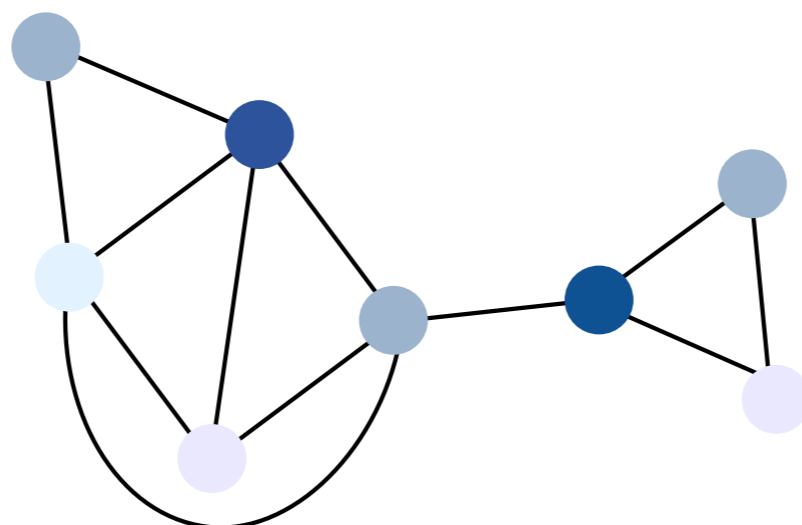


Chemical graph theory



Jacob Kautzky

MacMillan Group Meeting

April 3, 2018

Chemical graph theory

What is graph theory?

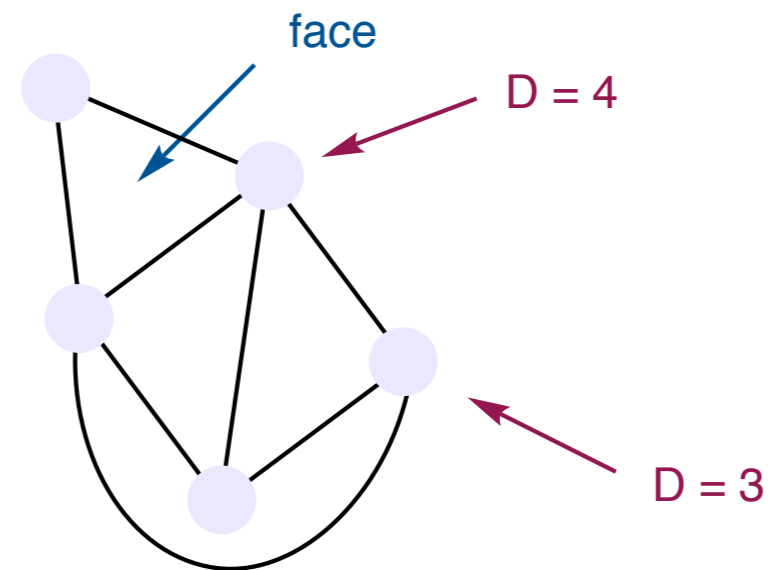
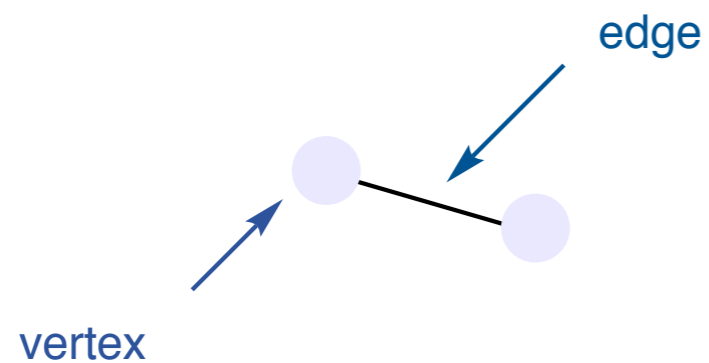
Historical uses of chemical graph theory

- **Isomer counting**
- **Chemical bonding**
- **Kinetics**

Modern uses of chemical graph theory

What is a graph?

- A graph is defined as a non empty set of vertices and a set of edges



Order of the graph (N) = # of vertices

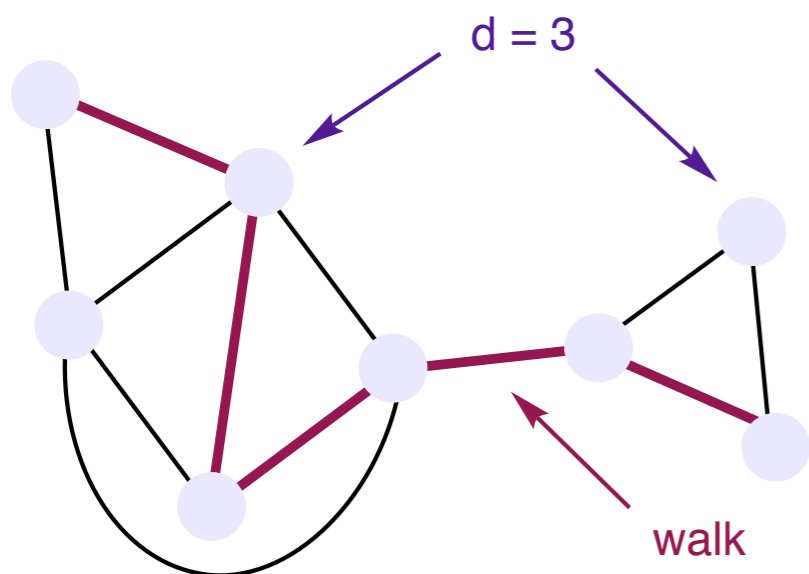
Size of the graph (M) = # of edges

Degree of a vertex (D) = # of edges incident with a vertex

$$\sum_{i=1}^N D(i) = 2M$$

$$N - M + F = 2$$

Walks, trails, paths, and cycles



Walk - an alternate sequence of vertices and edges, beginning and ending with a vertex

■ **Open** - starts and ends at different vertices

■ **Closed** - starts and ends at the same vertex

Length (l) - number of occurrence of edges in a walk

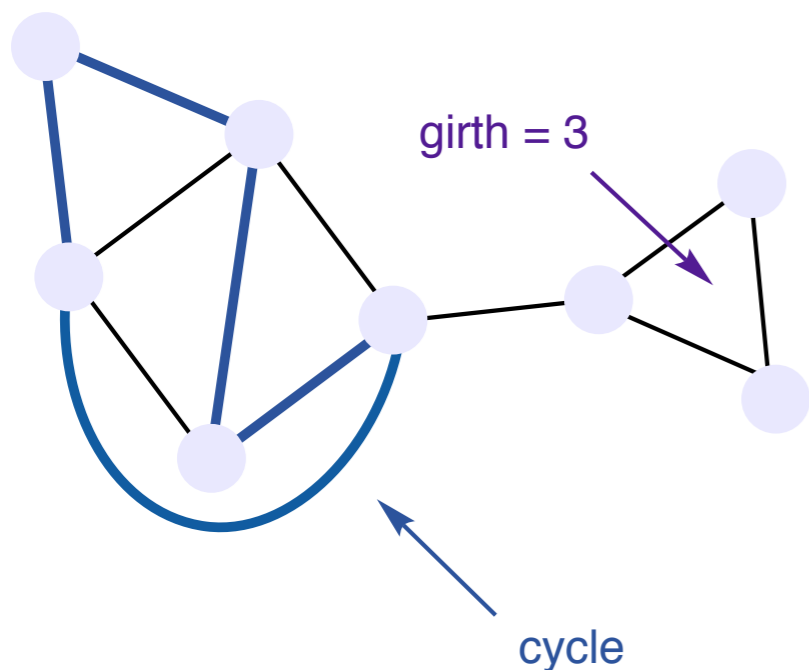
Trail - a walk where all edges are distinct

Path - a walk where all vertices are distinct

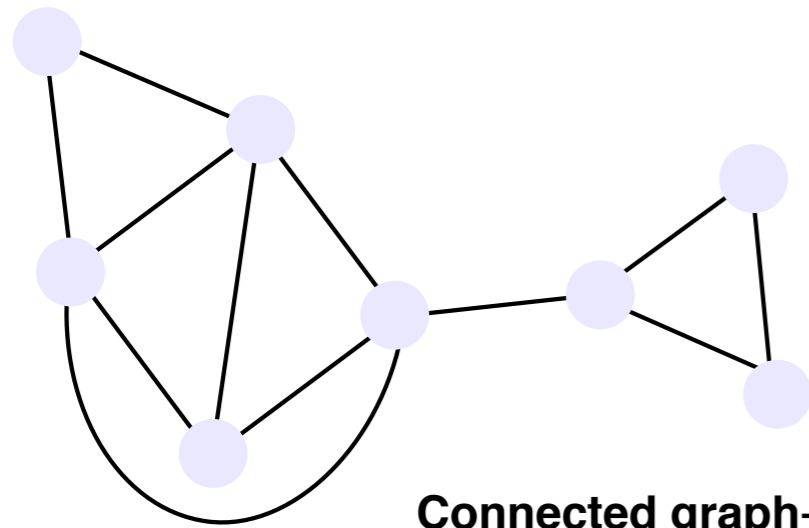
Distance (d) - the length of the shortest path between 2 vertices

Cycle - a path that starts and ends at the same vertex

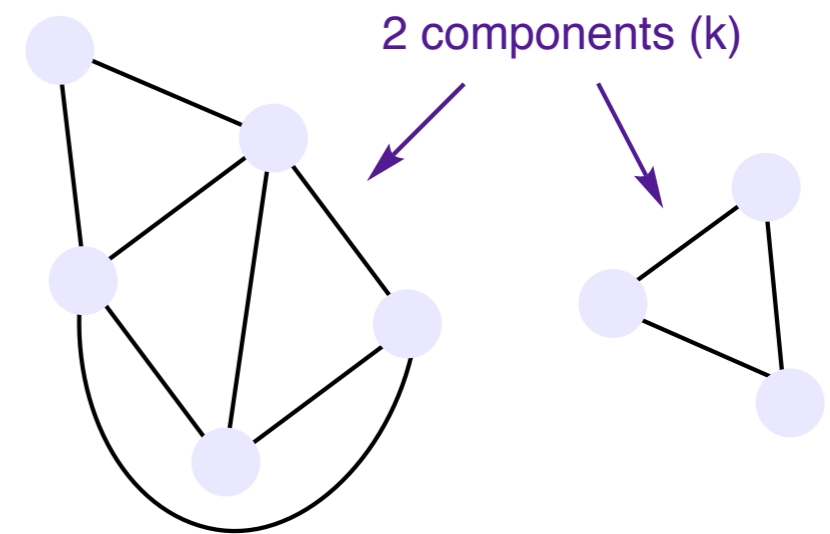
Girth - length of the smallest cycle in a graph



Connected vs disconnected and simple, general, and multigraphs



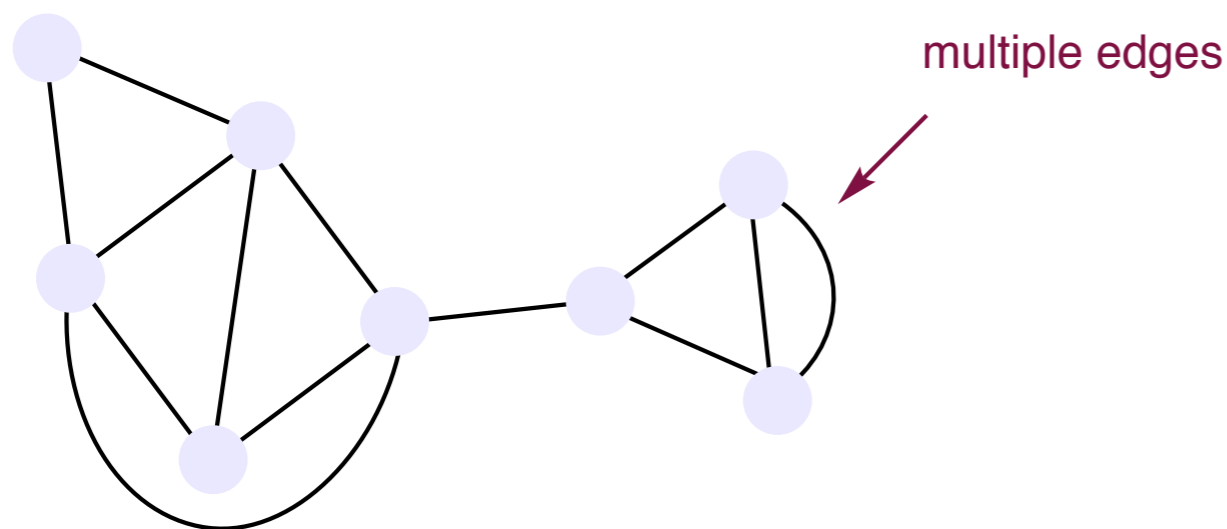
Connected graph - \exists a path between any 2 vertices



2 components (k)

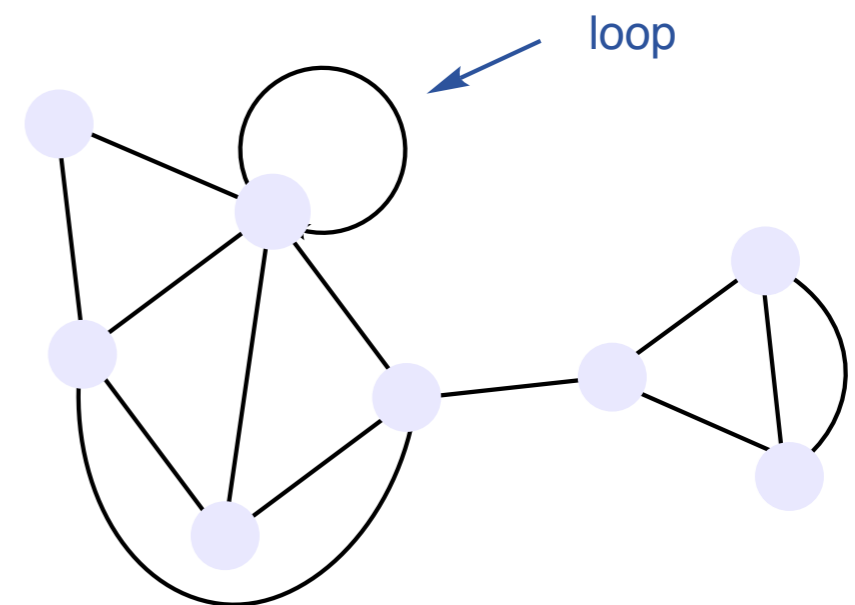
Disconnected graph

Simple graph - a graph without loops or multiple edges between two vertices



multiple edges

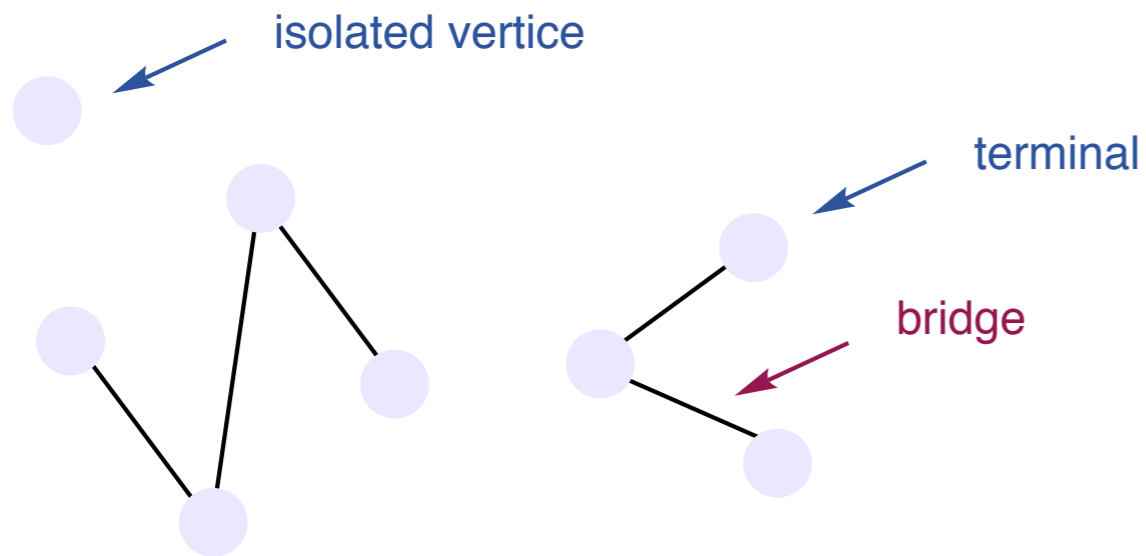
Multigraph - a graph that allows multiple edges between 2 vertices



loop

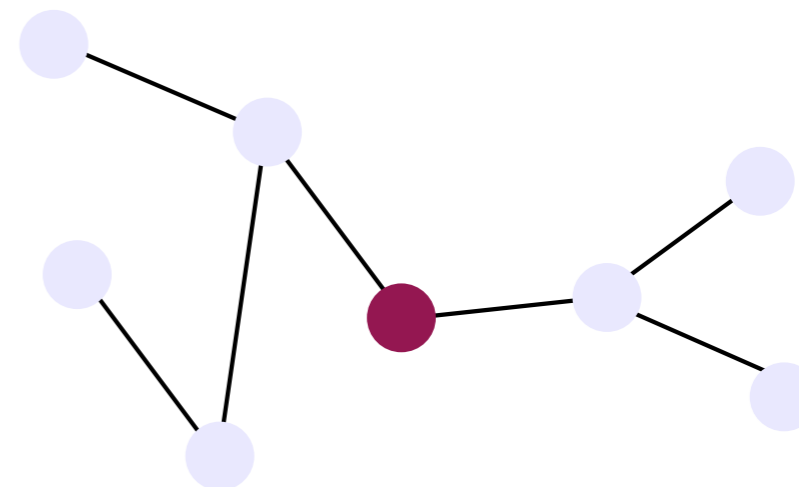
General graph - a graph that allows multiple edges and loops

Forests and trees



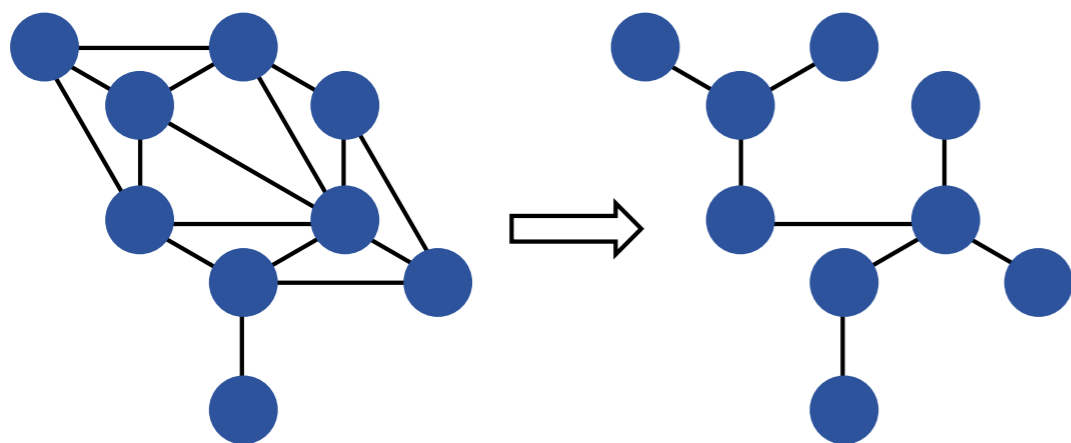
Forest - an acyclic graph

Bridge - an edge that when removed disconnects a graph

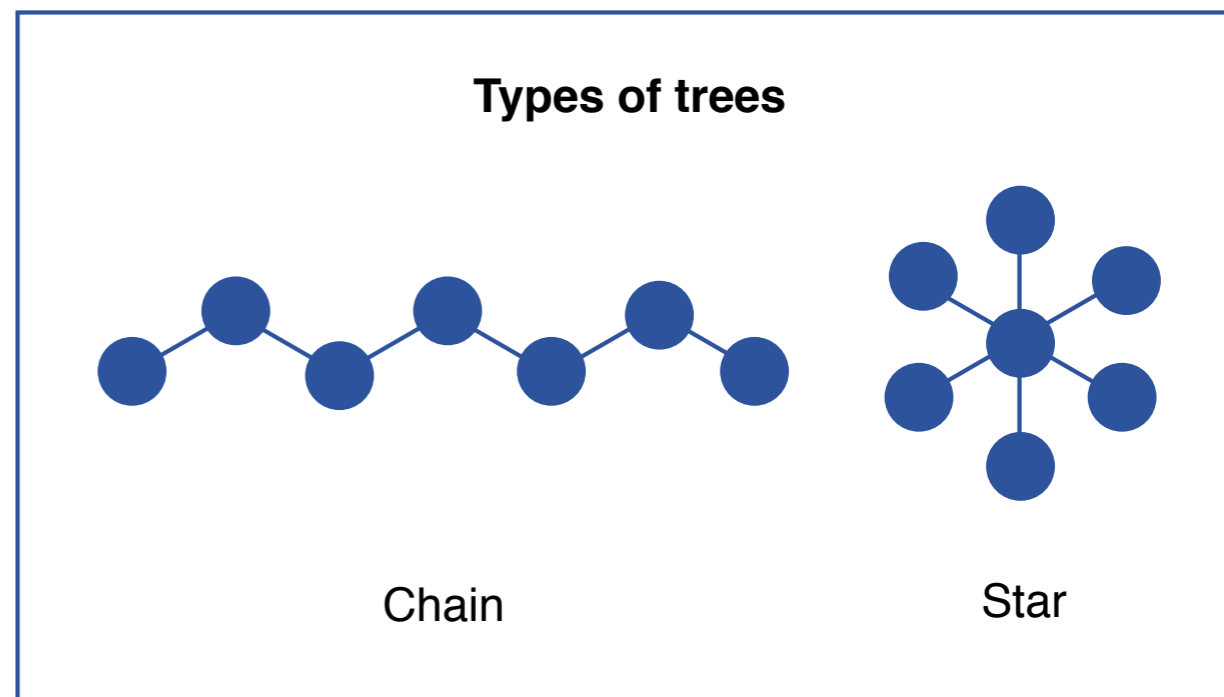


Tree - a connected acyclic graph

Rooted tree - a tree with a vertice distinguished in some fashion

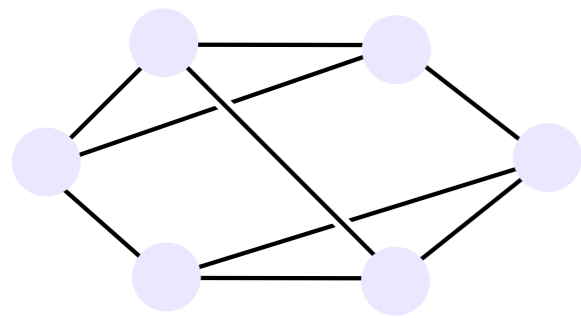


Spanning tree - a graph subgraph that includes all vertices of a graph with the minimal number of edges to remain connected

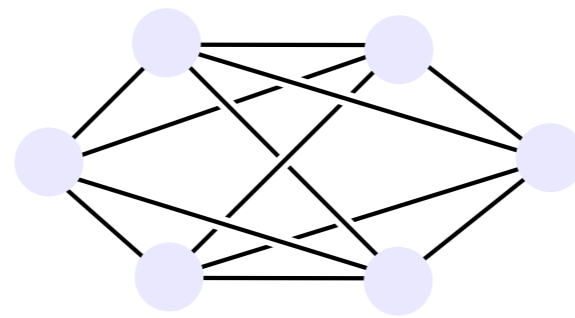


Types of graphs — regular graphs

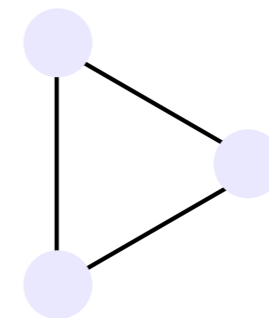
A regular graph is a graph where every vertex has the same valency



regular graph of degree 3



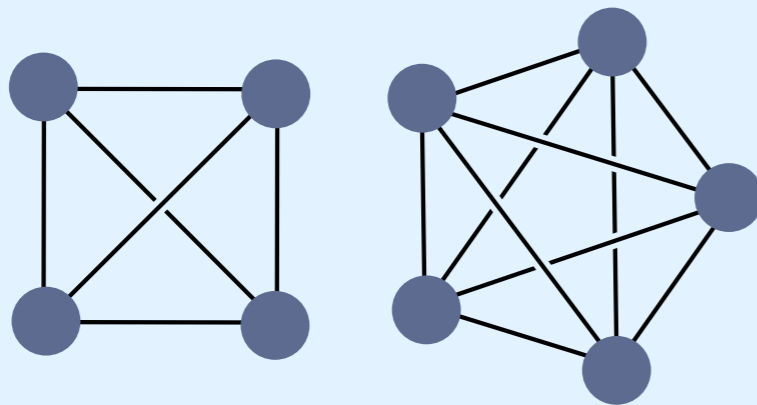
regular graph of degree 4



regular graph of degree 2

$$M = 0.5 * N * D$$

complete graph

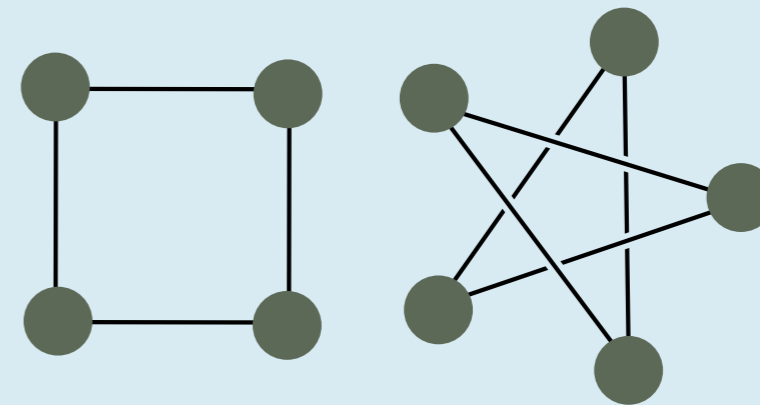


- A graph where each vertice has $D = N - 1$

- Denoted by K_N

- $M = \binom{N}{2}$

cycle



- A graph where each vertice has $D = 2$

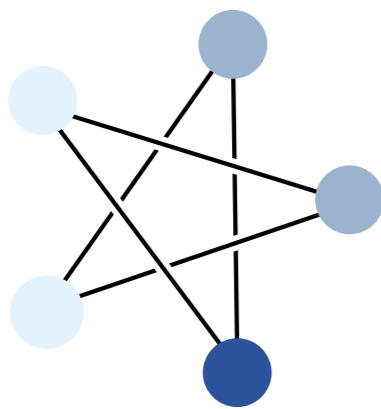
- Denoted by C_N

- A cycle is termed even/odd if N is even/odd

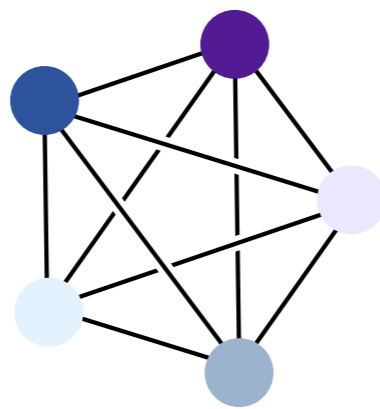
Vertex coloring

Assigning colors to vertices so that no two adjacent vertices have the same color

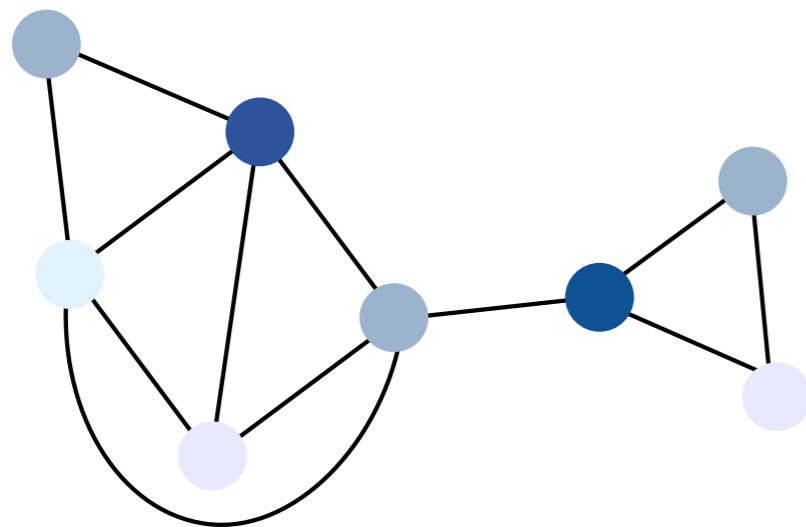
Chromatic number (k) - the minimal number of colors required to color a graph



$k = 3$

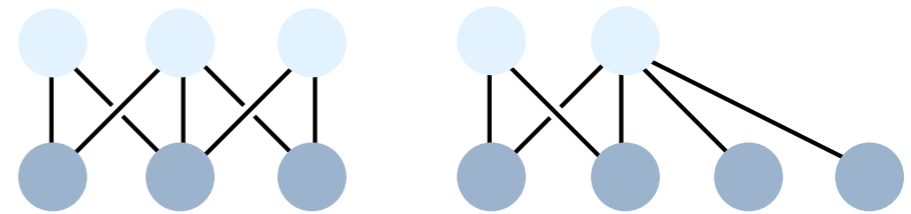


$k = 5$



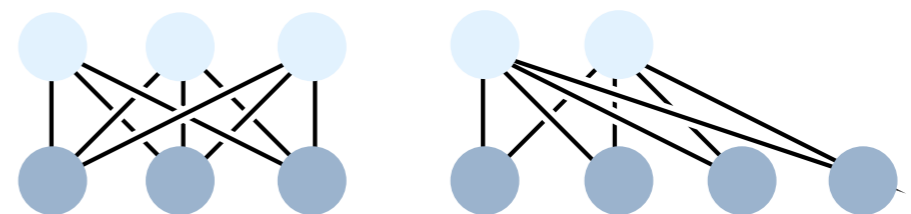
$k = 4$

Bipartite graph - a graph where the vertex set can be split into V_1 and V_2 where every edge connects a vertex in V_1 to one in V_2



■ A graph is a bipartite graph if and only if every cycle is of even number

■ All bipartite graphs are 2 colorable



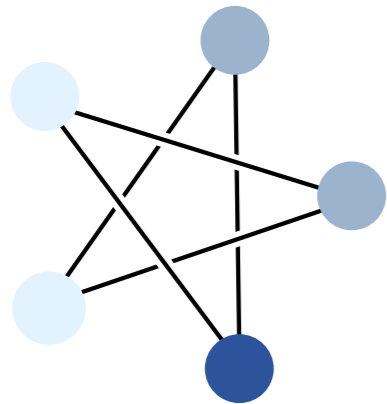
$K_{3,3}$

$K_{4,2}$

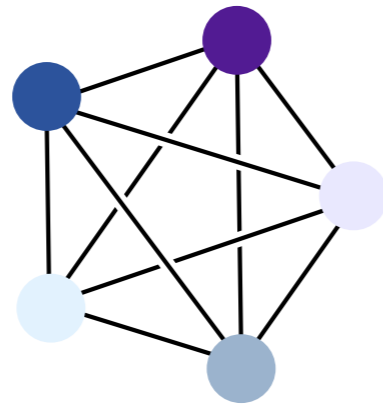
Complete bipartite graph $K_{s,u}$ - every vertex in V_1 is joined to every vertex in V_2

Planar graphs

A graph is planar if it can be drawn such that no edges intersect

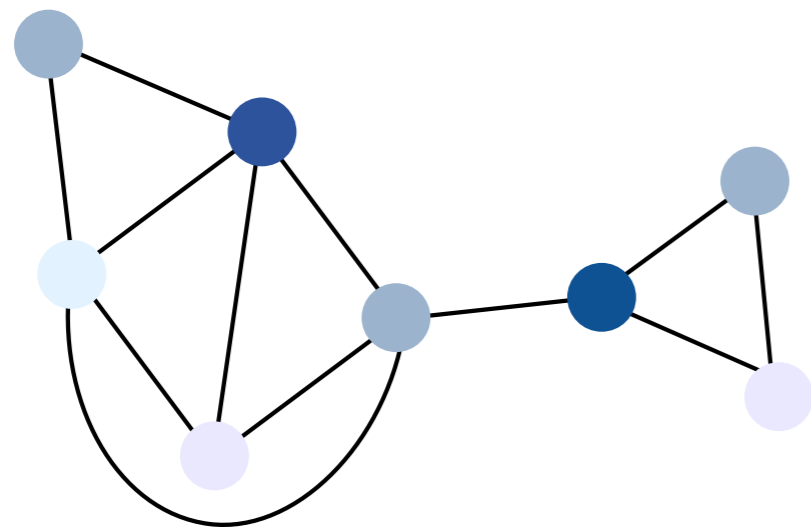
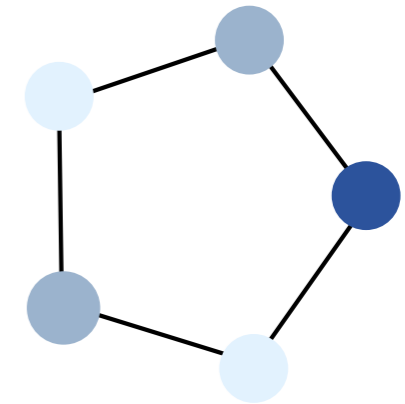
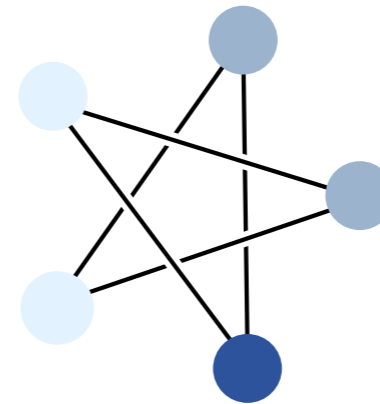


Planar



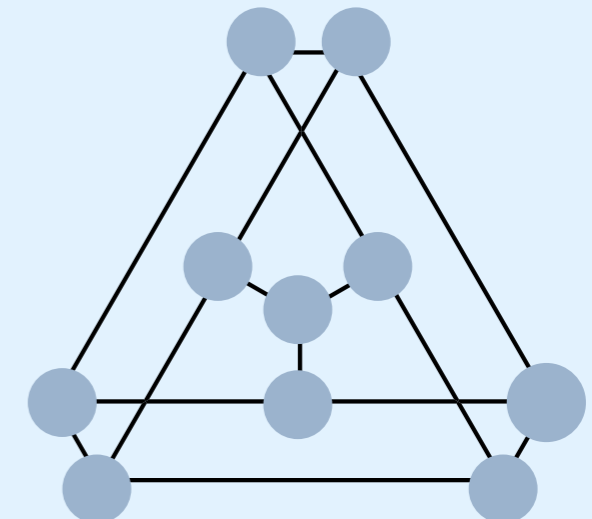
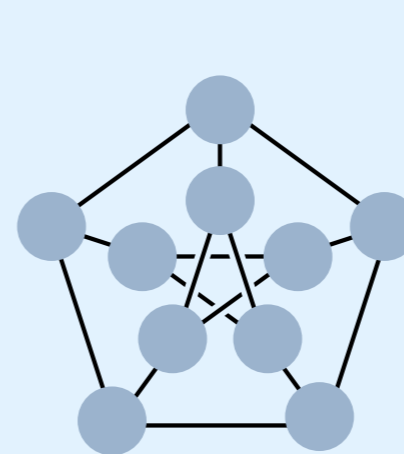
Not planar

Two graphs are isomorphic if there exists a 1:1 mapping from one onto the other (i.e. they are identical, but drawn differently)



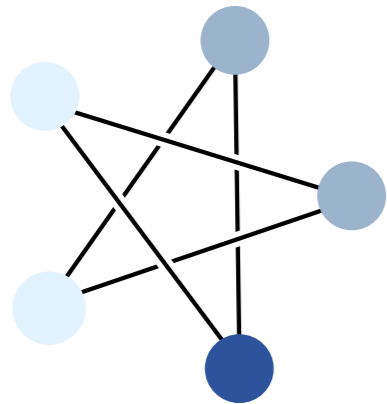
Planar

Identifying isomorphic graphs without sampling all $N!$ mappings is challenging and remains a problem in graph theory

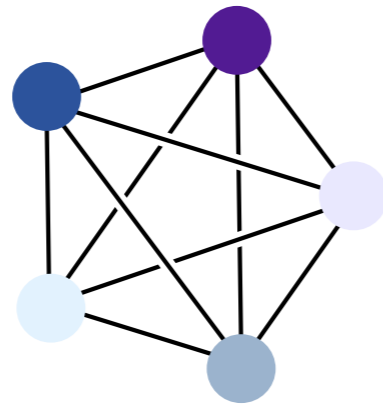


Planar graphs

A graph is planar if it can be drawn such that no edges intersect

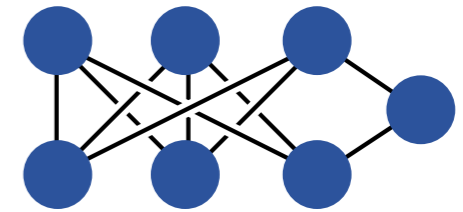
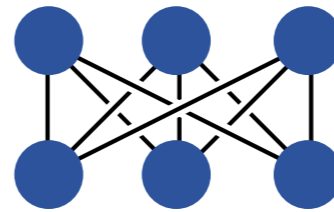


Planar

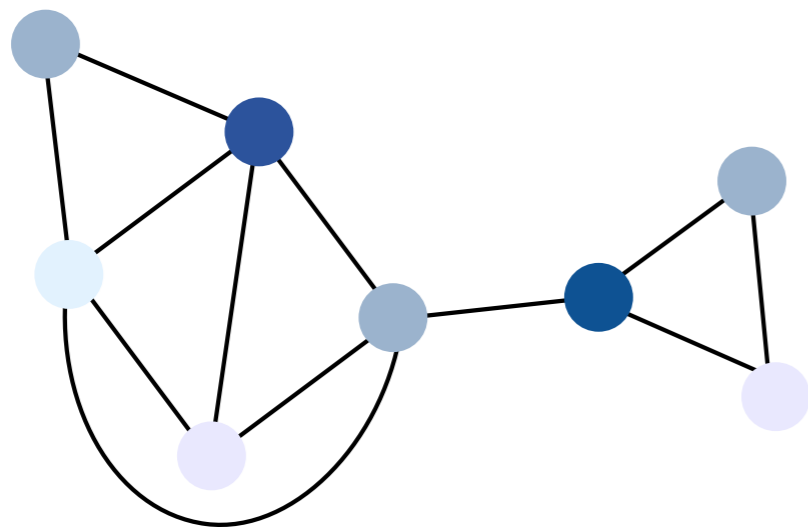


Not planar

A graph is planar if it does not contain a subgraph homeomorphic to K_5 or $K_{3,3}$



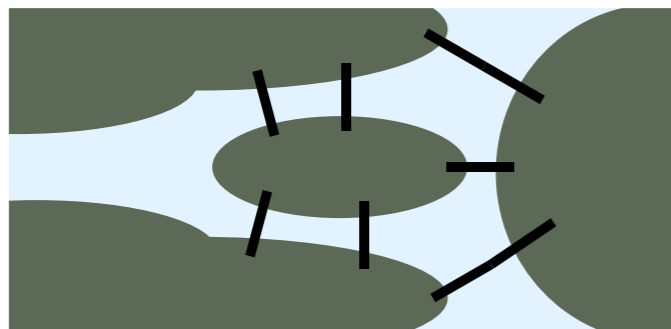
Two graphs are homoemorphic if they can be obtained from the same graph by inserting new vertices of valency 2 into its edges



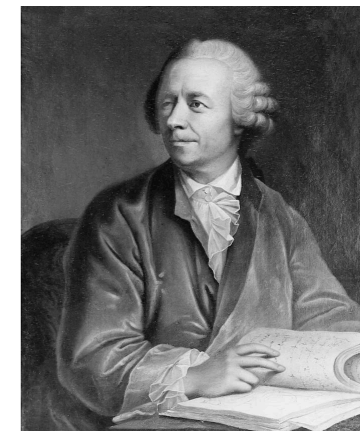
Planar

All planar graphs are 4 - colorable

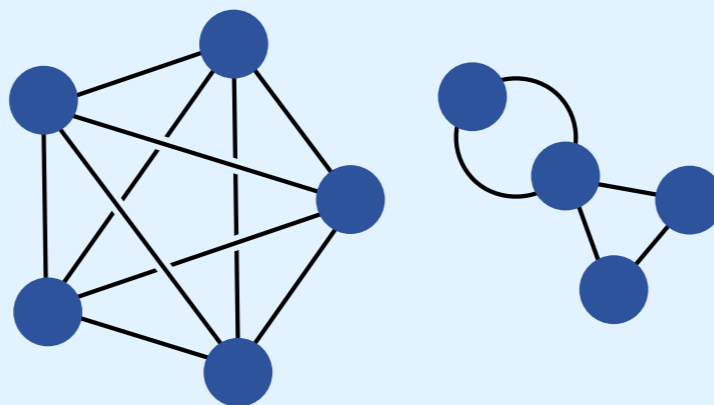
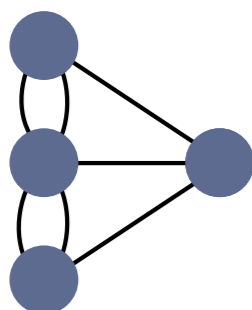
Euler Circuit – the Königsberg bridge problem



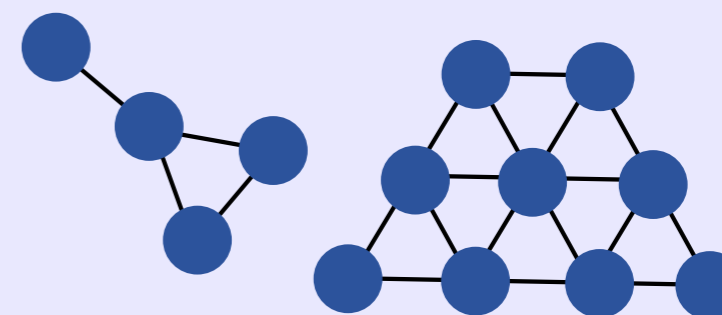
Is it possible to cross every bridge exactly once and start and end at the same spot?



Graphical Model



Examples of Euler Circuits

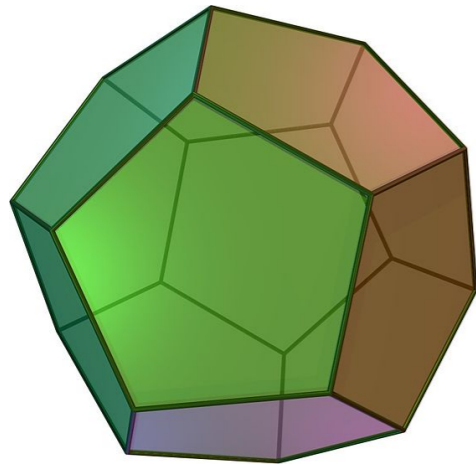


Examples of Euler Paths

- An Euler circuit is a path that starts and ends at the same vertices and traverses every edge exactly once
 - Only occurs if every vertex is of even degree

- An Euler path is a path that traverses every edge exactly once, but doesn't start and end at the same vertex
 - Only occurs if every vertex besides two are of even degree

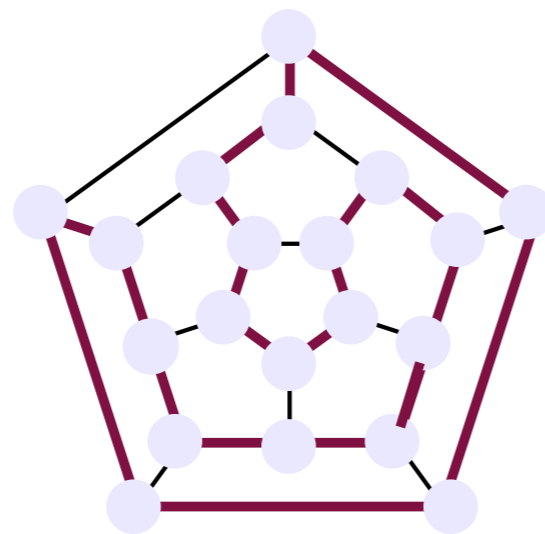
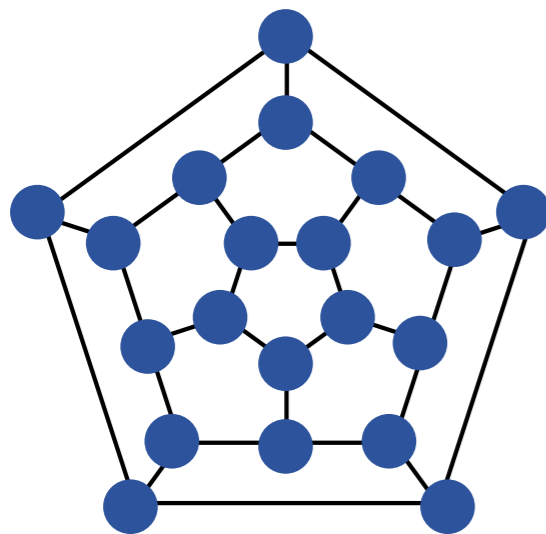
Hamiltonian circuit – the icosian game



Is it possible to start at one vertex of a dodecahedron, travel to every other vertex on the polyhedra, and then return to the initial vertex without visiting any vertex besides the starting one twice?

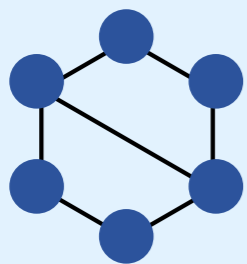


Graphical Model

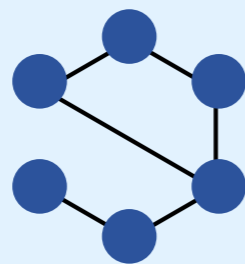


Hamiltonian Circuit

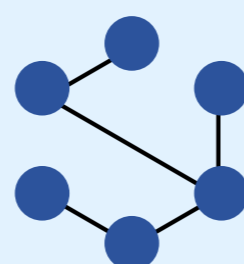
- A circuit that visits every vertex exactly once
- A mathematical formula for if a circuit exists has yet to be developed
- If the $D(i) \geq N/2$ for every vertex i , then a circuit exists



contains a Hamiltonian circuit

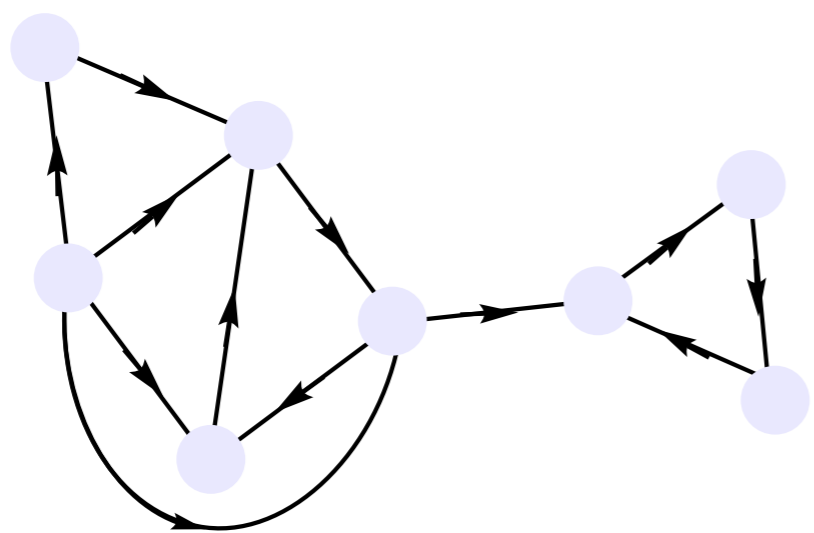


contains a Hamiltonian cycle

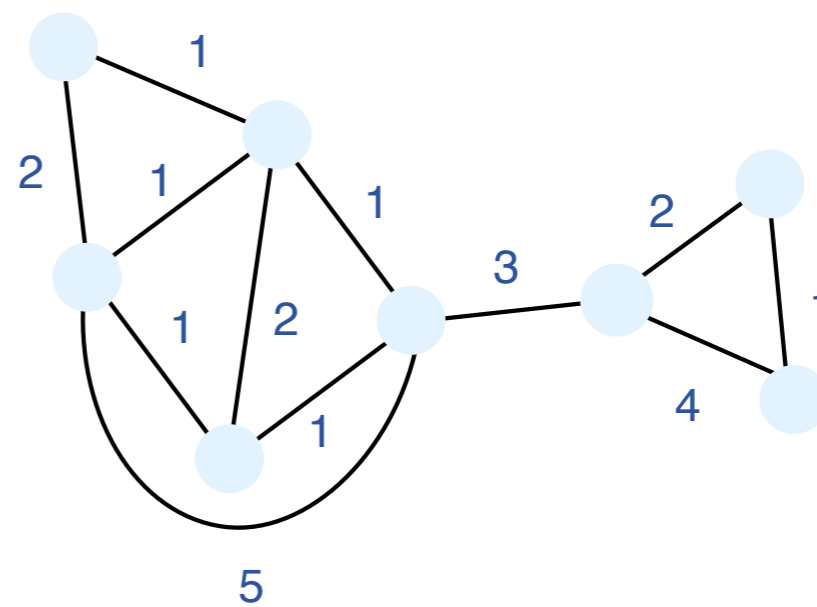


contains neither

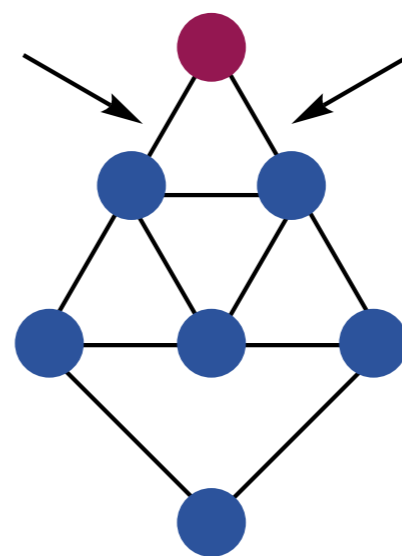
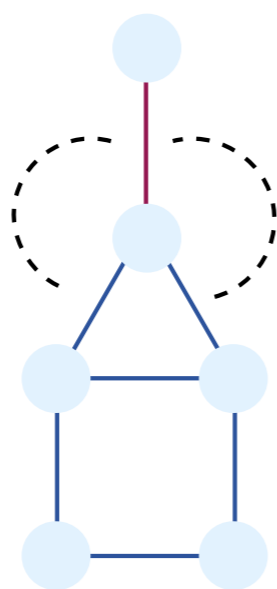
Digraphs, line graphs, and weighted graphs



Digraph

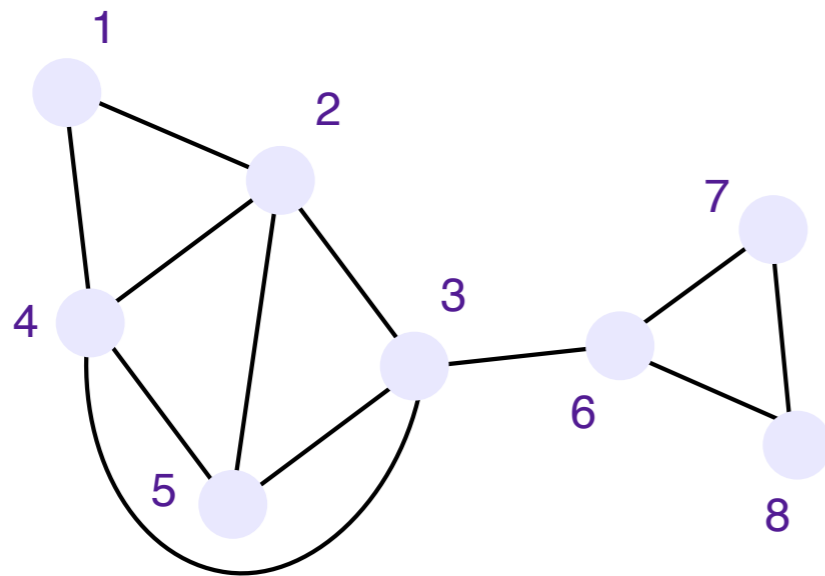


Weighted Graph



Line graph

Graphs can be converted to matrices and polynomials



Characteristic Polynomial

$$P(G) = \det |xI - A|$$

	1	2	3	4	5	6	7	8
1	0	1	0	1	0	0	0	0
2	1	0	1	1	1	0	0	0
3	0	1	0	1	1	1	0	0
4	1	1	1	0	1	0	0	0
5	0	1	1	1	0	0	0	0
6	0	0	1	0	0	0	1	1
7	0	0	0	0	0	1	0	1
8	0	0	0	0	0	1	1	0

Adjacency matrix

	1	2	3	4	5	6	7	8
1	0	1	2	1	2	3	4	4
2	1	0	1	1	1	2	3	3
3	2	1	0	1	1	1	2	2
4	1	1	1	0	1	2	3	3
5	2	1	1	1	0	2	3	3
6	3	2	1	2	2	0	1	1
7	4	3	2	3	3	1	0	1
8	4	3	2	3	3	1	1	0

Distance matrix

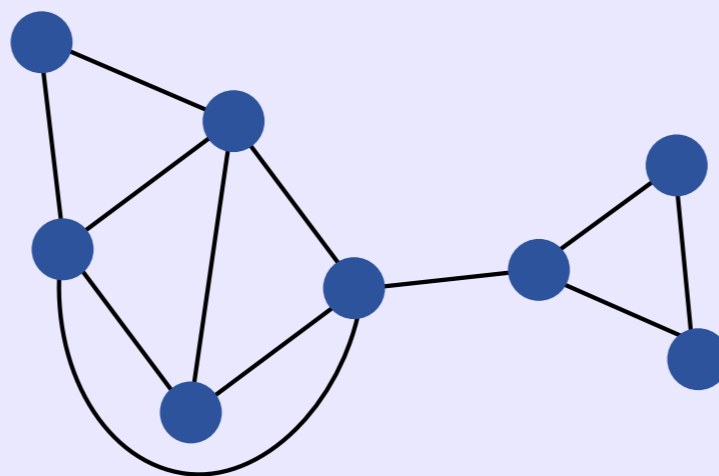
Applying graph theory to chemistry

Molecular Structures

- vertices represent atoms
- edges represent bonds
- weighted edges can represent double bonds or C-X bonds

Polymers

- vertices represent building blocks
- edges represent connections



Graph Theory

Kinetics

- vertices represent intermediates
- edges represent pathways
- frequently digraphs

And many more...

- aromaticity
- depicting orbitals and electrons
- NMR analysis
- crystals and clusters
- mapping reaction space

Chemical graph theory

What is graph theory?

Historical uses of chemical graph theory

- **Isomer counting**
- **Chemical bonding**
- **Kinetics**

Modern uses of chemical graph theory

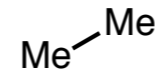
Isomer counting

How can we go about counting the number of isomers possible for a given carbon number in a systematic fashion?

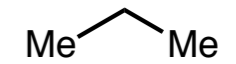
C = 1



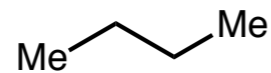
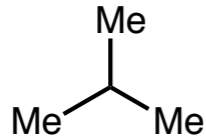
C = 2



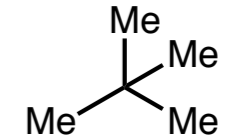
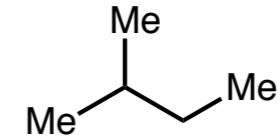
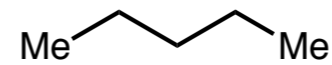
C = 3



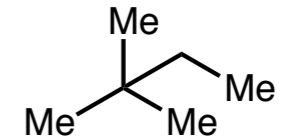
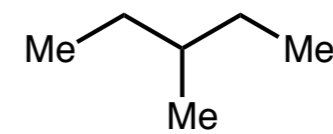
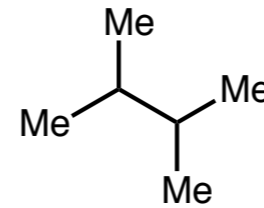
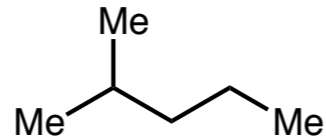
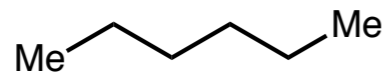
C = 4



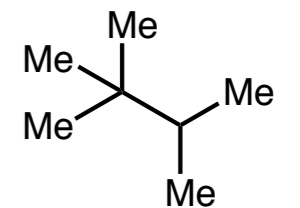
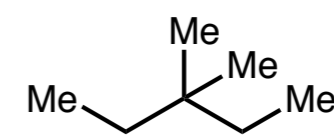
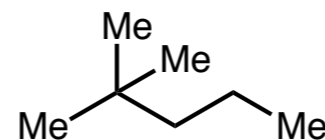
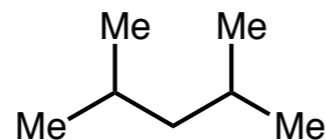
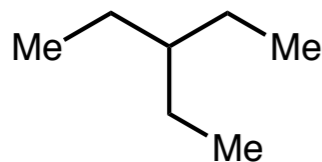
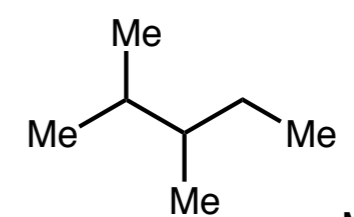
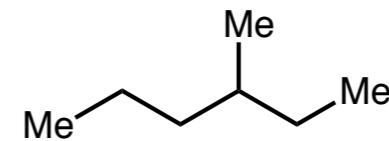
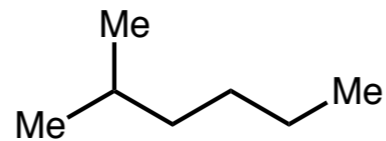
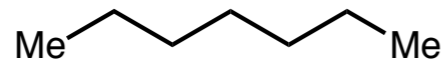
C = 5



C = 6



C = 7



Isomer counting – the Cayley approach

Recursive approach

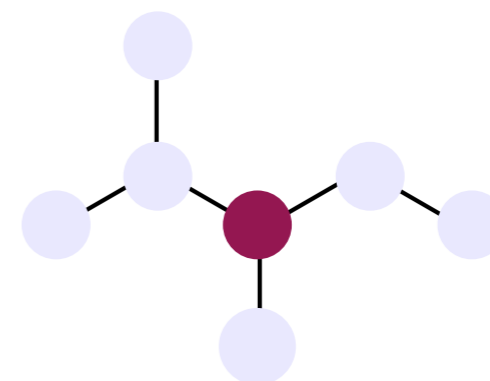
Counted the number of centric and bicentric trees

Developed methods for counting rooted and unrooted trees and then limited them to 4 vertices

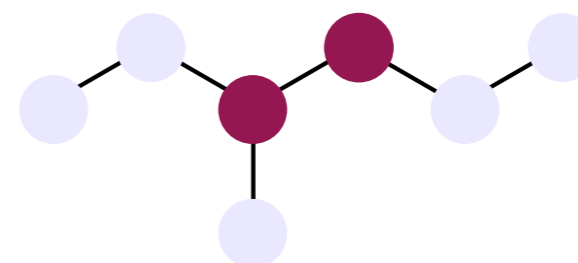
Successfully counted the number of C1-C11 alkanes

Rather tedious process

Gave incorrect answers for C12 and C13 alkanes



centric tree



bicentric tree

Isomer counting – the Henze-Blair approach

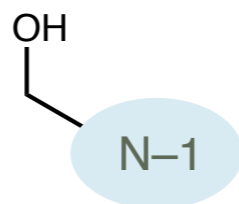
Counting the number of alcohols on acyclic alkanes

Let T_N be the number of alcohols of carbon N and p_N , s_N , and t_N be the number of primary, secondary and tertiary alcohols respectively

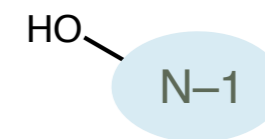
$$\text{Then } T_N = p_N + s_N + t_N$$

primary alcohols

$$p_N = T_{N-1}$$

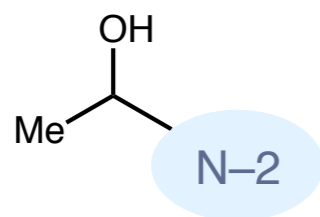


can be thought of as counting

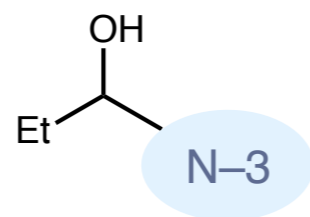


secondary alcohols

$$s_N = \begin{cases} T_1 * T_{N-2} + T_2 * T_{N-3} + \dots + T_{(N-2)/2} * T_{N/2} & \text{if } N = \text{even} \\ T_1 * T_{N-2} + T_2 * T_{N-3} + \dots + T_{(N-3)/2} * T_{(N+1)/2} + (1/2) * T_{(N-1)/2} * [1 + T_{(N-1)/2}] & \text{if } N = \text{odd} \end{cases}$$



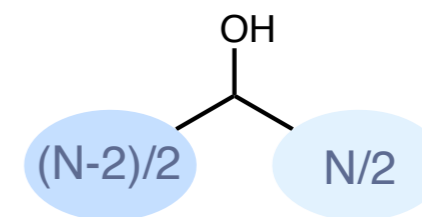
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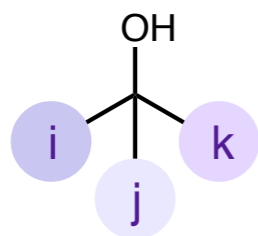
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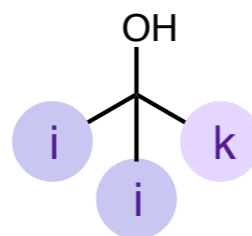
Isomer counting – the Henze-Blair approach

tertiary alcohols

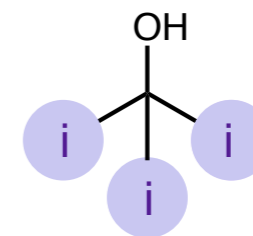
A tertiary alcohol can be imagined to arise from combining 3 alkyl radicals R_i , R_j , and R_k with i , j , and k carbons respectively to the COH group



All possible permutations
where $i > j > k$



All possible permutations
where $i = j$ and $2i + k = N - 1$



All possible permutations
where $i = j = k$ and $3i = N - 1$

$$t_N = \left\{ \begin{array}{l} \Sigma T_i * T_j * T_k \\ + \\ 1/2 * \Sigma T_i * (1 + T_i) * T_k \\ + \\ 1/6 * T_i * (T_i + 1) * (T_i + 2) \end{array} \right. \begin{array}{l} i > j > k; i + j + k = N - 1 \\ i = j; i + j + k = N - 1 \\ i = j = k; i + j + k = N - 1 \end{array}$$

This approach has been expanded to deal with structural saturated hydrocarbons, unsaturated hydrocarbons, alkynes and even stereoisomeric alcohols

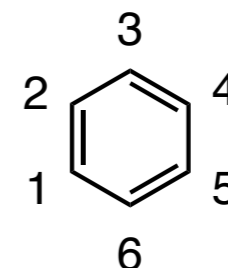
Isomer counting – the Pólya enumeration approach

Takes into account symmetry operations

Produces a polynomial that allows for isomer enumeration

f and g are equivalent if and only if there \exists a permutation α such that $\alpha(f) = g$

$$\text{Zyklenzeiger: } Z(A) = \frac{1}{|A|} \sum_{\alpha \in A} \prod_r s_r^{j_r(\alpha)}$$



How many ways are there to substitute a benzene ring with an R group X times?

Point group: D_6

Symmetry Operation	Permutation	Cycle index term
One identity E	(1) (2) (3) (4) (5) (6)	s_1^6
Two 6-fold rotations +/- C_6	(123456), (165432)	$2s_6^1$
Two 3-fold rotations +/- C_3	(153)(264), (135)(246)	$2s_3^2$
One vertical 2-fold rotation C_2	(14)(25)(36)	s_2^3
Three in plane binary axes C_2 that bisect 0 carbons	(16)(25)(34), (12)(36)(45), (14)(23)(56)	$3s_2^3$
Three in plane binary axes C_2 that bisect 2 carbons	(1)(4)(26)(35), (3)(6)(15)(24), (2)(5)(13)(46)	$3s_1^2 s_2^2$

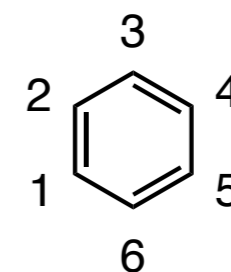
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How many ways are there to substitute a benzene ring with an R group X times?

Point group: D_6

$$Z(D_6) = 1/12 \{ s_1^6 + 3s_1^2 s_2^2 + 4s_2^3 + 2s_3^2 + 2s_6^1 \}$$

substituting $s_y^z = (1 + x^y)^z$

$$Z(D_6) = 1/12 [(1 + x)^6 + 3 * (1 + x)^2 * (1 + x^2)^2 + 4 * (1 + x^2)^3 + 2 * (1 + x^3)^2 + 2 * (1 + x^6)]$$

$$Z(D_6) = 1 + x + 3x^2 + 3x^3 + 3x^4 + x^5 + x^6$$

There are 3 unique isomers with 4 R substituents

Cycle index term

$$s_1^6$$

$$2s_6^1$$

$$2s_3^2$$

$$s_2^3$$

$$3s_2^3$$

$$3s_1^2 s_2^2$$

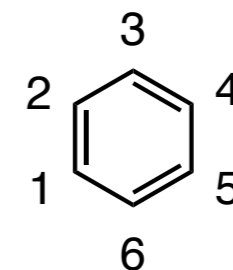
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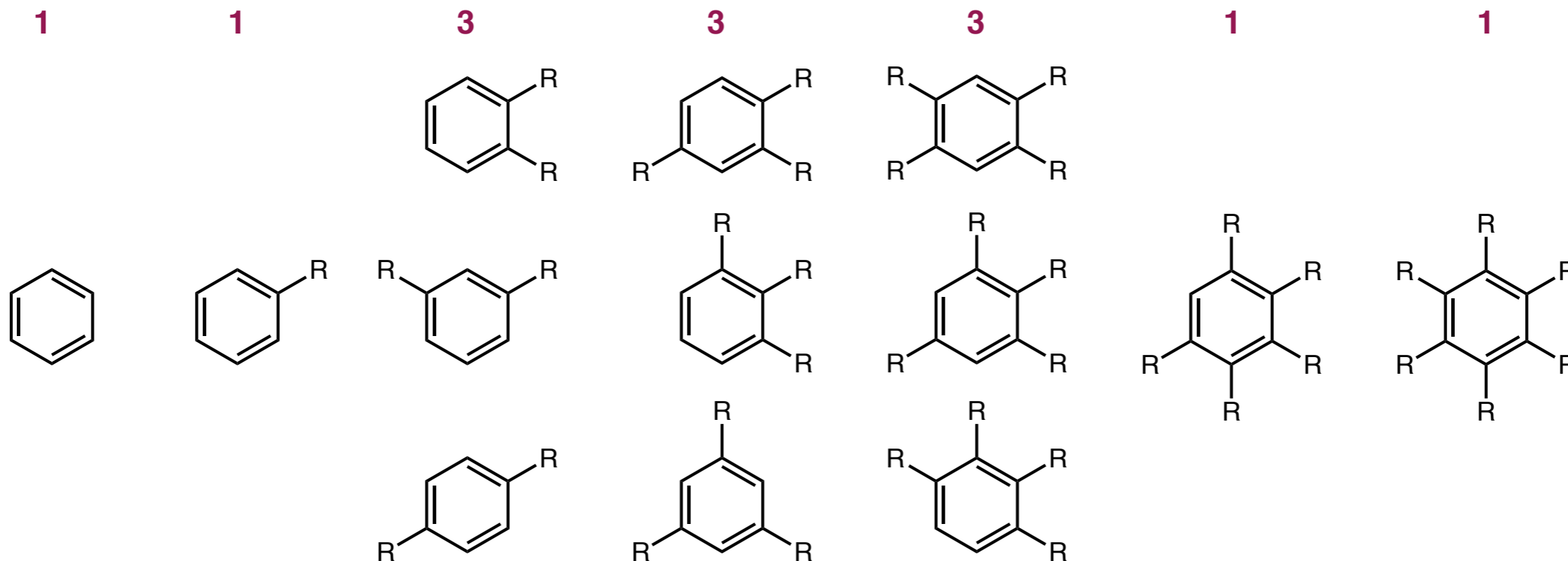
Zyklenzeiger:
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How many ways are there to substitute a benzene ring with an R group X times?

Point group: D_6

$$Z(D_6) = 1 + x + 3x^2 + 3x^3 + 3x^4 + x^5 + x^6$$



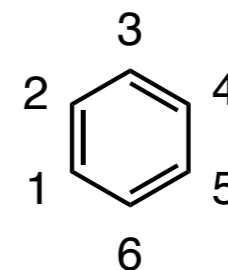
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How many ways are there to substitute a benzene ring with an R group X times?

Point group: D_6

This method has been extended to isotopic isomers, cyclic molecules, benzenoid hydrocarbons, porphyrins, chiral and achiral alkenes, ferrocenes, clusters, and inorganic structures, among others

Isomer counting – the N-tuple code

Assigns each tree a unique code

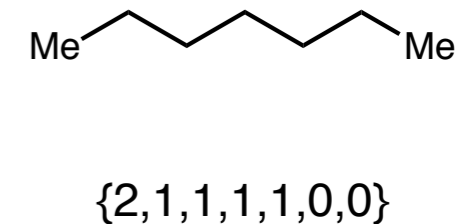
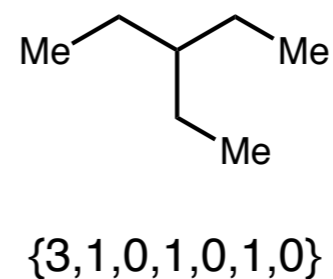
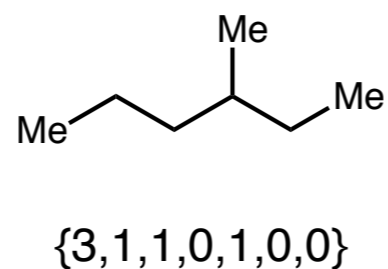
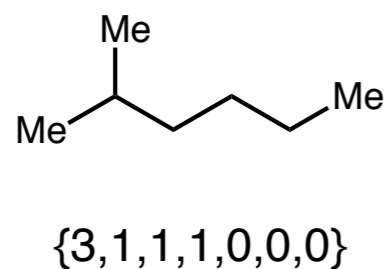
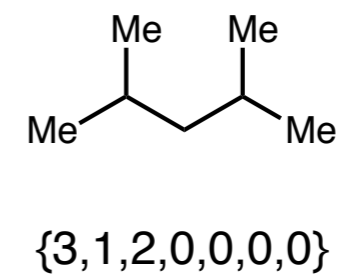
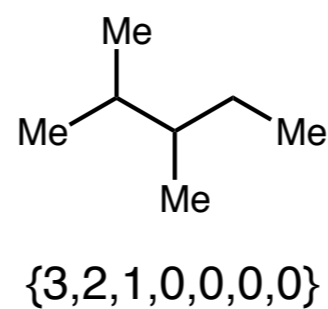
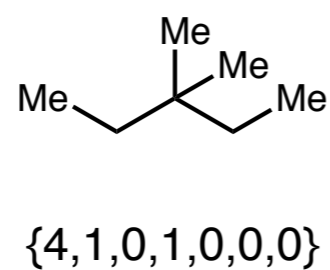
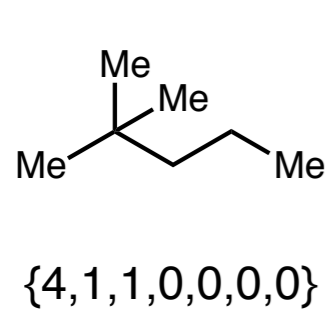
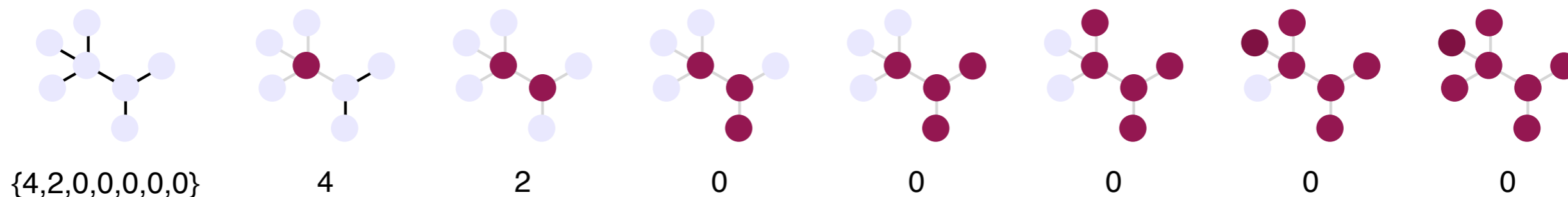
Isomorphic compounds have the same code

Have been used for generation and enumeration of acyclic graphs

Start from most substituted vertice

Remove vertex and incident edges, then examine the subtrees

Produce the lexicographically largest code



Chemical graph theory

What is graph theory?

Historical uses of chemical graph theory

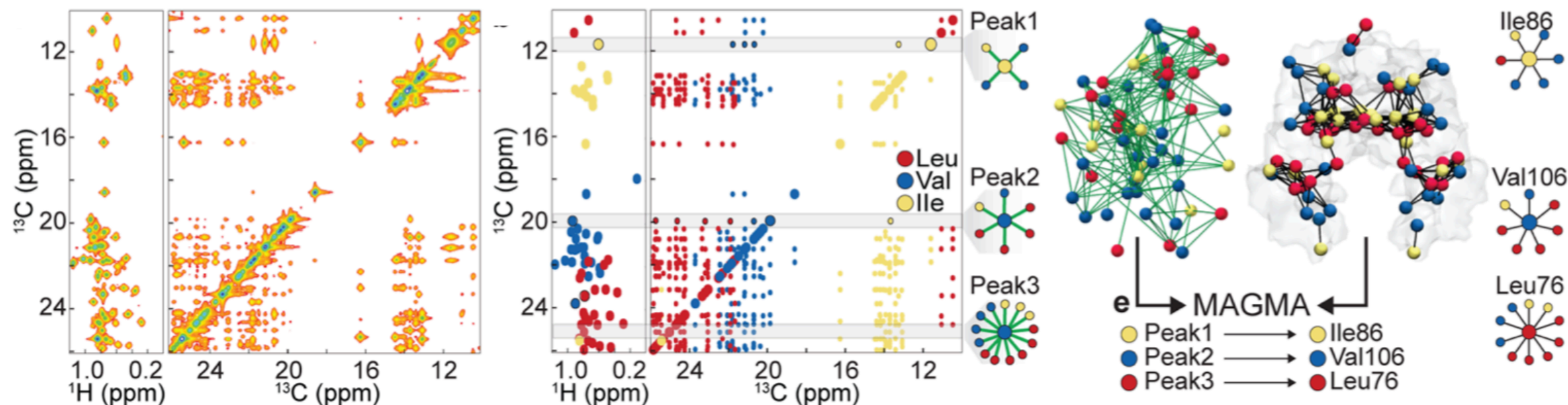
- Isomer counting
- Chemical bonding
- Kinetics

Modern uses of chemical graph theory

NMR assignment of methyl peaks in large molecules via MAGMA

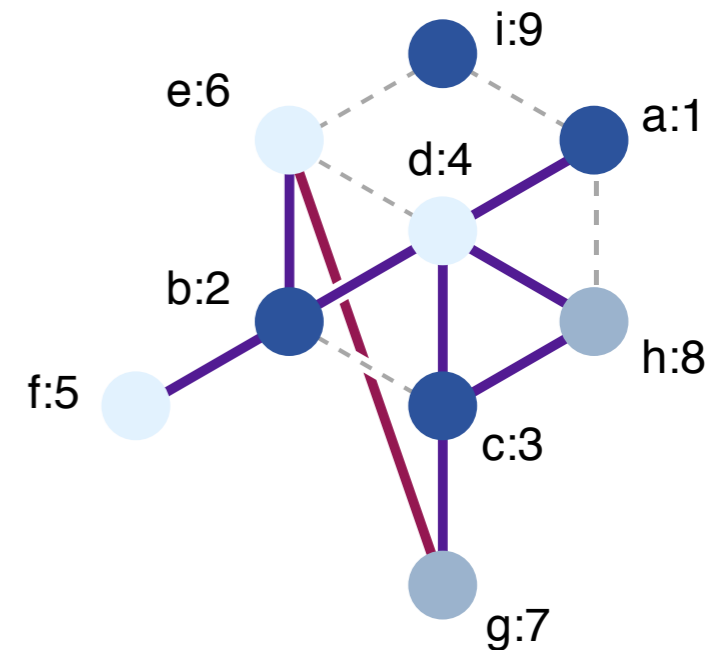
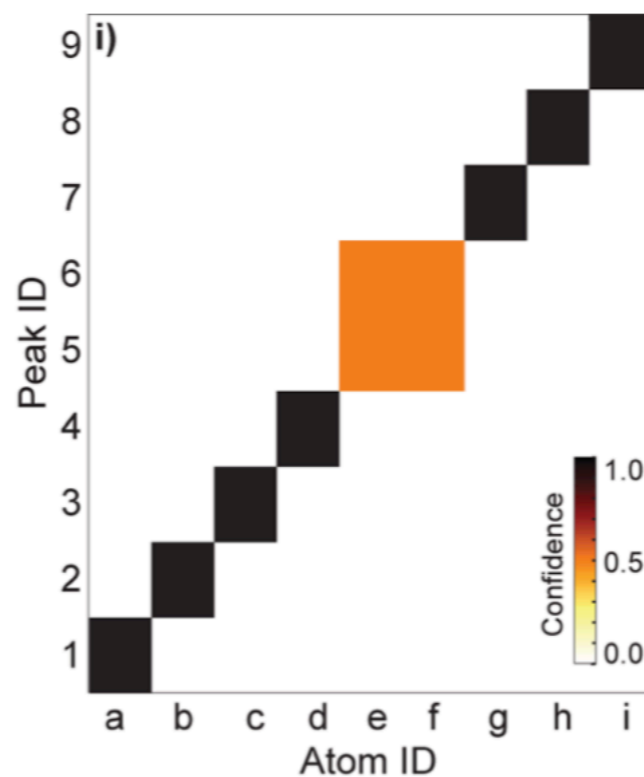
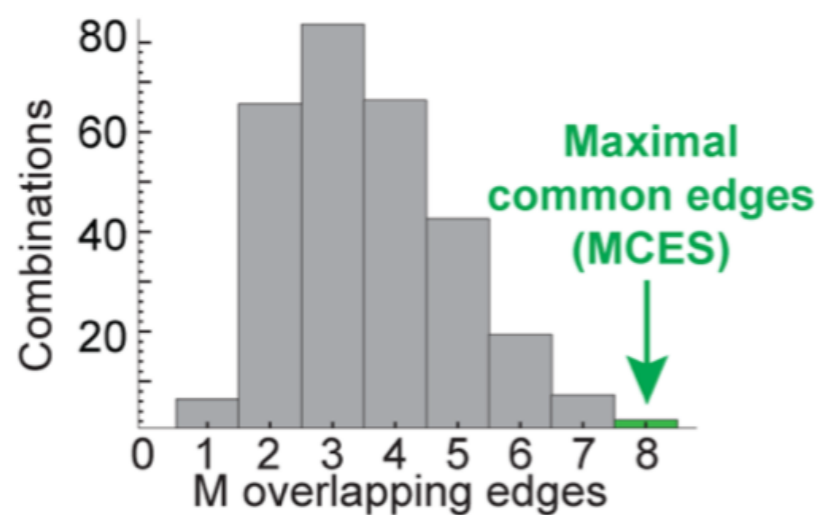
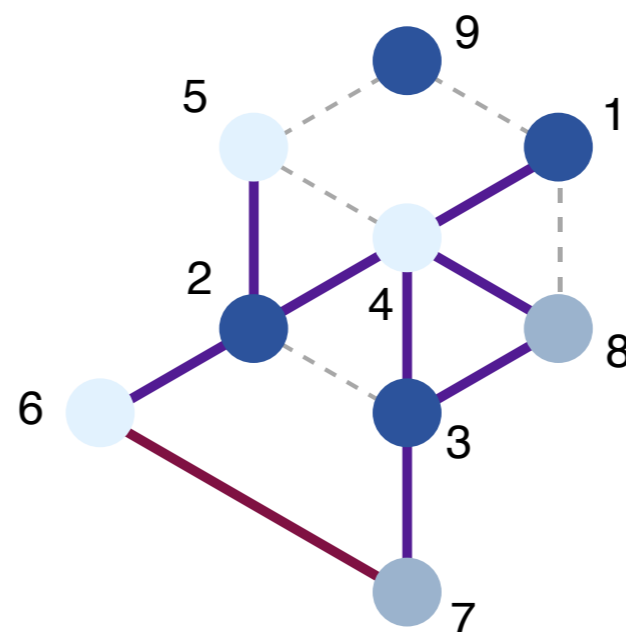
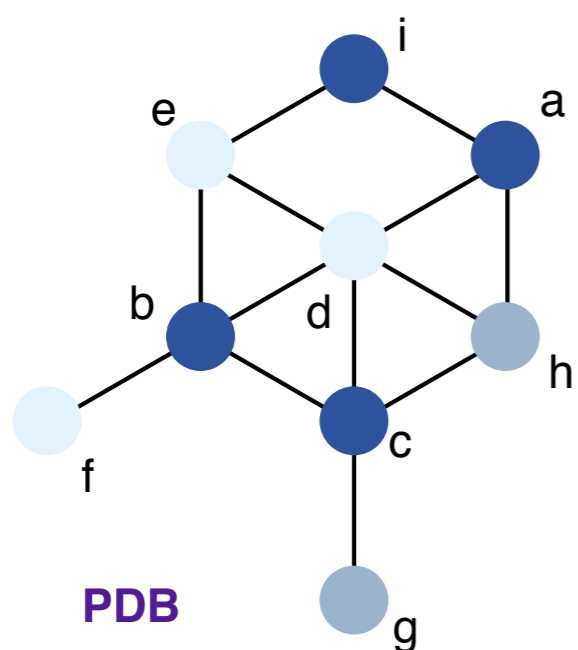
- NMR spectroscopy can probe both structure and dynamics of biomolecules at atomic resolutions
 - Methyl-TROSY can be utilized to study protein complexes up to 1 MDa in molecular weight
- A major challenge to this approach is the need to match resonances in the NMR with specific atoms
 - Generally obtained by either monitoring assignments from smaller in tact proteins or individually changing residues and observing the NMR perturbations

Would it be possible to use graph theory to simplify this process?

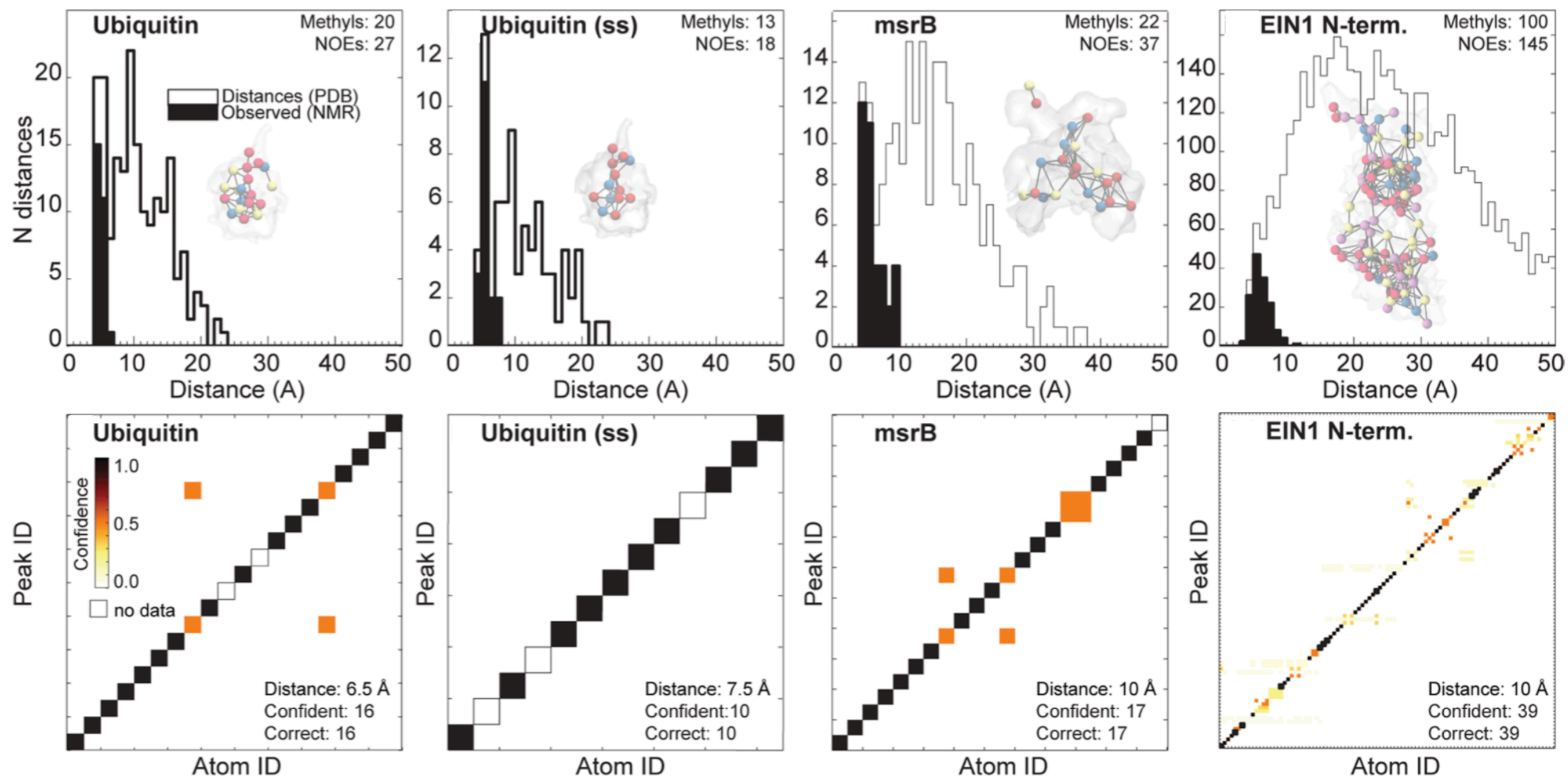


Methyl Assignment by Graph MAtching

NMR assignment of methyl peaks in large molecules via MAGMA



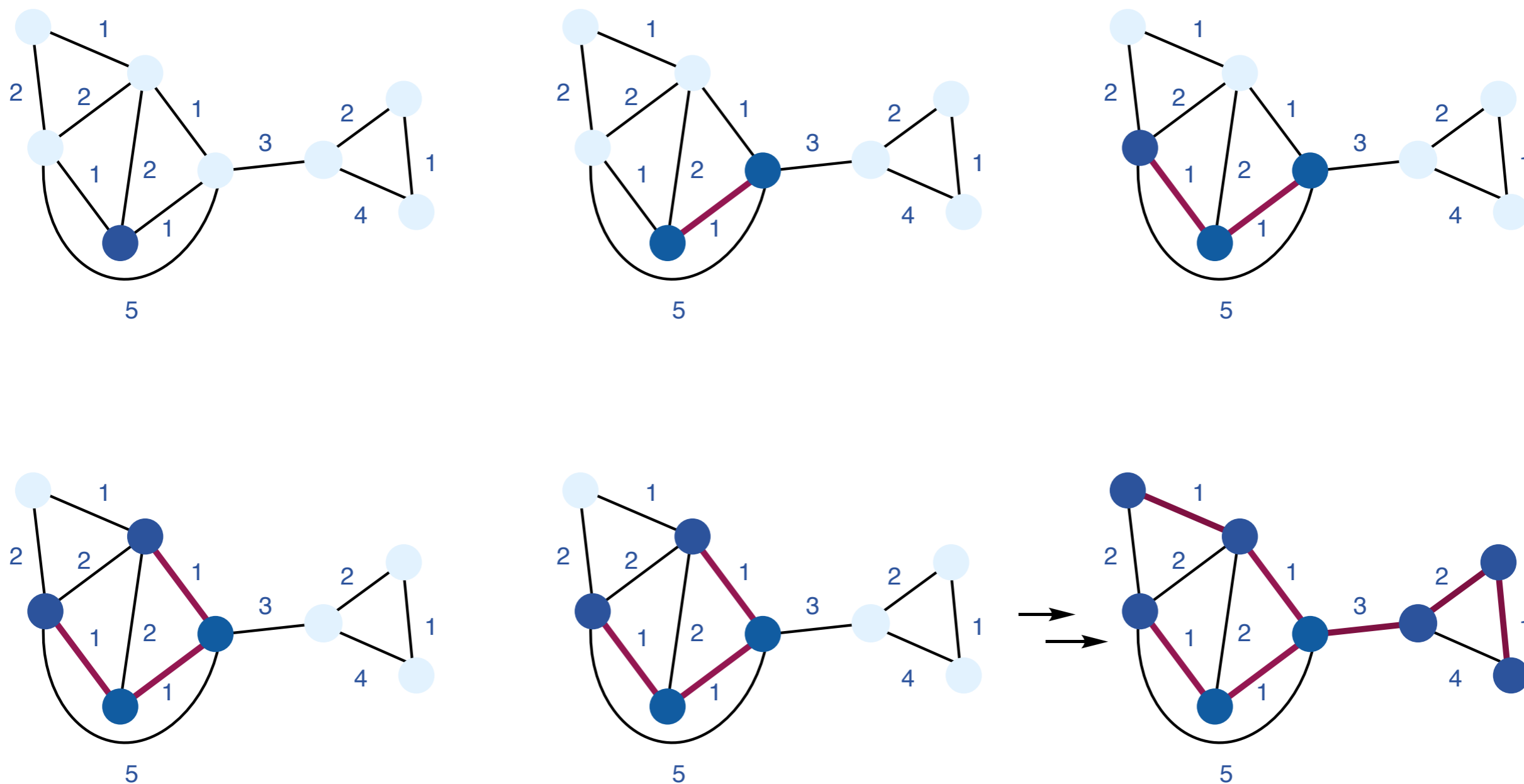
NMR assignment of methyl peaks in large molecules via MAGMA



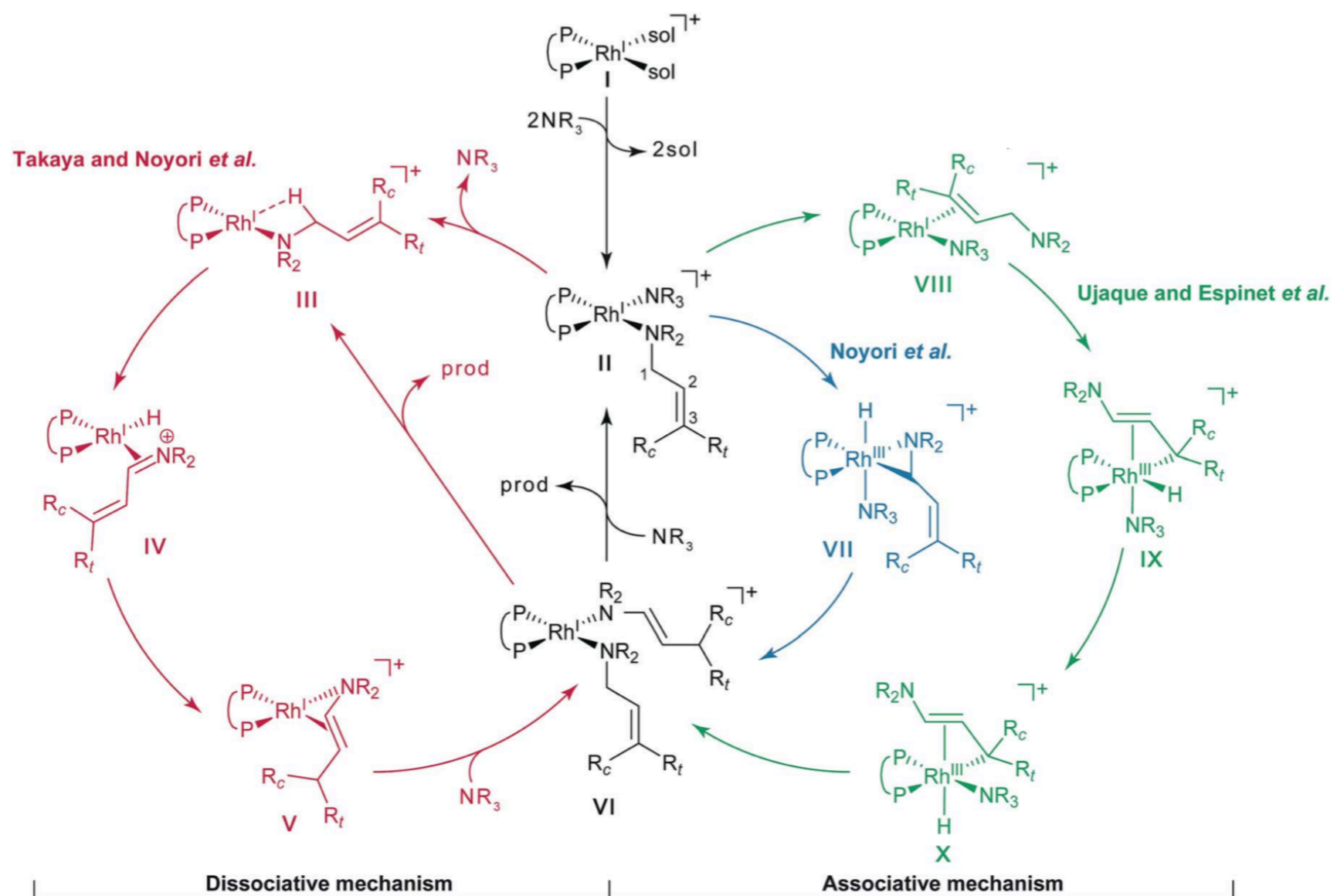
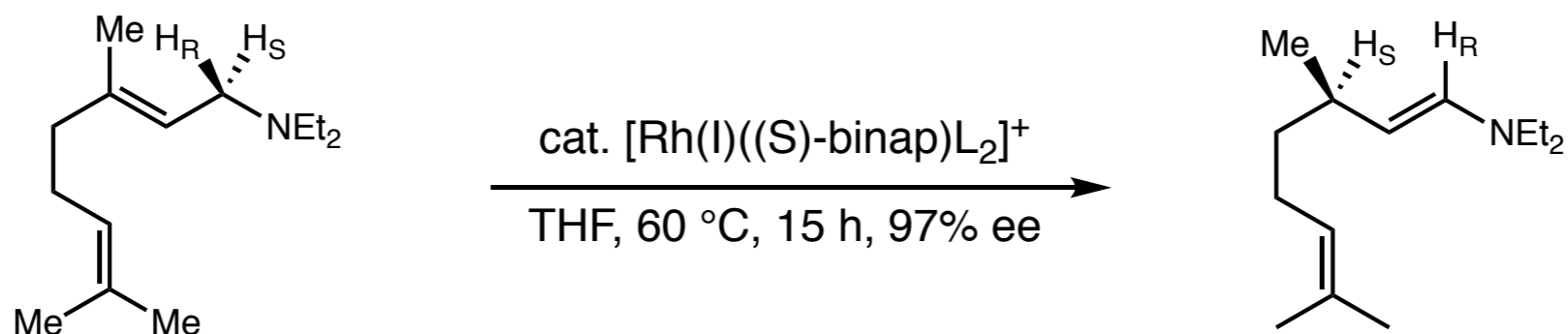
Kinetic Analysis with Prim's algorithm

Minimum spanning tree – a subset of edges that connect a graph together with the minimal possible weight

Prim's algorithm finds minimum spanning by repeatedly adding the cheapest vertex to the spanning tree

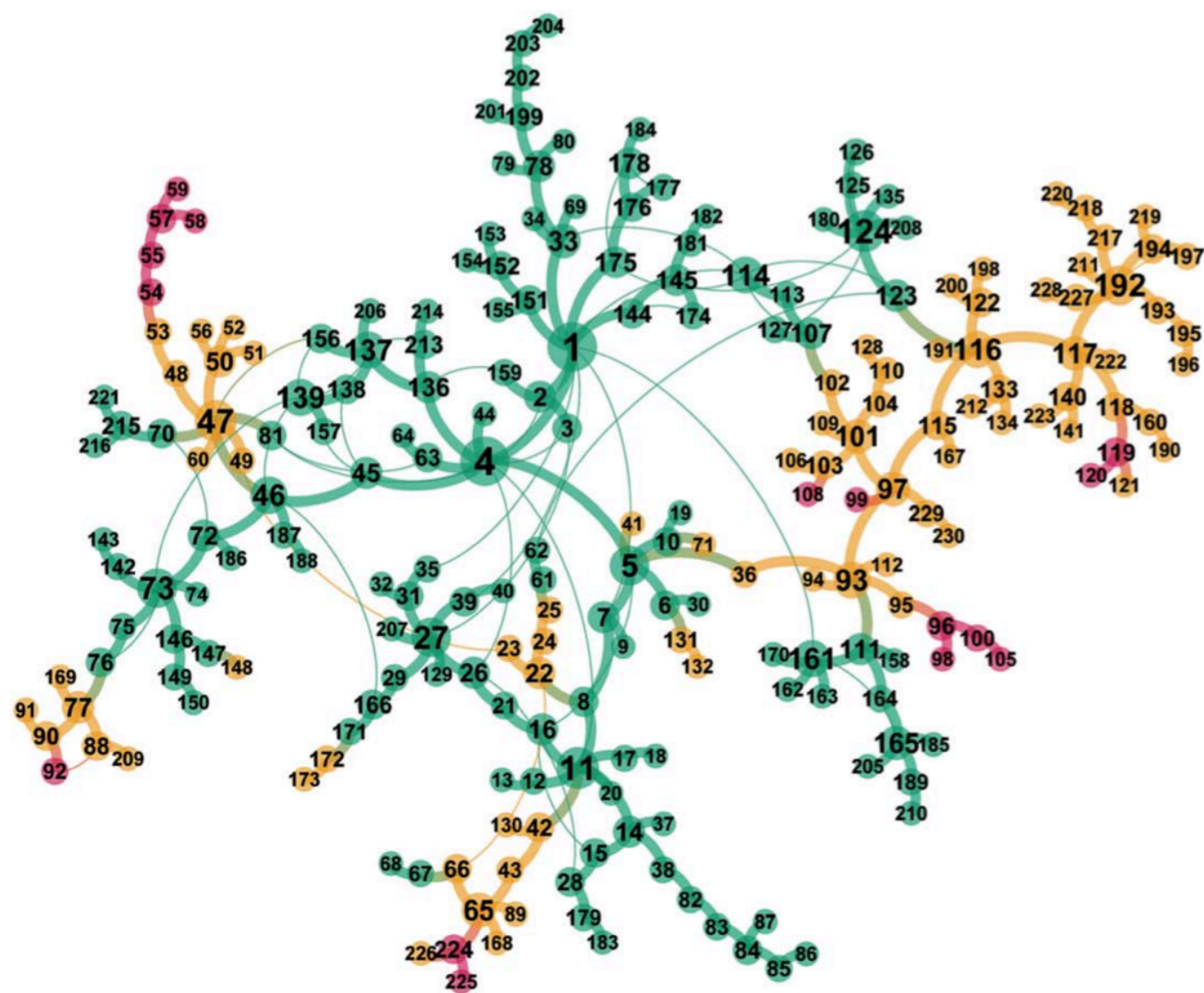


Kinetic Analysis with Prim's algorithm

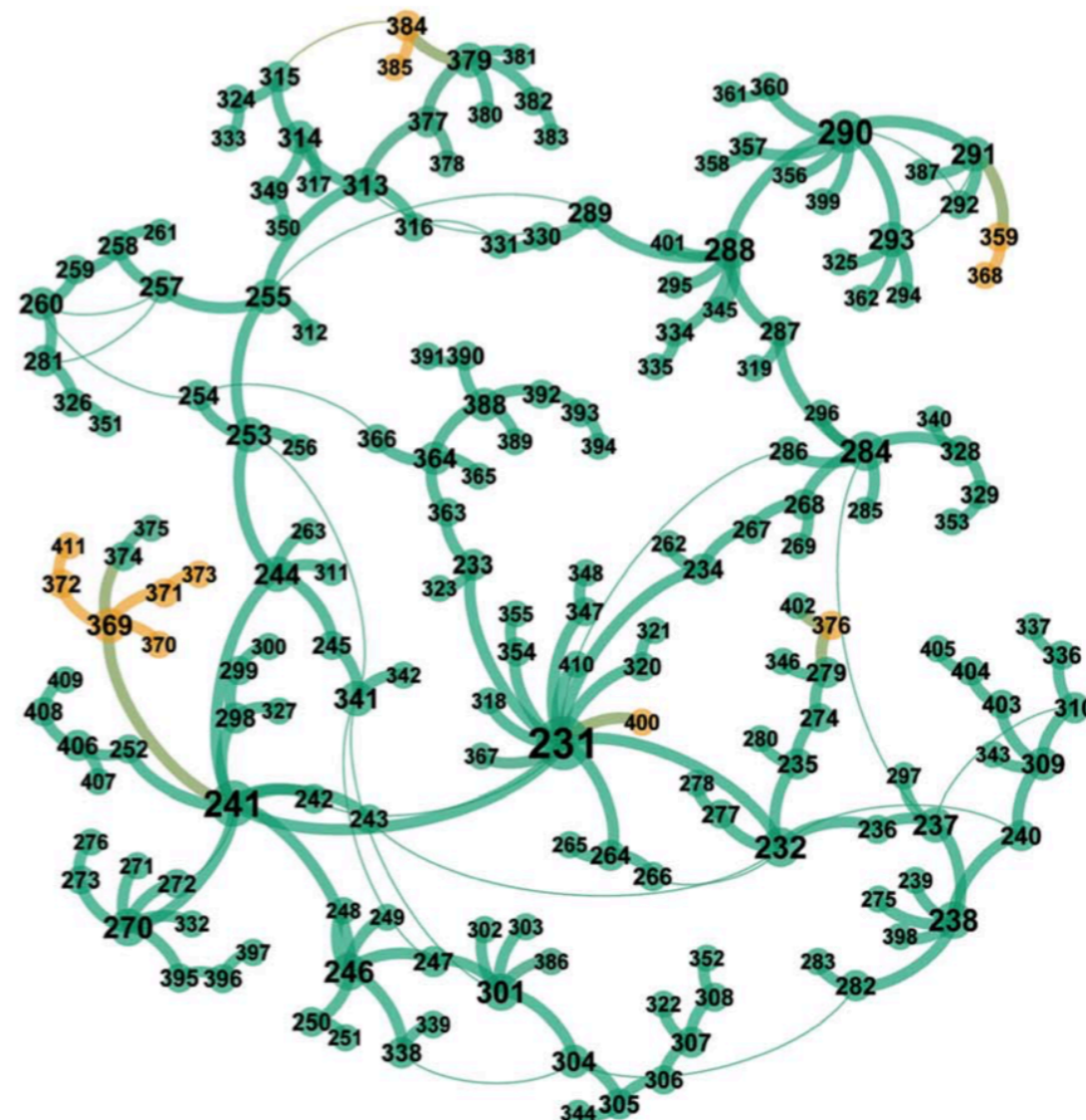


Kinetic analysis with Prim's algorithm

Dissociative



Associative

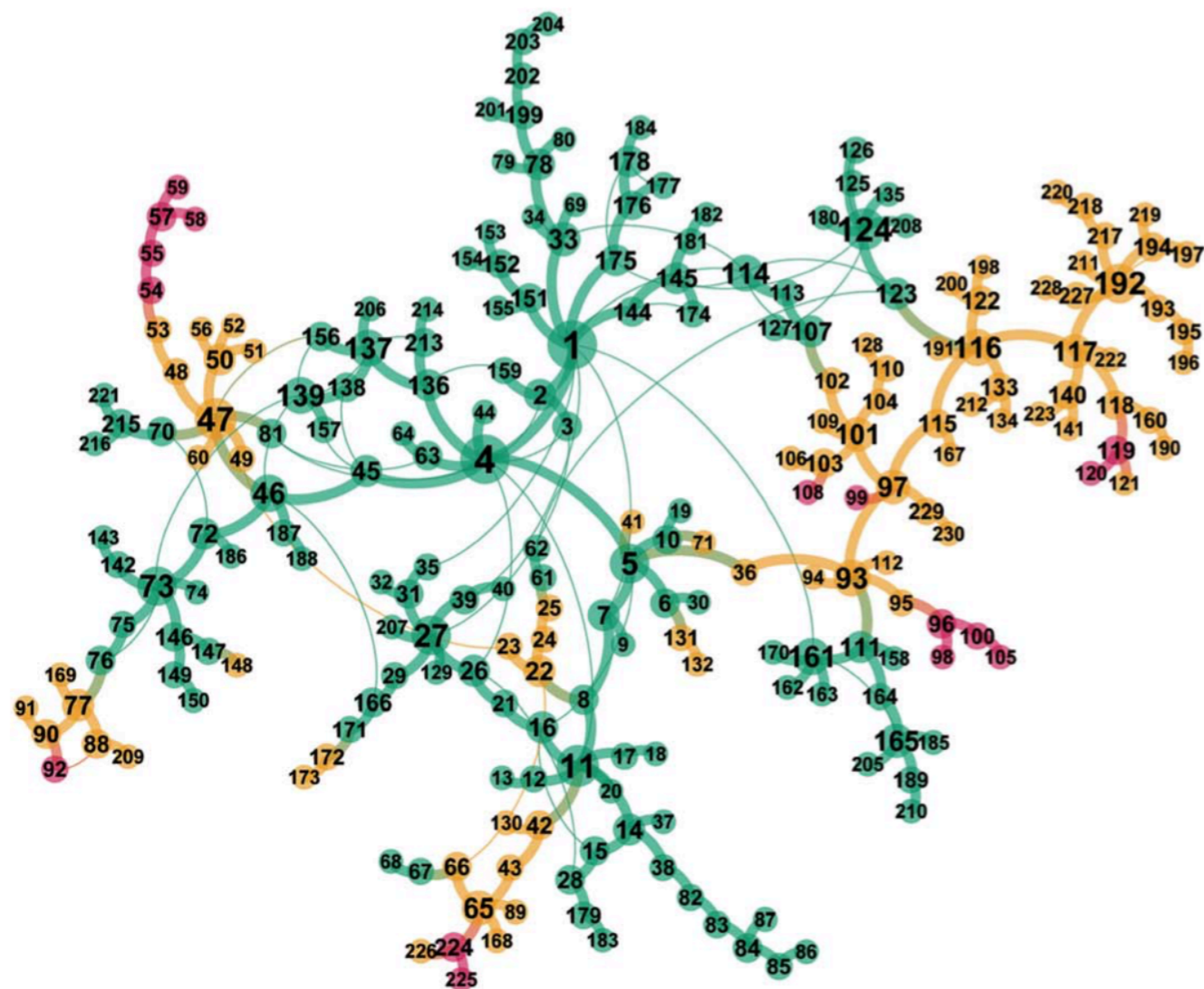


■ Bolded edges are part of the spanning tree

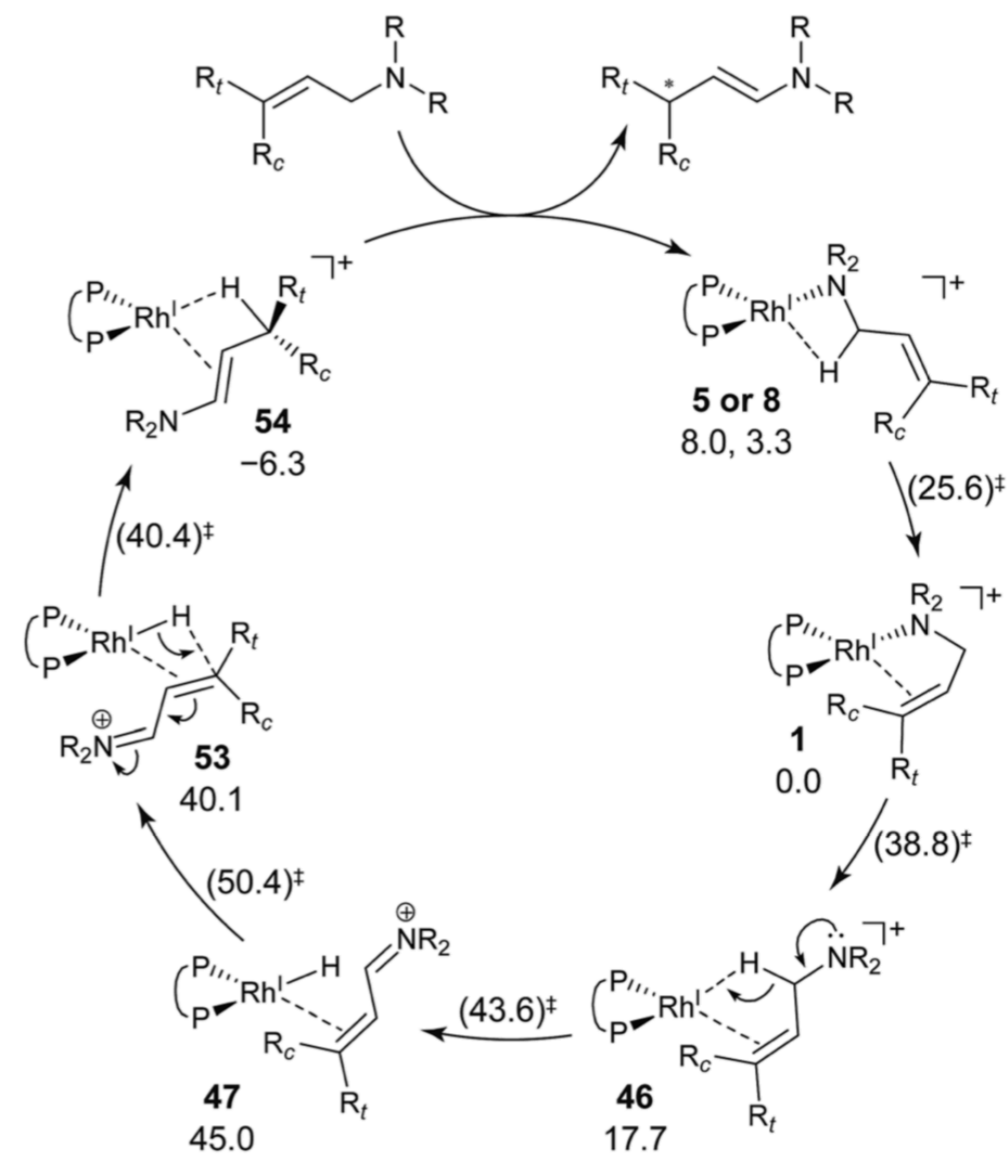
■ Green paths represent earlier in the pathway and red later

Kinetic analysis with Prim's algorithm

Dissociative



Proposed mechanism



■ Bolded edges are part of the spanning tree

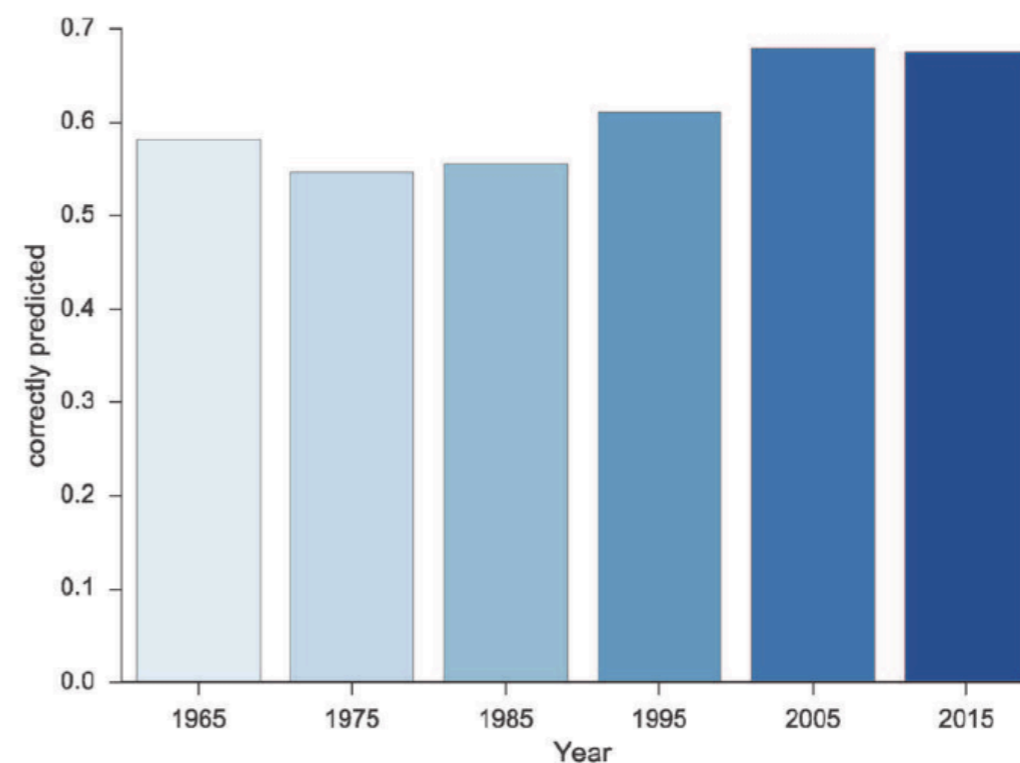
■ Green paths represent earlier in the pathway and red later

Can we use graph theory to predict reactions?

High-throughput computer-based reaction predictions (HTRP) can be used for *de novo* drug design, virtual chemical space exploration, and to predict if retrosynthesis disconnections are feasible

Can we use this to predict reactions?

- Constructed a knowledge graph from 14.4 million reactants and 8.2 million binary reactions
- Vertices represent reactants and reaction conditions with edges connecting reactants to reaction conditions and other reactants
- Predict reactions, products and reaction conditions
- Correctly predicted the right product with 67.5% accuracy on 180,000 reactions that were withheld from the data set
- Able to predict the products and reaction conditions of 'novel' reactions with decent efficiency

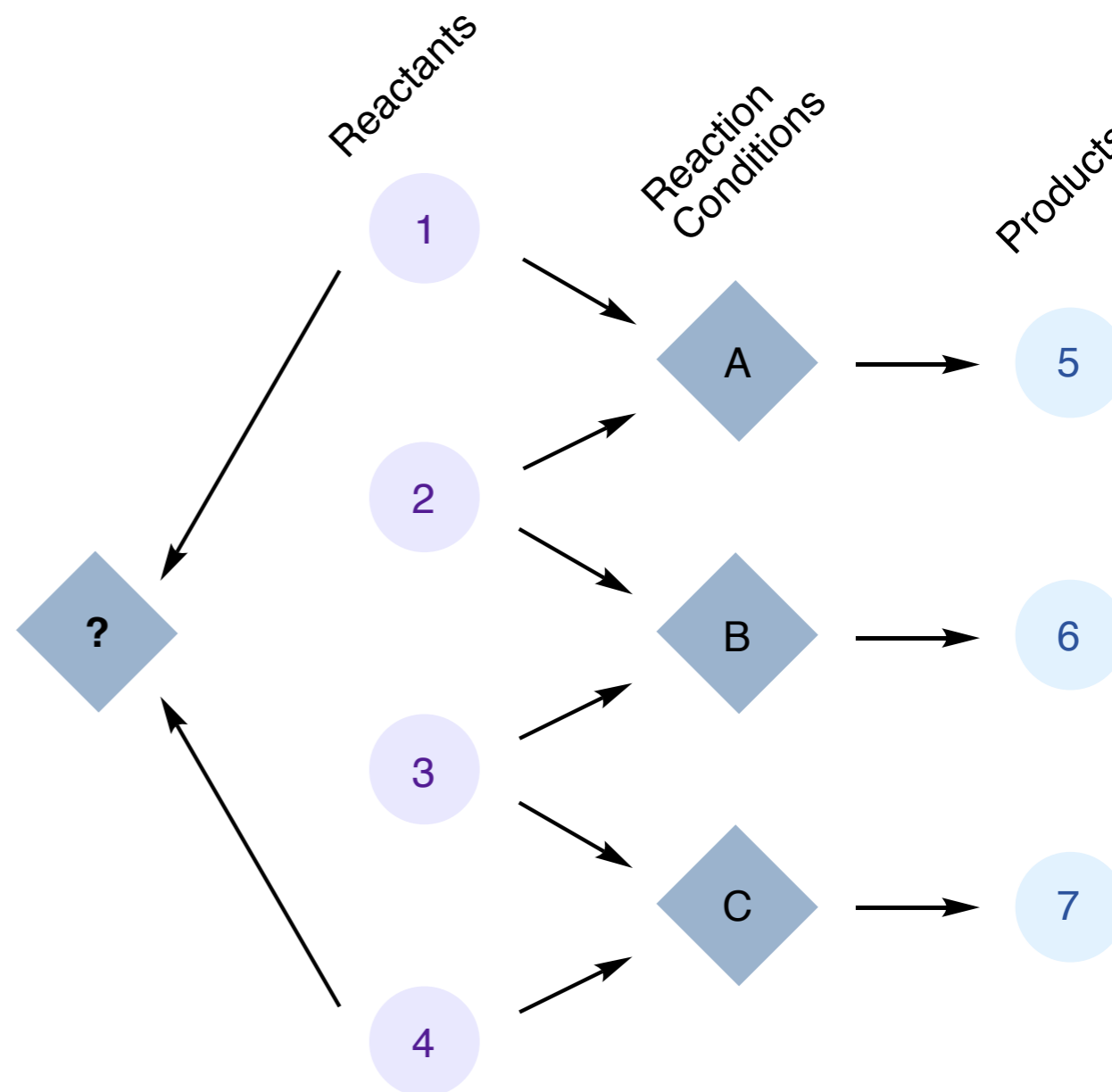


Can we use graph theory to predict reactions?

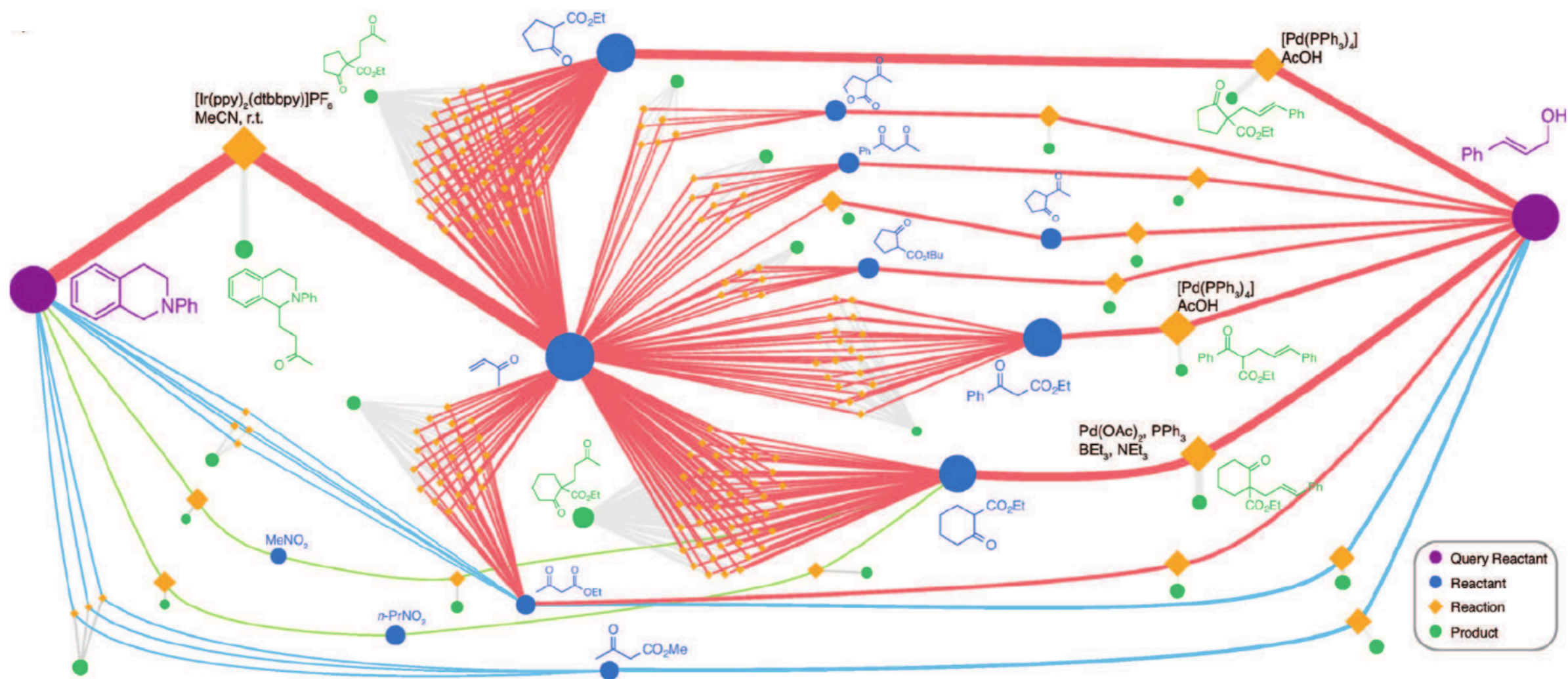
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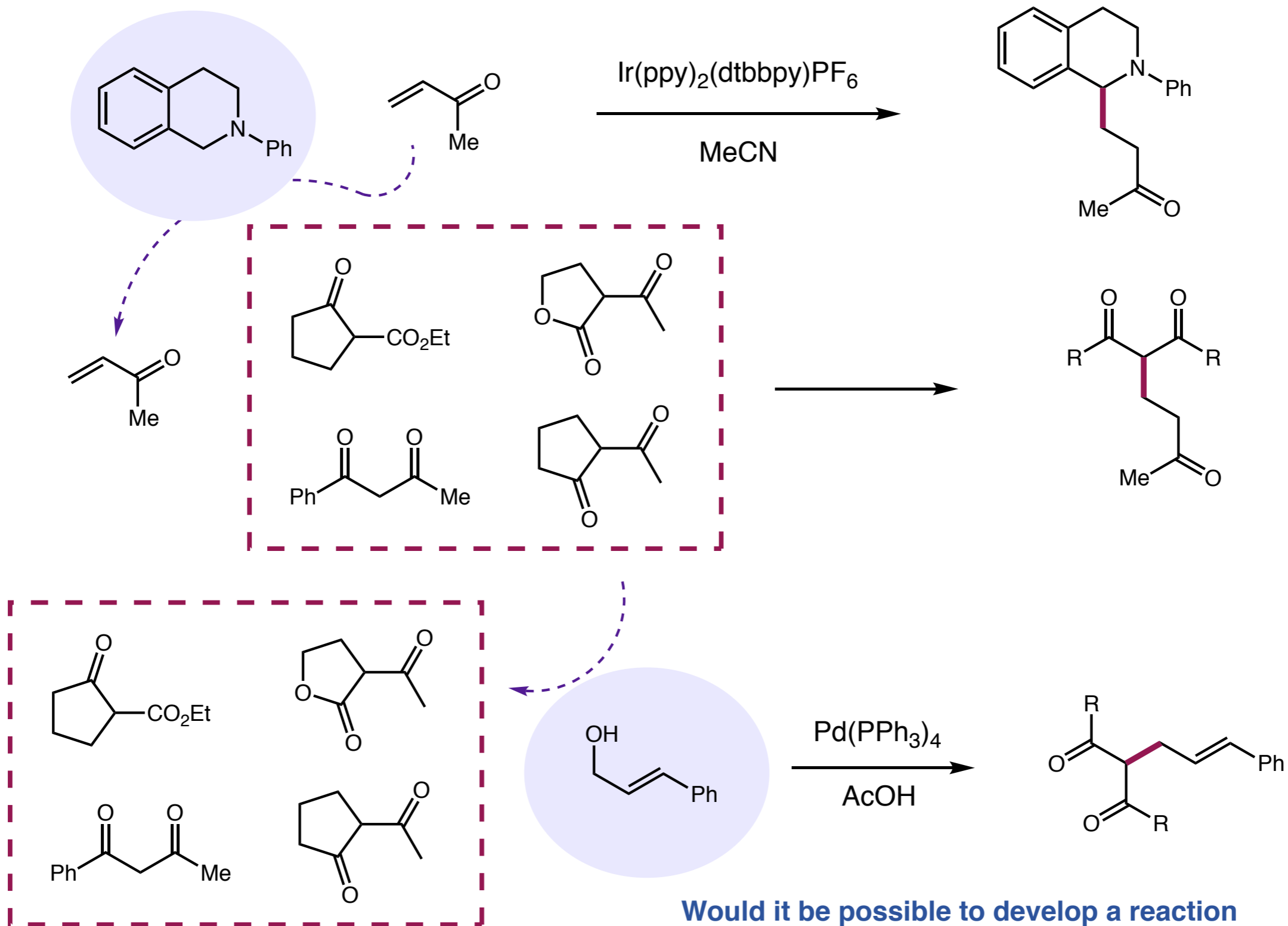
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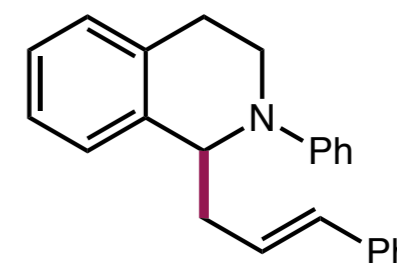
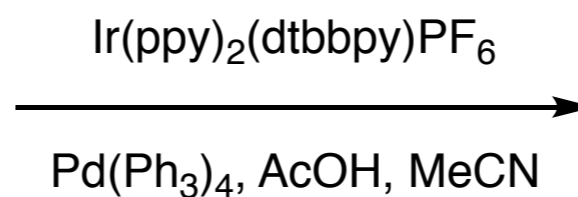
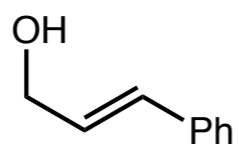
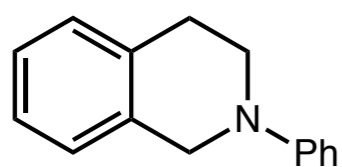
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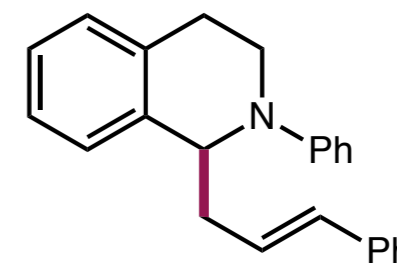
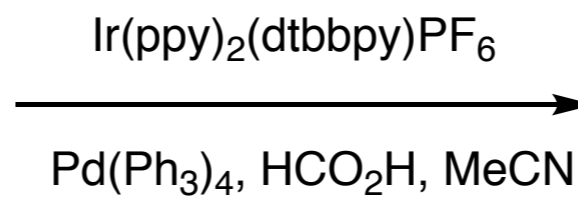
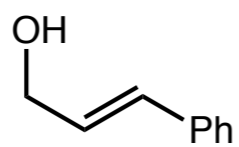
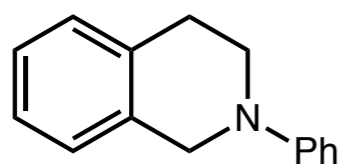
Would it be possible to develop a reaction between these 2 components?

Can we use graph theory to predict reactions?

Predicted



Discovered



Xuan, J.; Zeng, T.-T.; Feng, Z.-J.; Deng, Q.-H.; Chen, J.-R.; Lu, L.-Q.; Xiao, J. X.; Alper, H. *Angew. Chem. Int. Ed.* **2015**, *54*, 1625

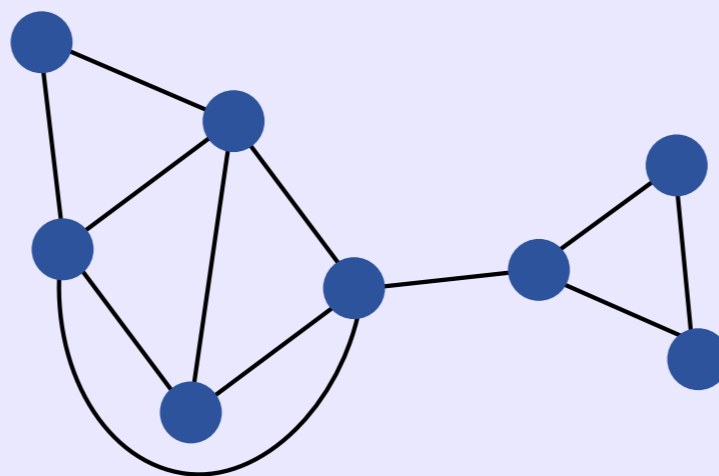
Applying graph theory to chemistry

Molecular Structures

- vertices represent atoms
- edges represent bonds
- weighted edges can represent double bonds or C-X bonds

Polymers

- vertices represent building blocks
- edges represent connections



Graph Theory

Kinetics

- vertices represent intermediates
- edges represent pathways
- frequently digraphs

And many more...

- aromaticity
- depicting orbitals and electrons
- NMR analysis
- crystals and clusters
- mapping reaction space

Questions

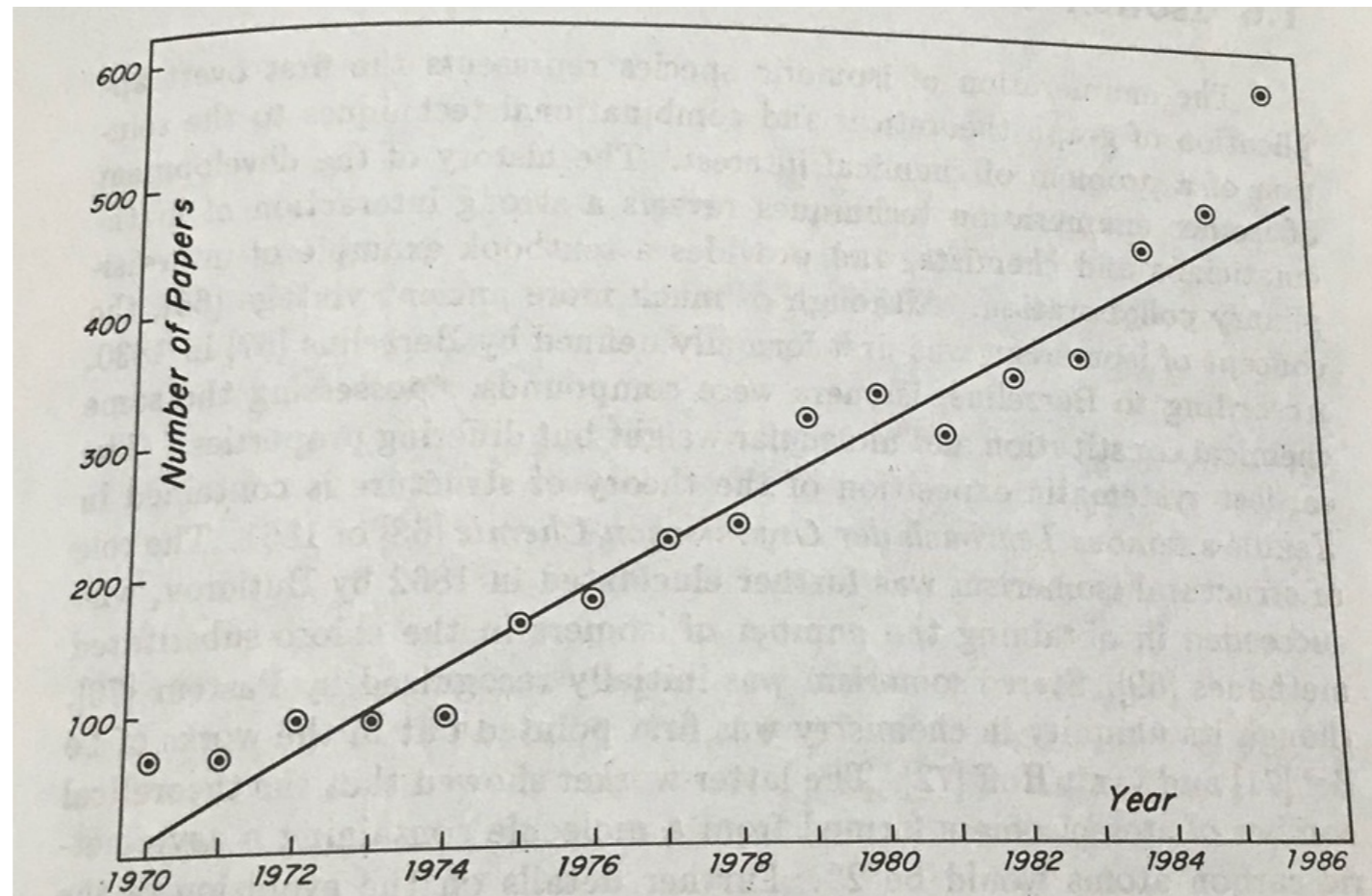


Figure 13. A plot showing the annual number of papers published in the area of chemical graph theory for the years 1970-1986. Note the annual growth rate of around 25% for this period.