

Computational Combinatorics

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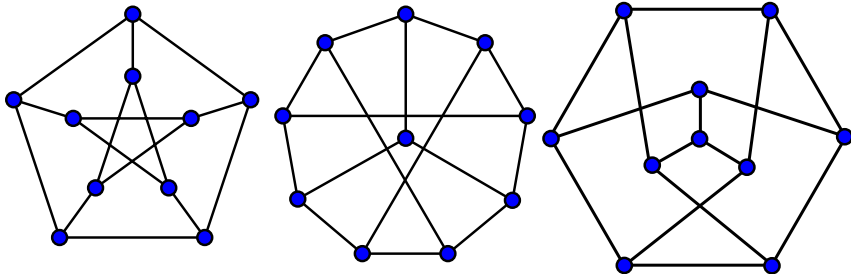
`http://www.math.iastate.edu/dstolee/`

November 3 & 5, 2014

Math 101

Combinatorial Object: Graphs

A **graph** G of **order** n is composed of a set $V(G)$ of n vertices and a set $E(G)$ of edges, where the edges are unordered pairs of vertices.



Two Flavors of Graph Theory

Structural Graph Theory:

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What conditions guarantee that certain **substructures** exist?

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Extremal Graph Theory:

Two Flavors of Graph Theory

Structural Graph Theory:

What conditions guarantee that certain **substructures** exist?

Extremal Graph Theory:

Given some structure, what **size restrictions** are guaranteed?

TONCAS Theorems

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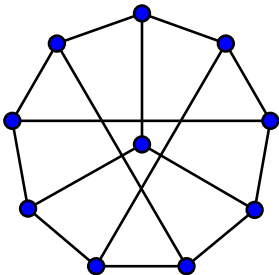
Sufficient

Connectedness

A graph is **connected** if for every pair u, v of vertices in G there exists a **path** from u to v in G .

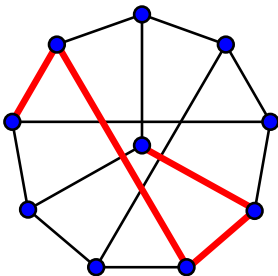
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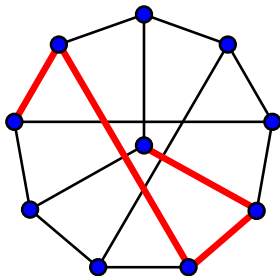
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Think of the “6-Degrees of Kevin Bacon” game, played on the IMDB graph.

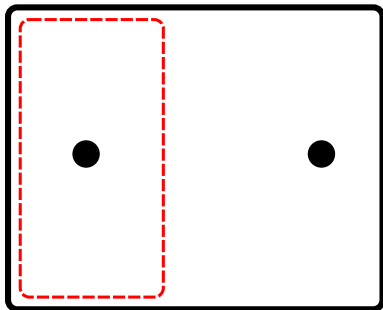
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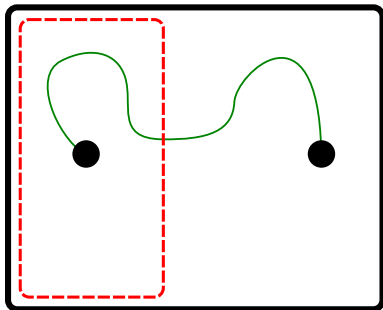
Theorem A graph G is connected **if and only if** for every set $S \subseteq V(G)$ where $S \neq \emptyset$ and $S \neq V(G)$ there exists at least one edge $uv \in E(G)$ where $u \in S$ and $v \notin S$.



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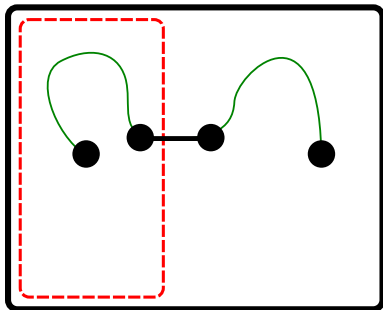
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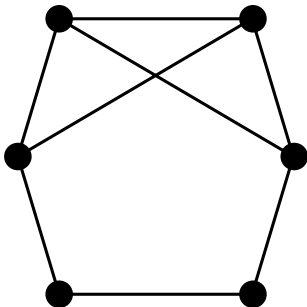
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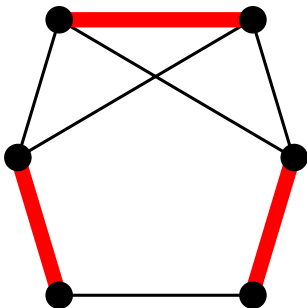
Perfect Matchings

A **perfect matching** is a set of edges which cover each vertex exactly once.



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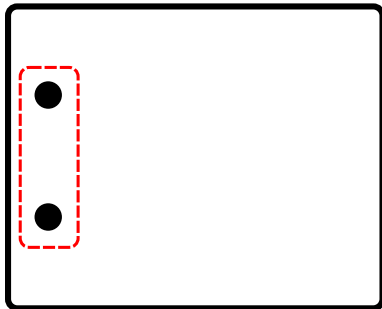


TONCAS for Perfect Matchings

Theorem (Tutte's Theorem) A graph has a perfect matching if and only if there is no set $S \subseteq V(G)$ so that the number of odd components in $G - S$ is greater than $|S|$.

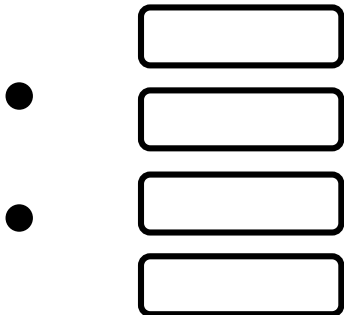
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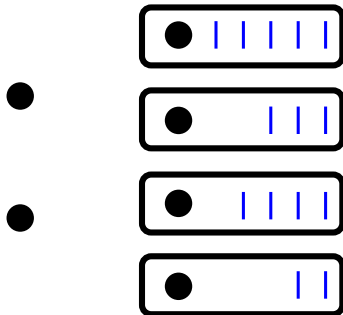
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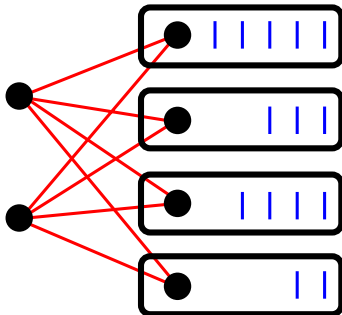
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Given specified **structure**, determine bounds on **size**.

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Another perspective: Specific values of one parameter influence the value of another.

Turán's Theorem

An **r -clique** is a set of r vertices that are pairwise adjacent.

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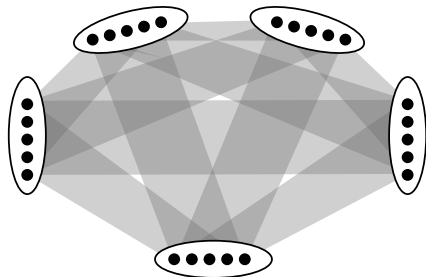
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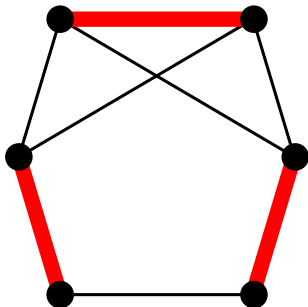
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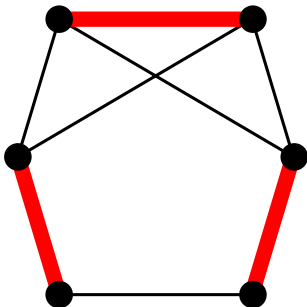
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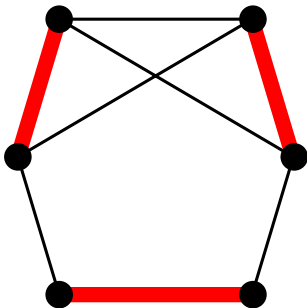
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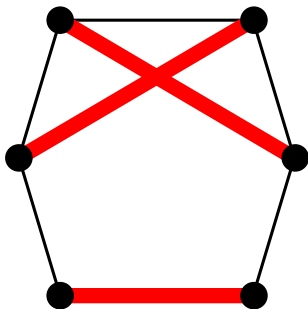
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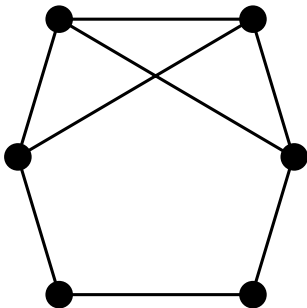


$$\Phi(G) = 3$$

8 edges

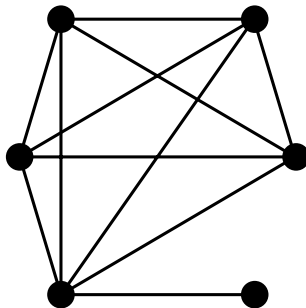
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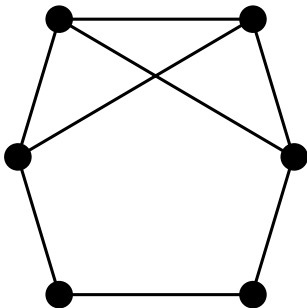
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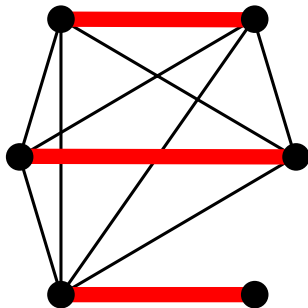
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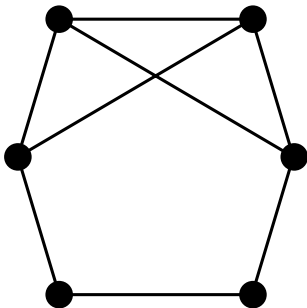
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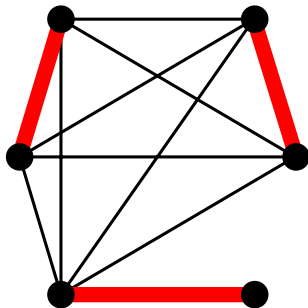
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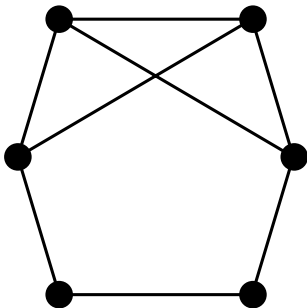
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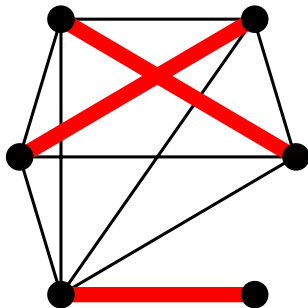
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Question (Dudek, Schmitt, 2010) What is the maximum number of edges in a graph with exactly n vertices and p perfect matchings?

Definition Let n be an even number and fix $p \geq 1$.

$$f(n, p) = \max\{|E(G)| : |V(G)| = n, \Phi(G) = p\}.$$

Graphs attaining this number of edges are **p -extremal**.

Hetyei's Theorem

Theorem (Hetyei's Theorem, 1986) For all even $n \geq 2$,

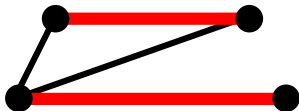
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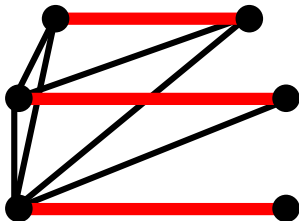
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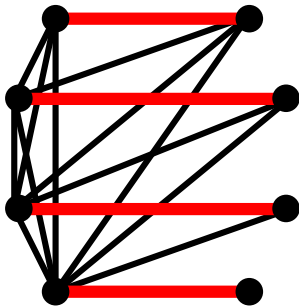
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The Form of $f(n, p)$

Theorem (Dudek, Schmitt, 2010) For each p , there exist constants

n_p, c_p so that for all $n \geq n_p$,

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p	1	2	3	4	5	6
c_p	0	1	2	2	2	3
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Structure Theorem

Theorem (Hartke, Stolee, West, Yancey, 2013) For a fixed p , every graph G with n vertices, p perfect matchings, and $f(n, p) = \frac{n^2}{4} + c_p$ edges is composed of a finite list of **fundamental graphs** combined in specified ways.

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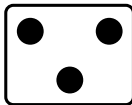
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We should “simply” list all graphs of this size and pick the best ones!

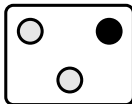
Example: Generating Graphs by Edges

We can build graphs starting at \overline{K}_n by adding edges.



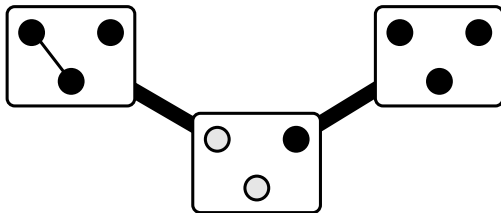
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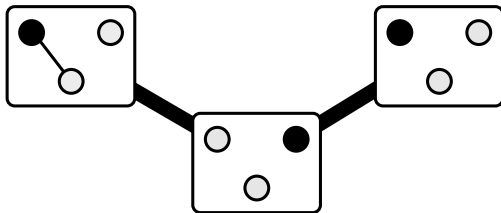
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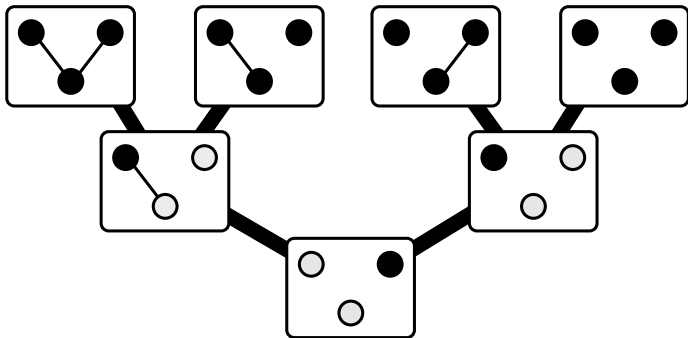
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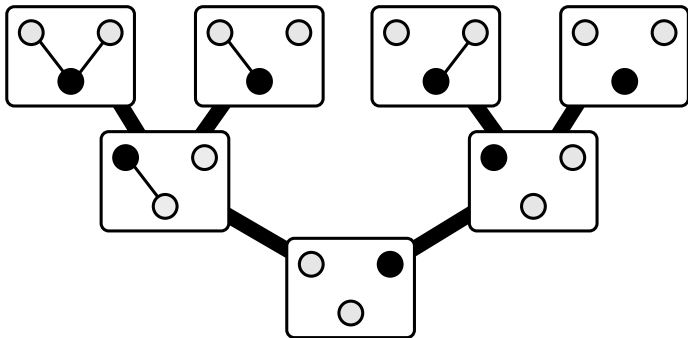
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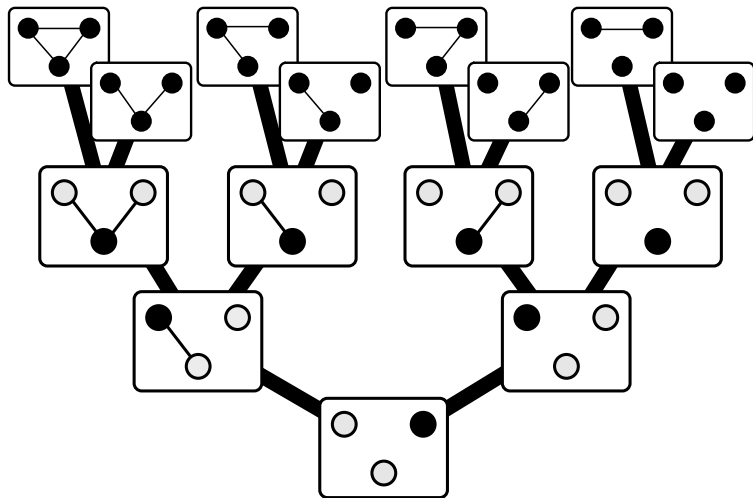
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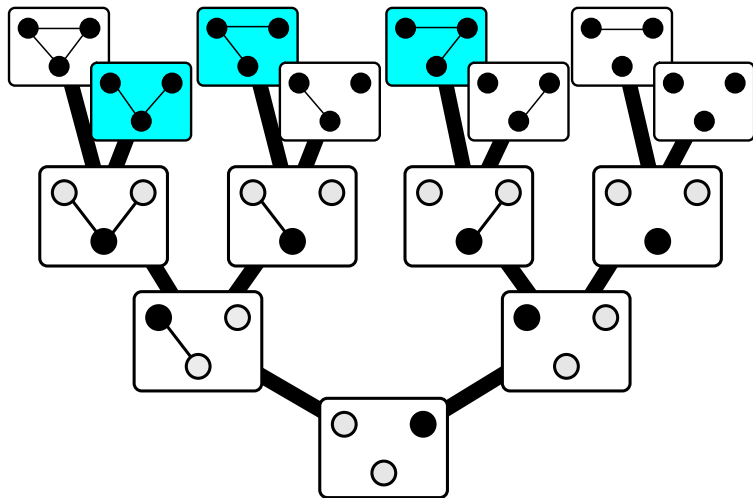
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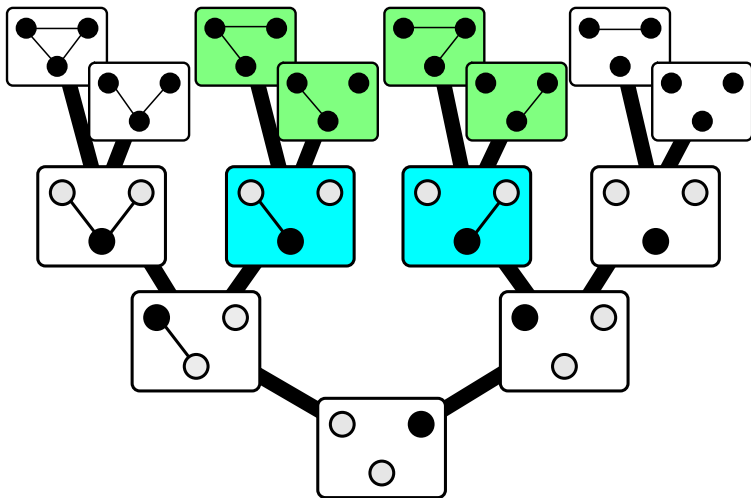
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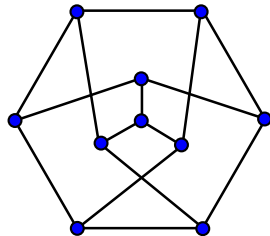
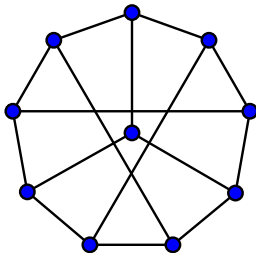
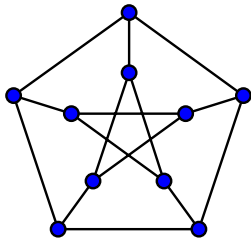


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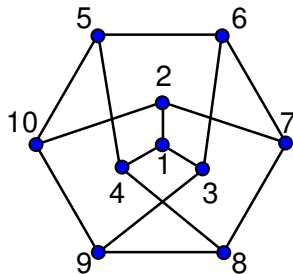
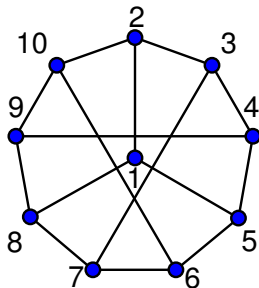
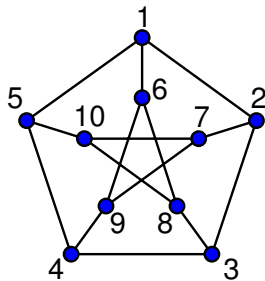
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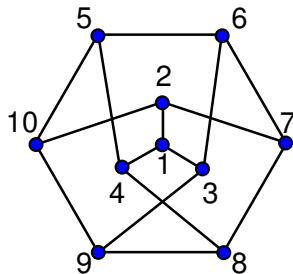
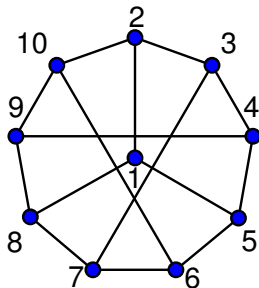
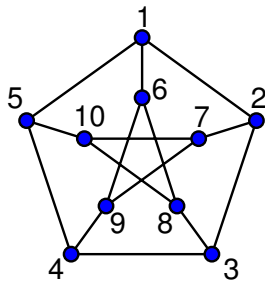


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An **isomorphism** between G_1 and G_2 is a bijection from $V(G_1)$ to $V(G_2)$ that induces a bijection from $E(G_1)$ to $E(G_2)$.



Labeled Versus Unlabeled Objects

A **labeled** graph has a linear ordering on the vertices.

An **unlabeled** graph represents an isomorphism class of graphs.

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An **unlabeled** graph represents an isomorphism class of graphs.

Most interesting graph properties are **invariant under isomorphism**.

n	Number of unlabeled connected graphs of order n
2	1
3	2
4	5
5	19
6	85
7	509
8	4,060
9	41,301
10	510,489
11	7,319,447
12	117,940,535
13	2,094,480,864
14	40,497,138,011
15	845,480,228,069
16	1,894,152,284,590
17	453,090,162,062,723
18	11,523,392,072,541,432
19	310,467,244,165,539,782
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OEIS Sequence A002851

Grows $2^{\Omega(n^2)}$.

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Requires about **1 day** of CPU Time.

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Requires over **1 year** of CPU Time.

Structure Theorem

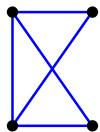
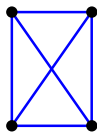
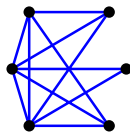
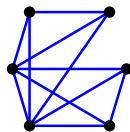
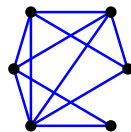
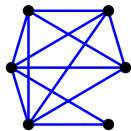
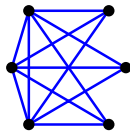
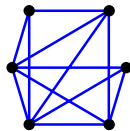
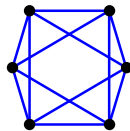
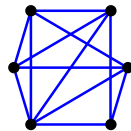
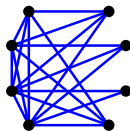
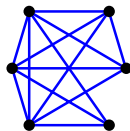
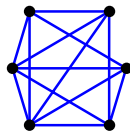
Theorem (Hartke, Stolee, West, Yancey, 2013) For a fixed p , every graph G with n vertices, p perfect matchings, and $f(n, p) = \frac{n^2}{4} + c_p$ edges is composed of a finite list of **fundamental graphs** combined in specified ways.

Proof involves several classic structure theorems from matching theory in an extremal setting.

For $p \leq 10$, the graphs have order at most 12.

We should “simply” list all graphs of this size and pick the best ones!

Fundamental Graphs for $2 \leq p \leq 10$

 $p = 2$  $p = 3$  $p = 4$  $p = 5$  $p = 5$  $p = 6$  $p = 6$  $p = 7$  $p = 8$  $p = 8$  $p = 8$  $p = 9$  $p = 10$

c_p for small p

p	1	2	3	4	5	6	7	8	9	10
c_p	0	1	2	2	2	3	3	3	4	4
	H	Dudek, Schmitt 2010					HSWY 2011			

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Q: Is c_p monotone in p ?

Structural Theorem, Redux

Without more involved computational methods, brute force methods cannot go farther.

Structural Theorem, Redux

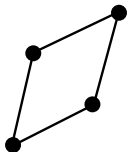
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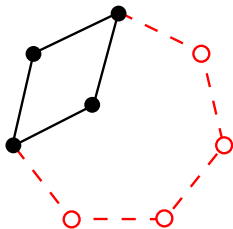
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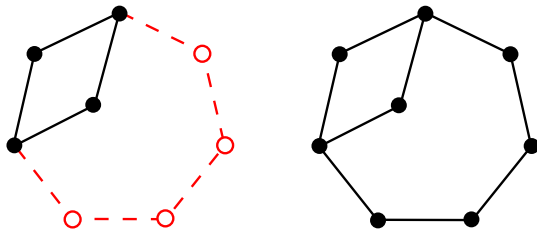
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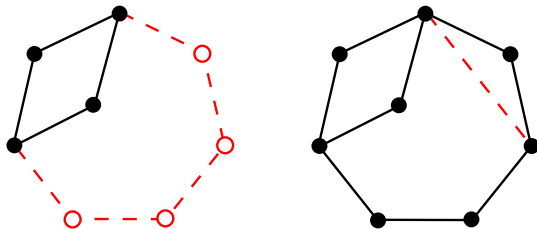
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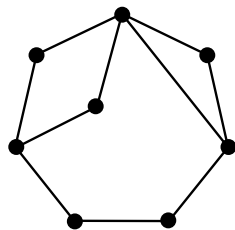
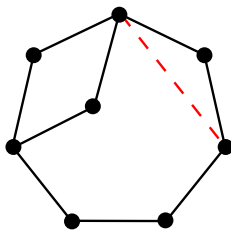
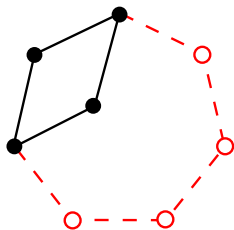
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Computational Method

Developed a computational method from:

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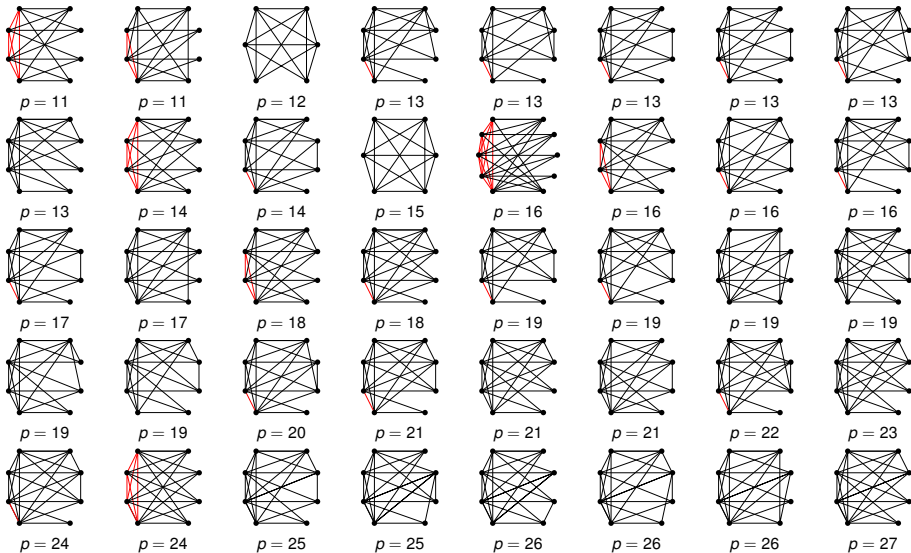
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Before: Stuck at $p \leq 10$ when searching on most 12 vertices.

Now: Found graphs for all $p \leq 27$ on up to 22 vertices.

Fundamental Graphs for $11 \leq p \leq 27$



c_p for small p

p	1	2	3	4	5	6	7	8	9	10
c_p	0	1	2	2	2	3	3	3	4	4
	H	Dudek, Schmitt					HSWY			

p	11	12	13	14	15	16	17	18	19	20
c_p	3	5	3	4	6	4	4	5	4	5
	Stolee									

p	21	22	23	24	25	26	27
c_p	5	5	5	6	5	5	6
	Stolee						

c_p for small p

p	1	2	3	4	5	6	7	8	9	10
c_p	0	1	2	2	2	3	3	3	4	4
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p	11	12	13	14	15	16	17	18	19	20
c_p	3	5	3	4	6	4	4	5	4	5
	Stolee									

p	21	22	23	24	25	26	27
c_p	5	5	5	6	5	5	6
	Stolee						

c_p not monotonic in p !

Blue numbers match conjectured upper bound.

What can you do?

Does this sound interesting? Here are some things **you** can do:

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- 3 Participate in the Discrete Mathematics Seminar:
<http://orion.math.iastate.edu/dept/seminar/dmseminar.htm>

Computational Combinatorics

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`http://www.math.iastate.edu/dstolee/`

November 3 & 5, 2014

Math 101