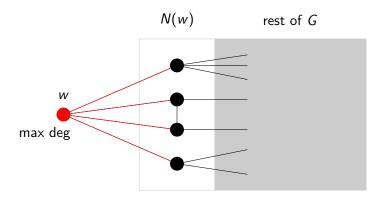
$$|R(G)| \le 1 + \sum_{v \in N(w)} \frac{d(v) - 3}{d(v)} + \sum_{v \in V(G - w - N(w))} \frac{d(v) - 2}{d(v) + 1}$$

$$\sum_{v \in N(w)} \left(\frac{d(v) - 3}{d(v)} - \frac{d(v) - 2}{d(v) + 1}\right) + \sum_{v \in V(G - w)} \frac{d(v) - 2}{d(v) + 1}$$



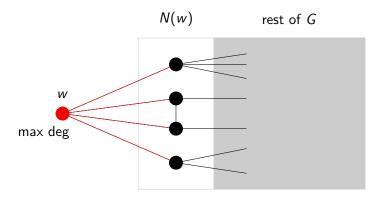
$$|R(G)| \leq 1 +$$

$$\sum_{v \in N(w)} \left(\frac{d(v) - 3}{d(v)} - \frac{d(v) - 2}{d(v) + 1} \right) + \sum_{v \in V(G - w)} \frac{d(v) - 2}{d(v) + 1}$$



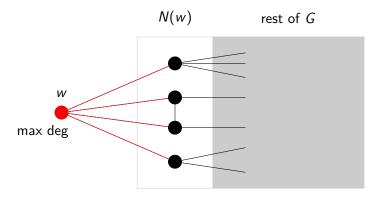
$$|R(G)| \le 1 + \sum_{v \in V(G-w)} \frac{d(v) - 2}{d(v) + 1}$$

$$\sum_{v \in N(w)} \left(\frac{d(v) - 3}{d(v)} - \frac{d(v) - 2}{d(v) + 1} \right) + \sum_{v \in V(G - w)} \frac{d(v) - 2}{d(v) + 1}$$



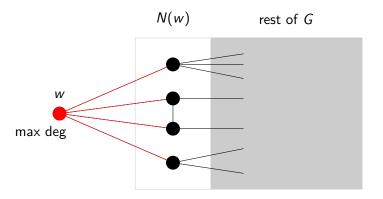
$$|R(G)| \le 1 - \sum_{v \in N(w)} \frac{3}{d(v)(d(v)+1)} + \sum_{v \in V(G-w)} \frac{d(v)-2}{d(v)+1}$$

$$\sum_{v \in N(w)} \left(\frac{d(v) - 3}{d(v)} - \frac{d(v) - 2}{d(v) + 1} \right) + \sum_{v \in V(G - w)} \frac{d(v) - 2}{d(v) + 1}$$



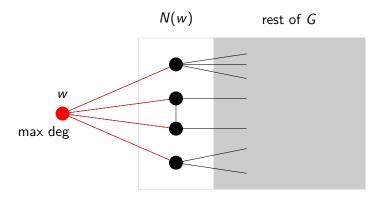
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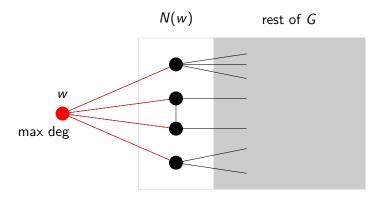
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$$\sum_{v \in N(w)} \left(\frac{d(v) - 3}{d(v)} - \frac{d(v) - 2}{d(v) + 1} \right) + \sum_{v \in V(G - w)} \frac{d(v) - 2}{d(v) + 1}$$



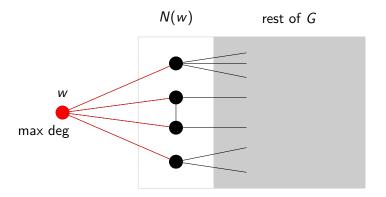
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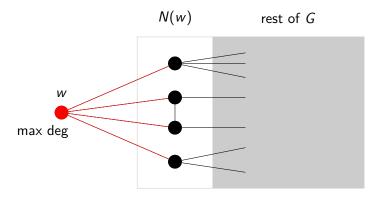
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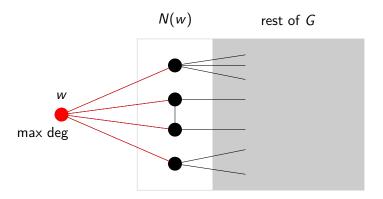
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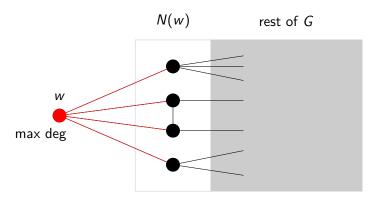
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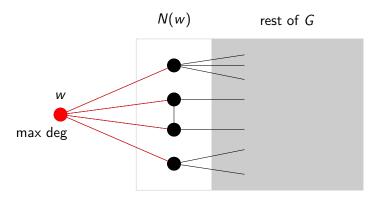


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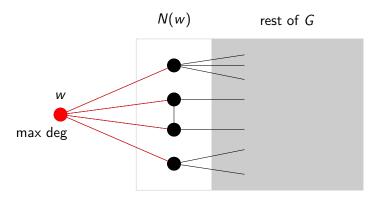
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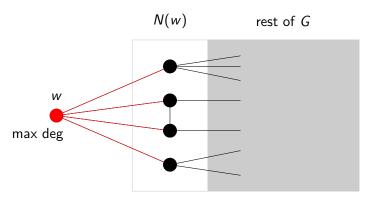
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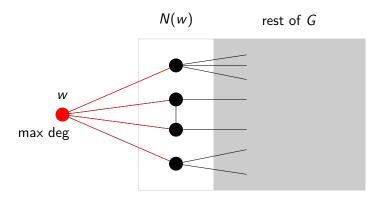
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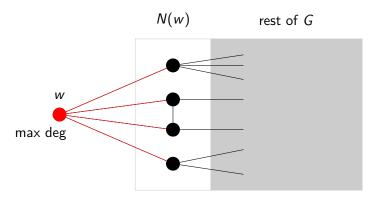
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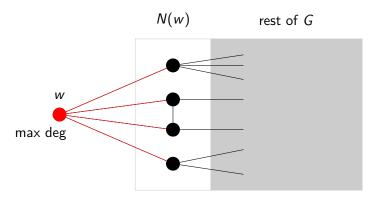


$$|R(G)| \leq \frac{3}{\left(d\left(\mathbf{w}\right)+1\right)} + \sum_{v \in V(G-w)} \frac{d(v)-2}{d(v)+1}$$



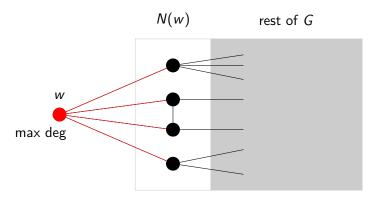
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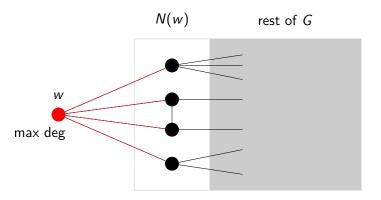
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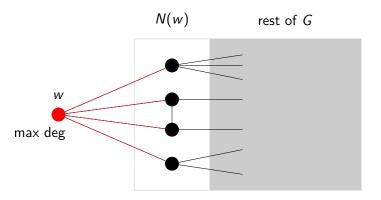
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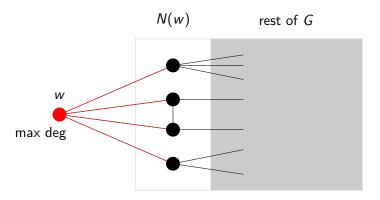
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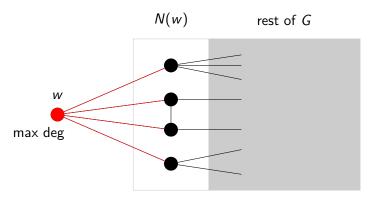
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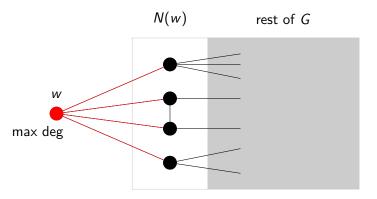
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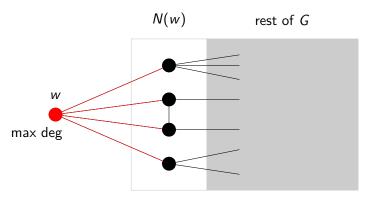
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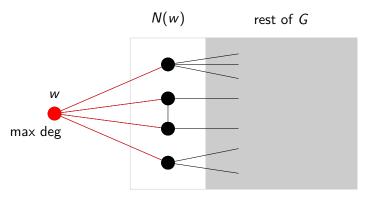
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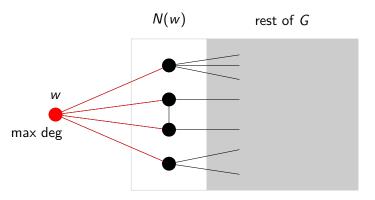
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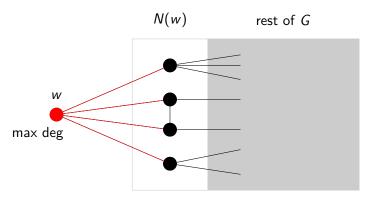
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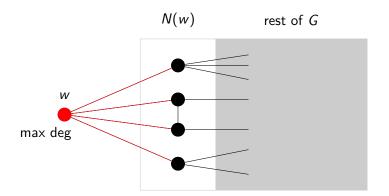
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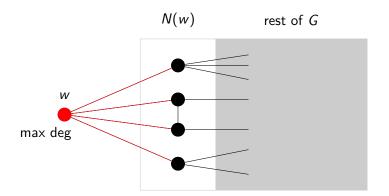
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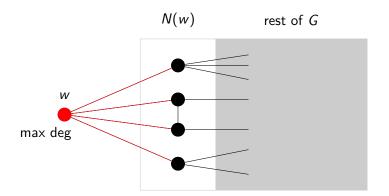
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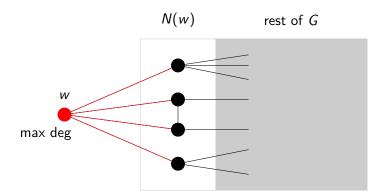
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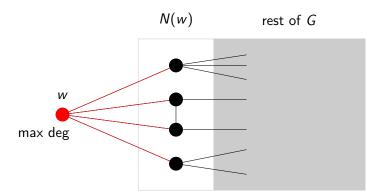
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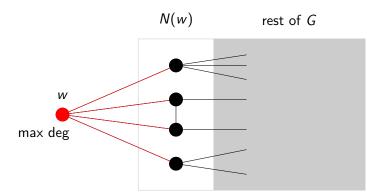
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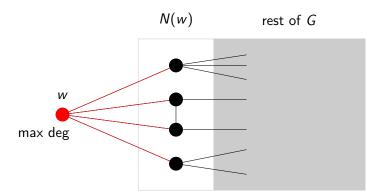
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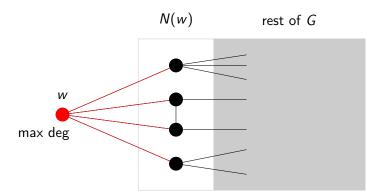
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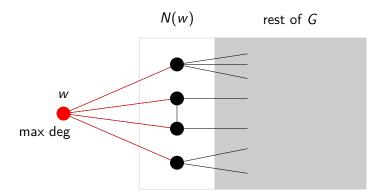
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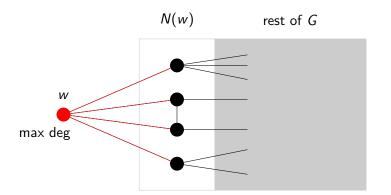
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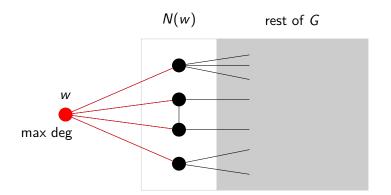


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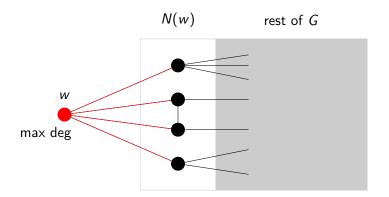
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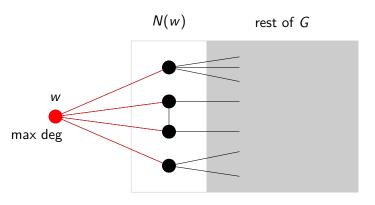
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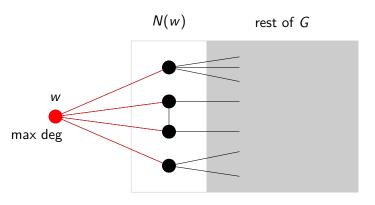
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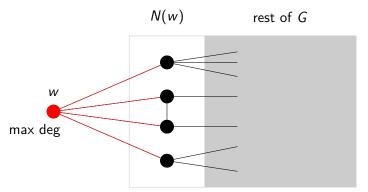
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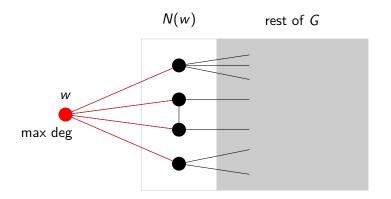
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$$|R(G)| \leq \frac{\frac{d(w)-2}{d(w)+1}}{\sum_{v \in V(G)} \frac{d(v)-2}{d(v)+1}}$$



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Can use this result to analyse behaviour of Algorithm 1 for graphs of given average degree:

Theorem (E & F, 2003, 2007)

If G is has average degree $d \ge 4$, or is connected and has average degree $d \ge 2$, then Algorithm 1 finds and induced planar subgraph of G of at least

$$\left(\frac{3}{d+1} + \frac{3(d-\lfloor d\rfloor)(\lceil d\rceil - d)}{(d+1)(\lfloor d\rfloor + 1)(\lceil d\rceil + 1)}\right)n$$

vertices.

Time complexity = O(nm).

Experiments

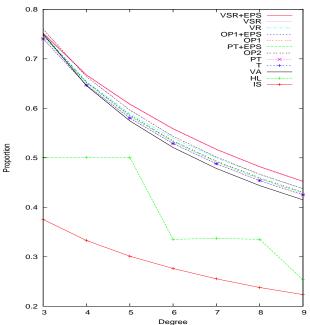
- Algorithms: Independent Set (IS), Induced Forest (T), Halldórsson-Lau (HL), Vertex Addition (VA), Outerplanar (OP2), Vertex Removal (VR), . . .
- $n = 20, \dots, 10000$
- d = 3, 4, ..., 9
- random graphs:
 d-regular (Steger-Wormald),
 expected average degree d (classical)
- ▶ number of graphs of each type: 50 (for $n \le 1000$), 20 (for $n \ge 1000$)

Further information:

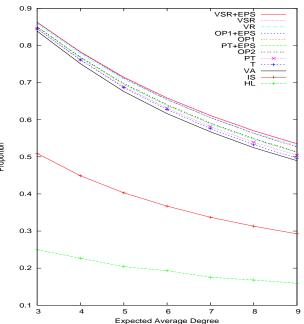
- ▶ Morgan & Farr, JGAA, to appear (2007)
- ▶ http://www.csse.monash.edu.au/~kmorgan/MIPS.html



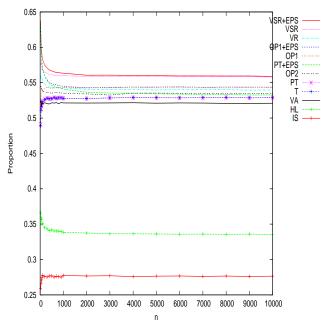
Performance versus degree: random *d*-regular graphs



Performance versus degree: expected ave. degree d



Performance versus *n*: random *d*-regular graphs



MIPS and fragmentability

MIPS is useful for breaking graphs into small pieces. Given G, with max/ave degree $\leq d$:

- 1. remove vertices from G to leave induced planar subgraph $\langle P \rangle$;
- 2. remove o(n) vertices from $\langle P \rangle$ to leave bounded size pieces (e.g., apply Planar Separator Theorem (Lipton & Tarjan) recursively).

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Converely, bounds on fragmentability can give *upper* bound on size of MIPS.

E.g., for
$$d = 3$$
, cannot do better than $\frac{3}{d+1} = \frac{3}{4}$.

For more info on fragmentability: Edwards & Farr (2001, 2007), Haxell, Pikhurko & Thomason (preprint)

▶ Improve lower bound on proportion of vertices in MIPS.

Our best:
$$\dfrac{3}{d+1}.$$
 Ceiling: $\dfrac{4}{d+1}.$ Consider $\mathcal{K}_4 \leq \mathcal{K}_{d+1}.$

How close to ceiling can we get? Is there a lower ceiling?

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MIPS v MPS (ordinary Maximum Planar Subgraph): in each, most good approximation algorithms give tree-like graphs. Is this coincidence? Does either of these problems help you solve the other?

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- Explain experimental results mathematically.

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- MIPS v MPS (ordinary Maximum Planar Subgraph): in each, most good approximation algorithms give tree-like graphs. Is this coincidence? Does either of these problems help you solve the other?
- Explain experimental results mathematically.
- Experimental comparison with maximal induced planar subgraph.