

GRAPH MODIFICATION PROBLEMS

A Modern Perspective



Setting the stage: Definitions and Preliminary Observations



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Brief excursions into specific examples



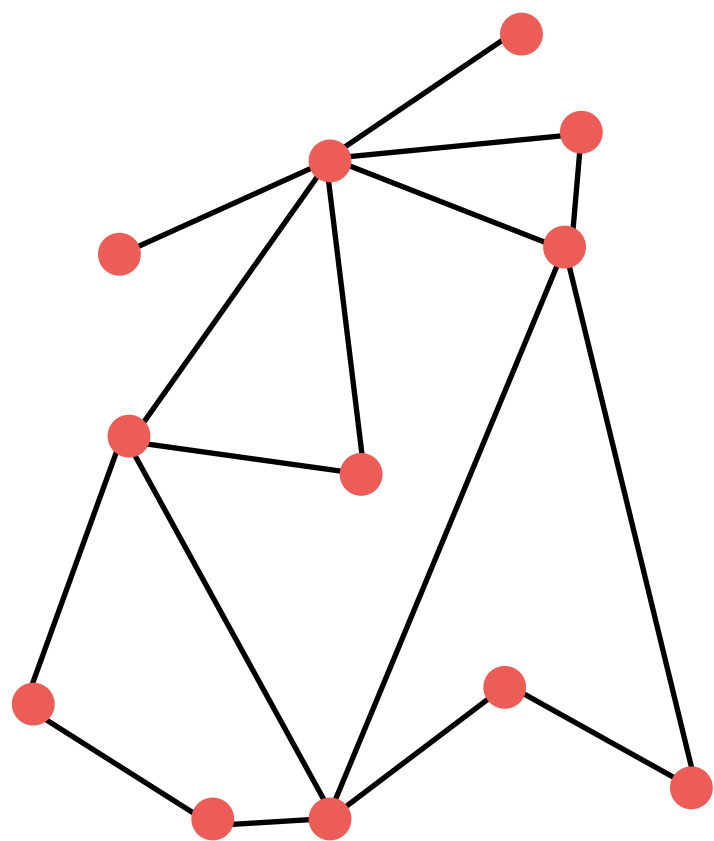
Setting the stage: Definitions and Preliminary Observations

Brief excursions into specific examples

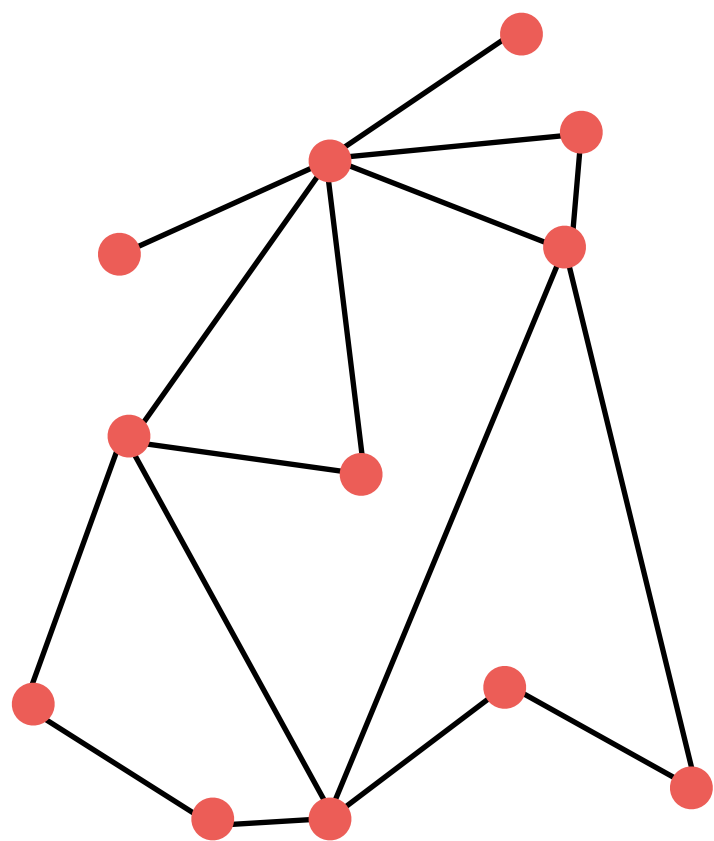
Current Trends & Future Directions



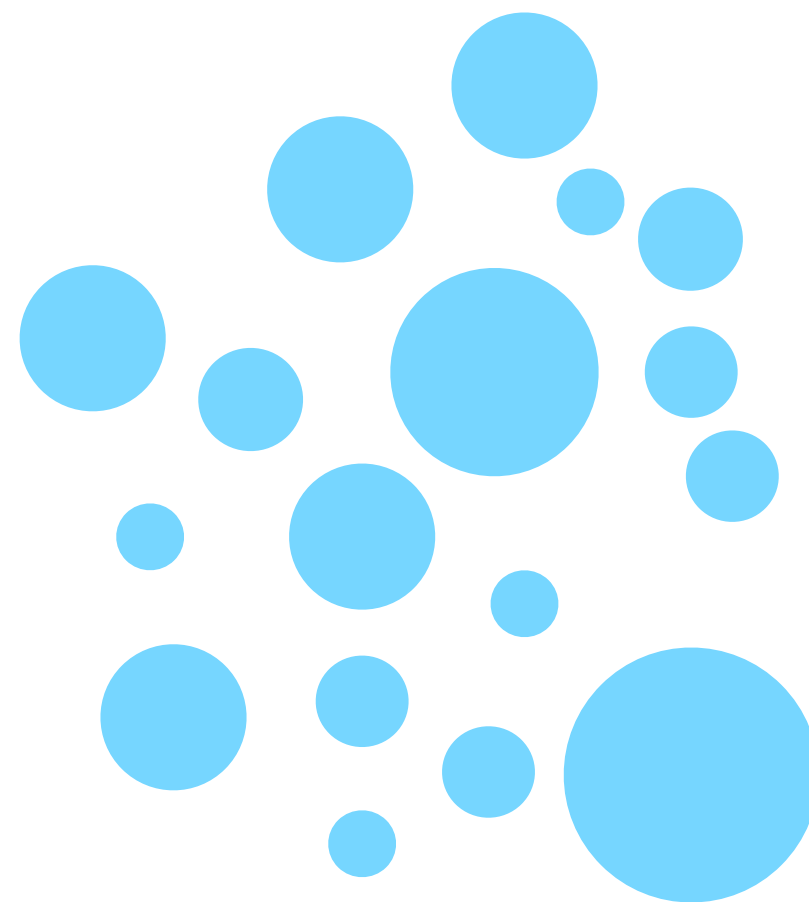
Ingredients of a typical Graph Modification Problem



Input Graph, G

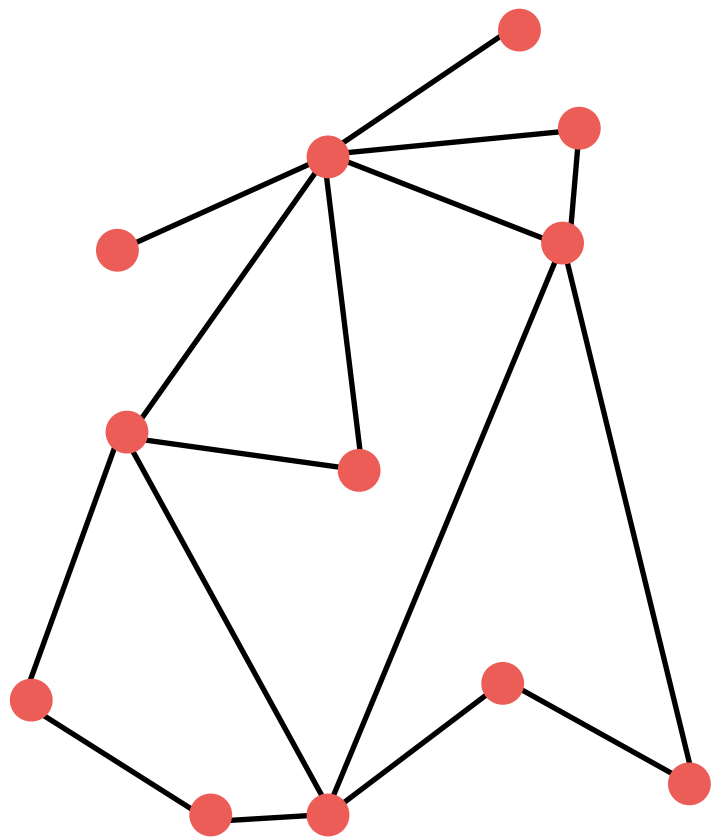


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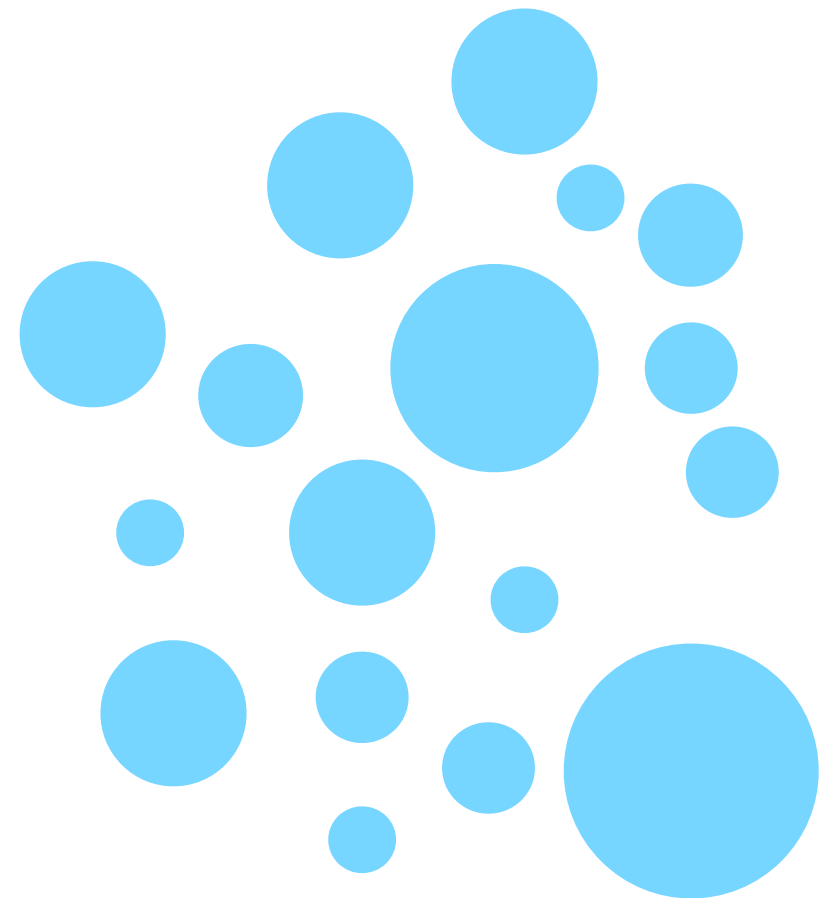


Graph Class or “property”, Π

Goal: Transform G so that it belongs to Π with "minimum damages".

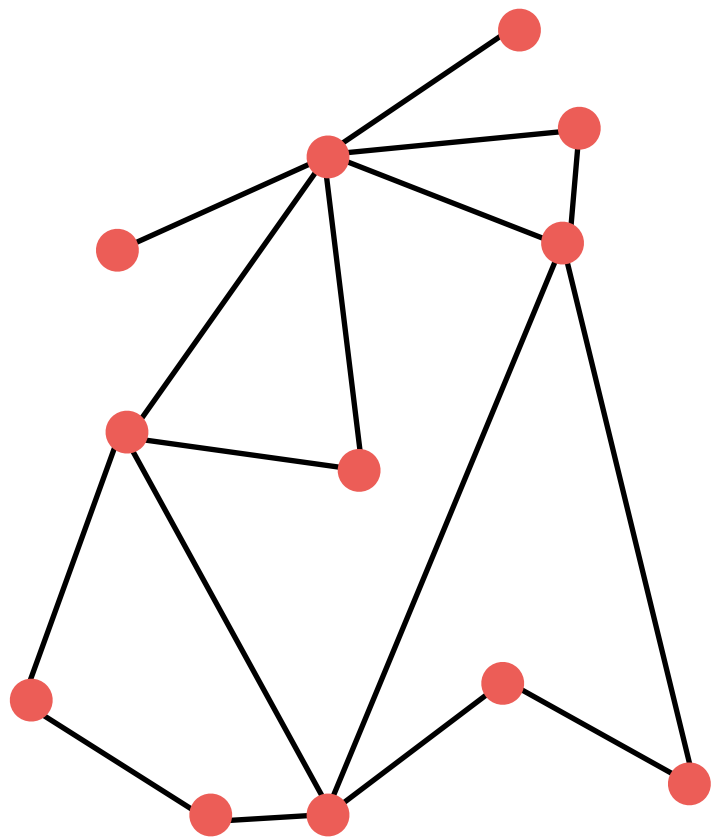


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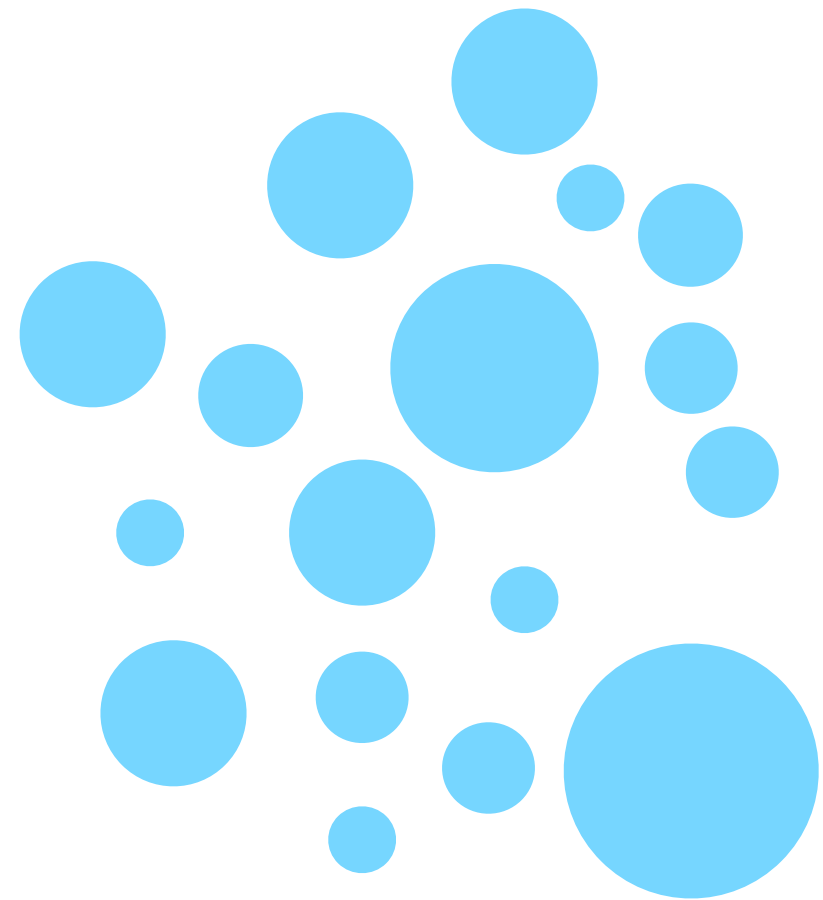


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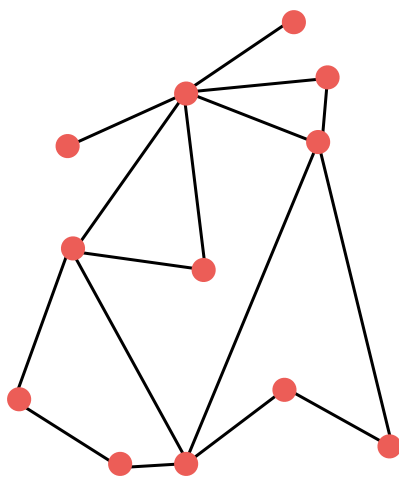
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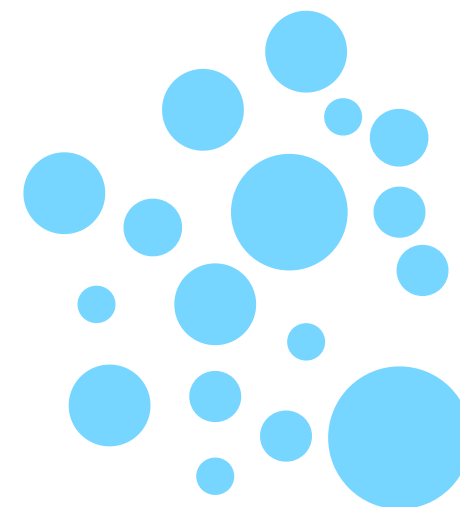
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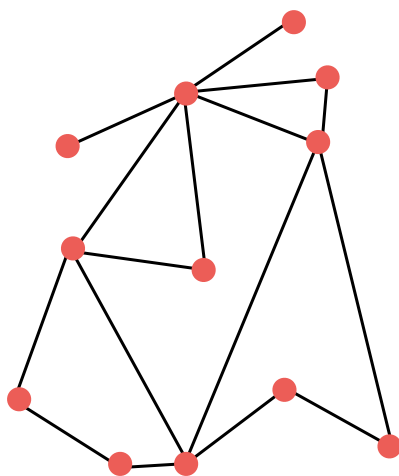
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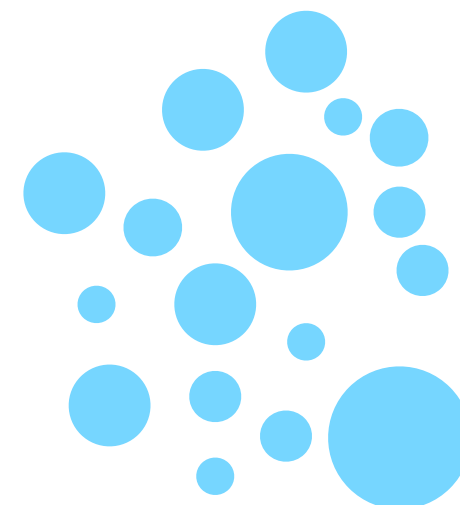
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vertex deletions

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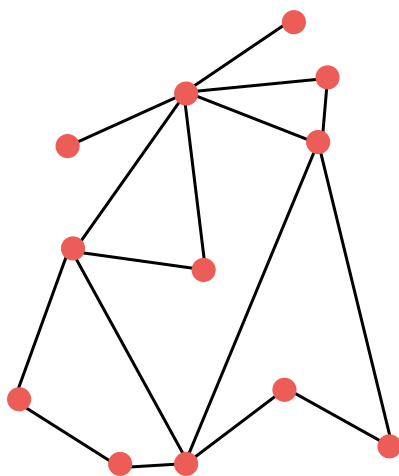
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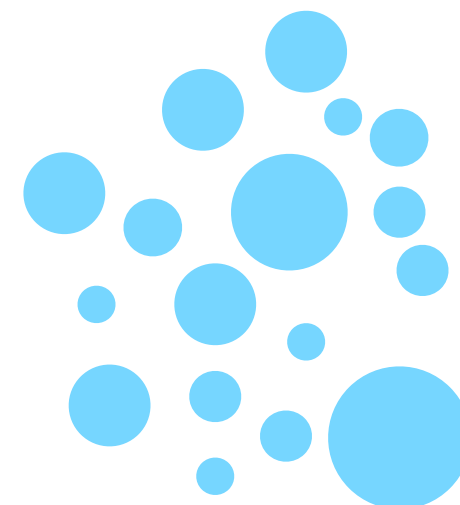
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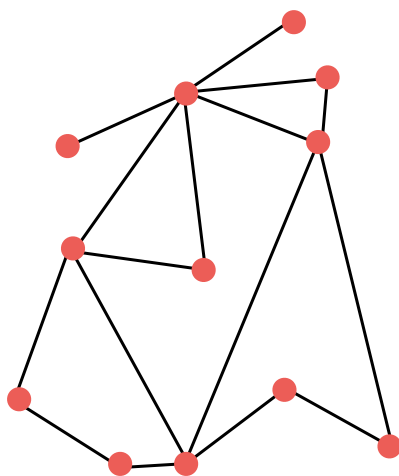
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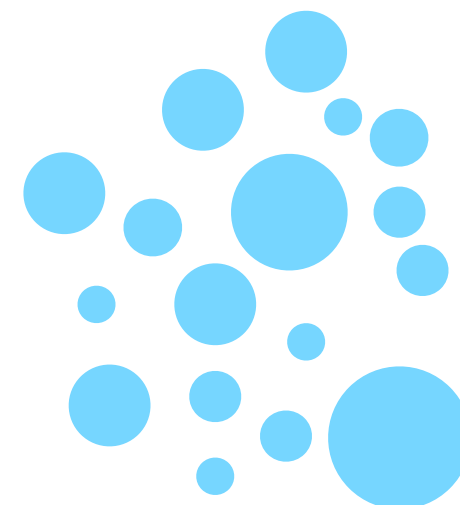
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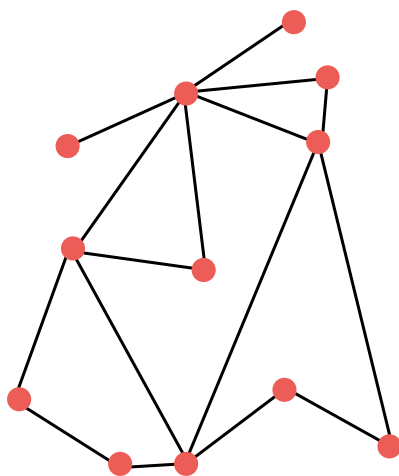
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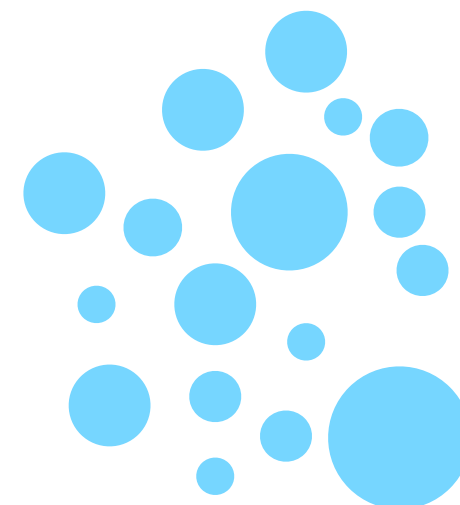
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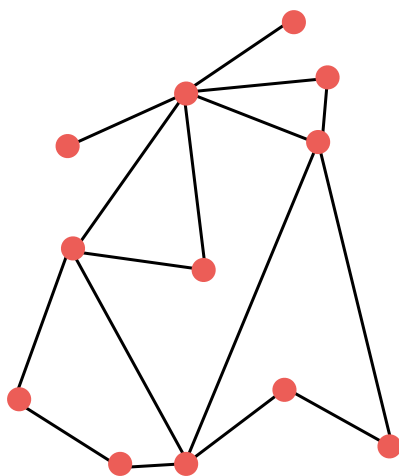
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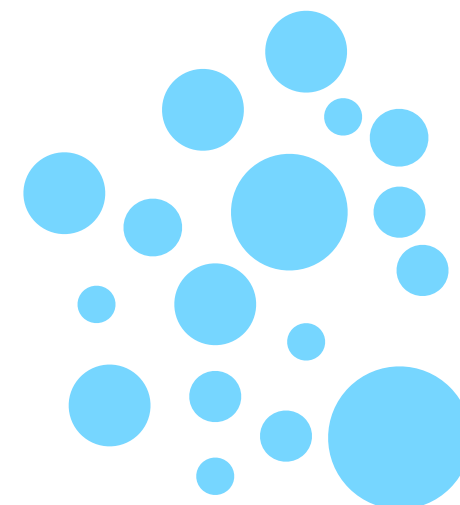
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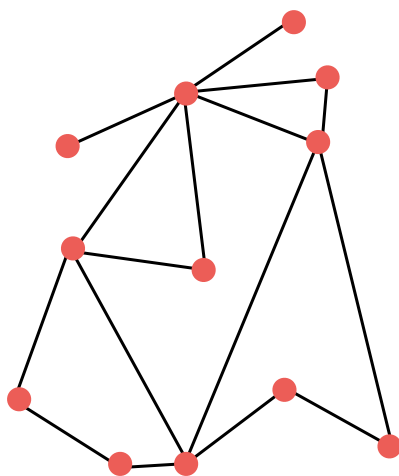
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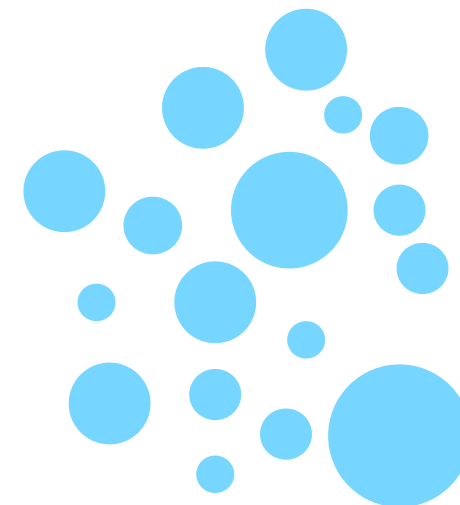
edge editing

VERTEX COVER

Input Graph, G



Edgeless Graphs



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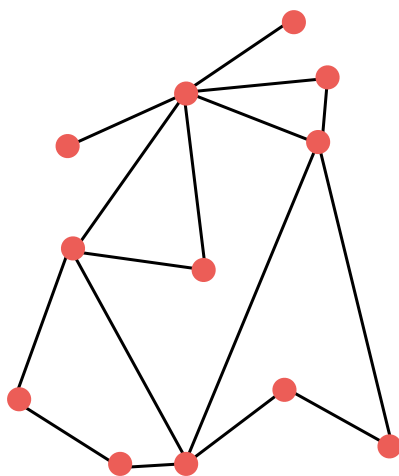
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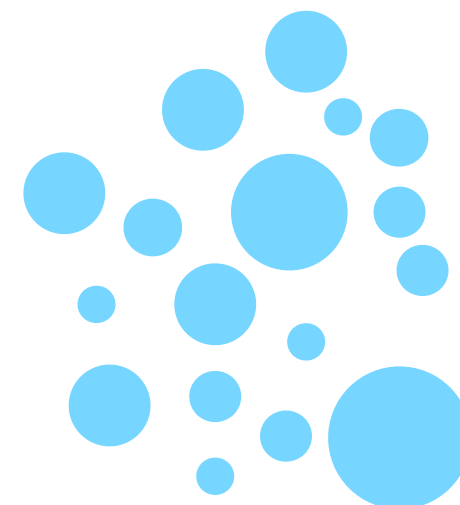
edge editing

FEEDBACK VERTEX SET

Input Graph, G



Acyclic Graphs



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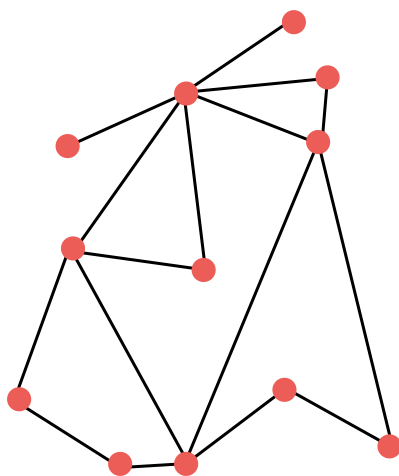
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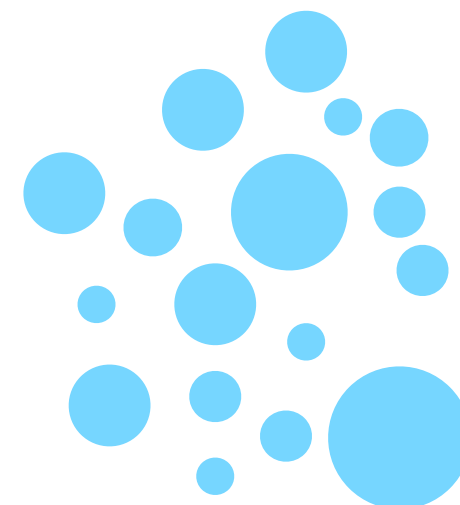
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MINIMUM FILL-IN

Input Graph, G



Chordal Graphs



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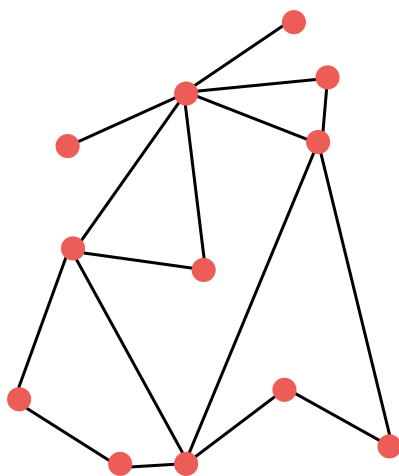
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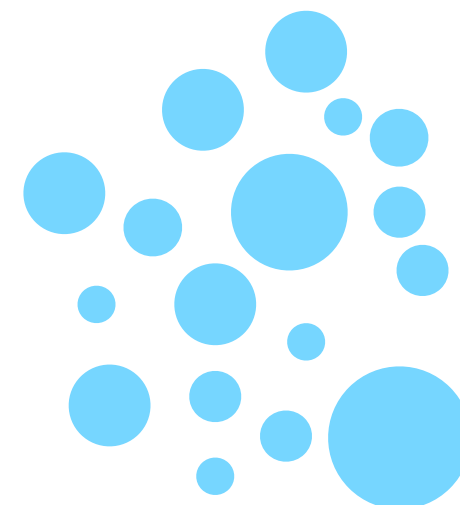
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CLUSTER EDITING

Input Graph, G



Cluster Graphs



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Minimum Π -Completion

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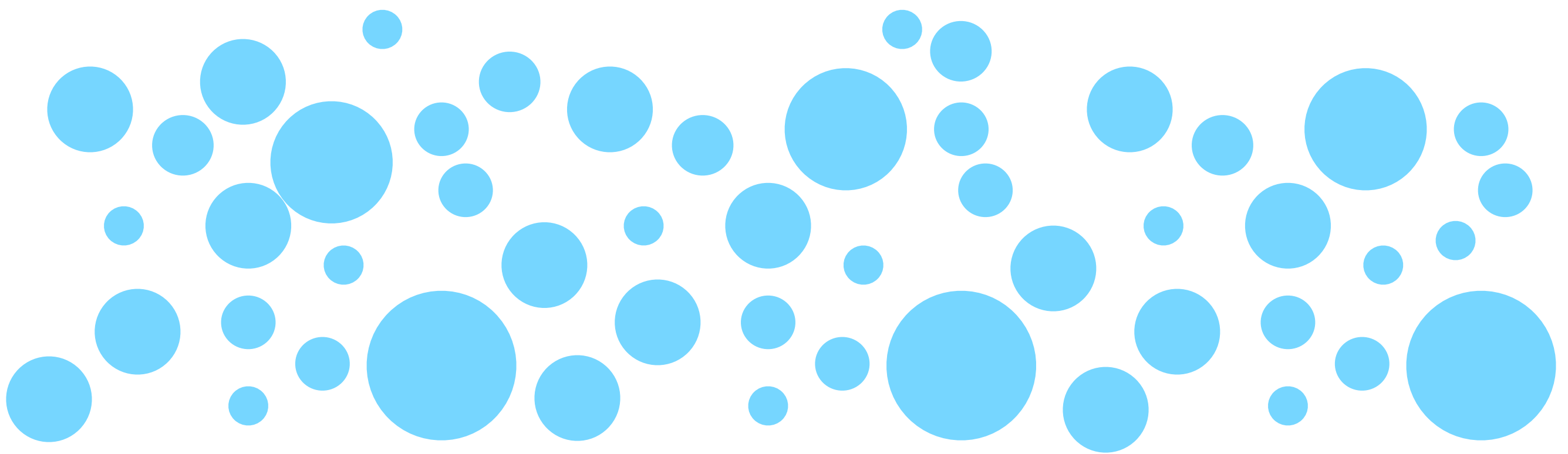
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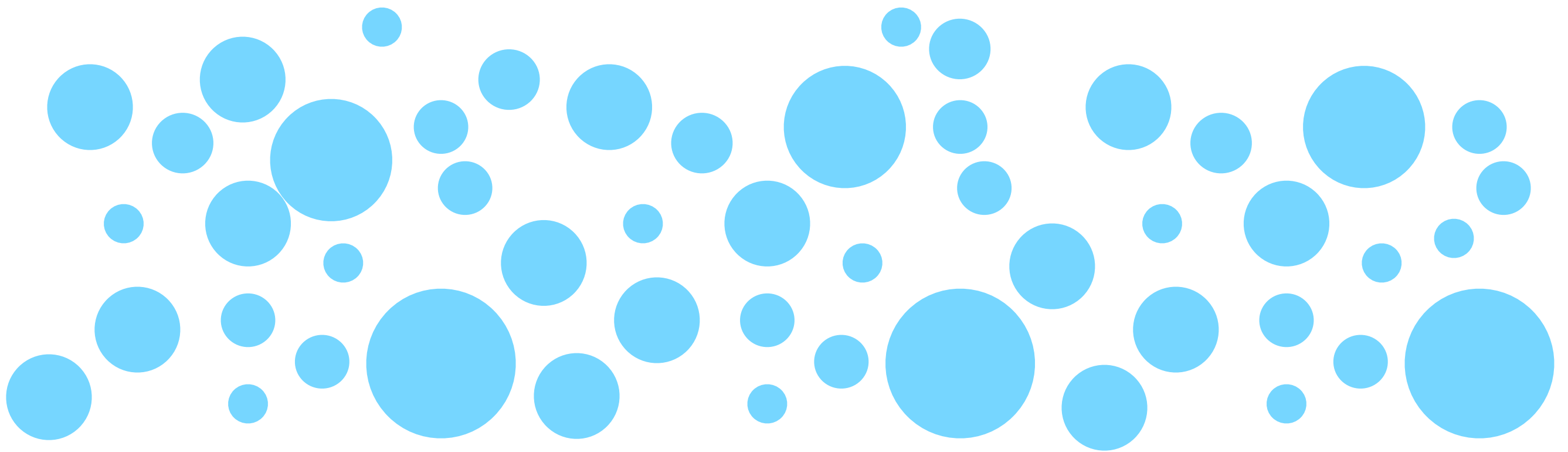
Modification with Restrictions, eg, the Sandwich problem

Restricted Classes of Input



Graph Class or “property”, Π

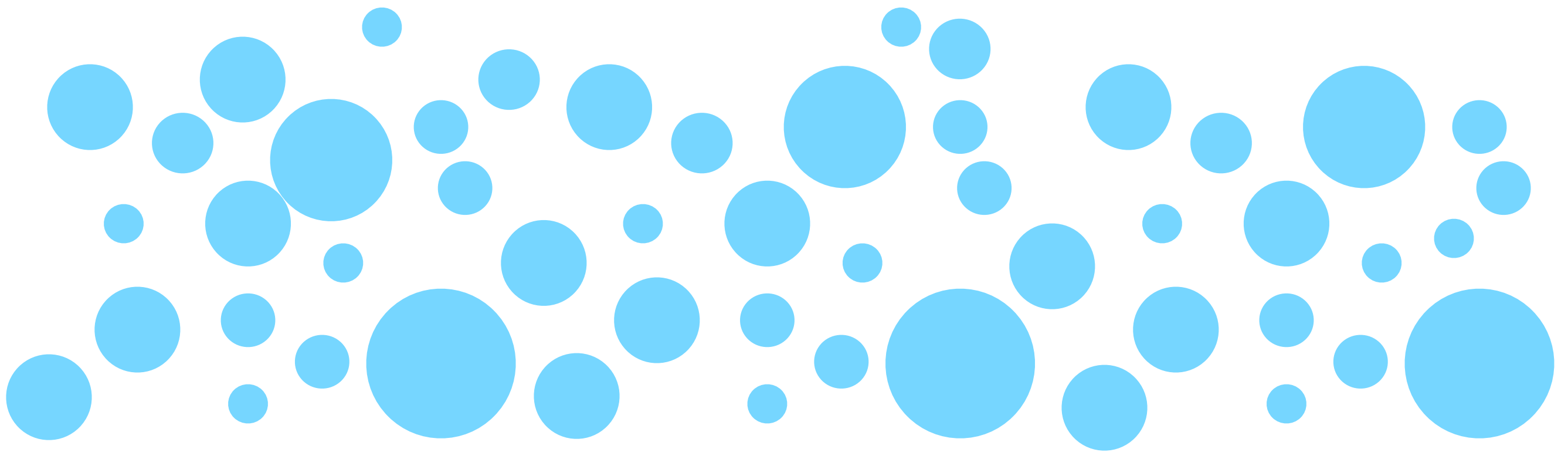
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Monotone If G belongs to Π , then all **subgraphs** of G also belong to Π .

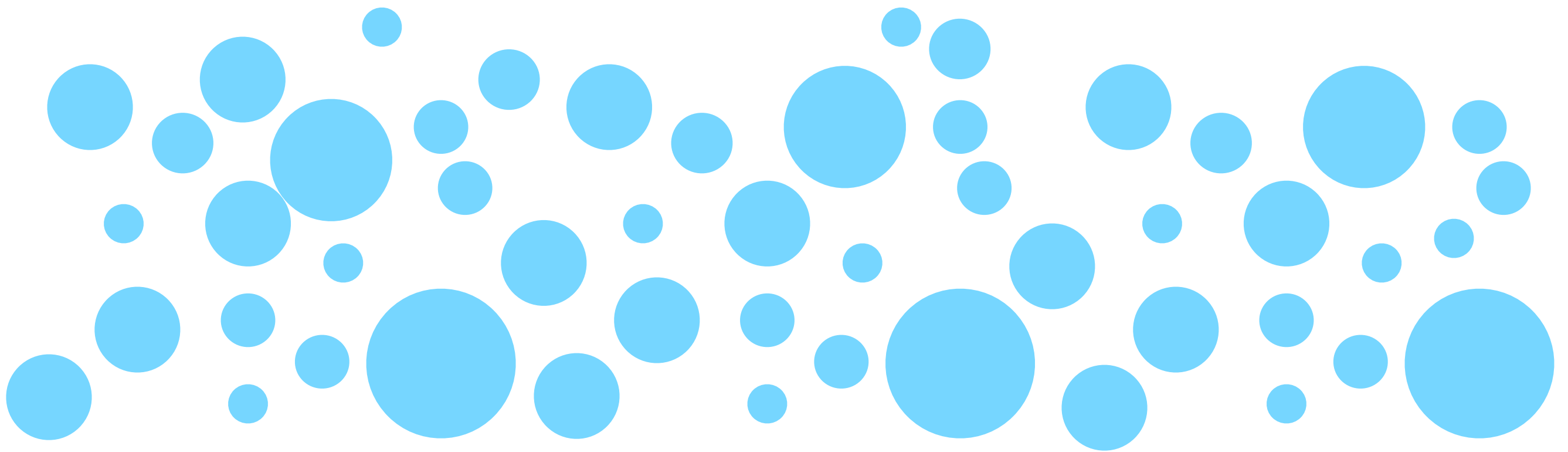


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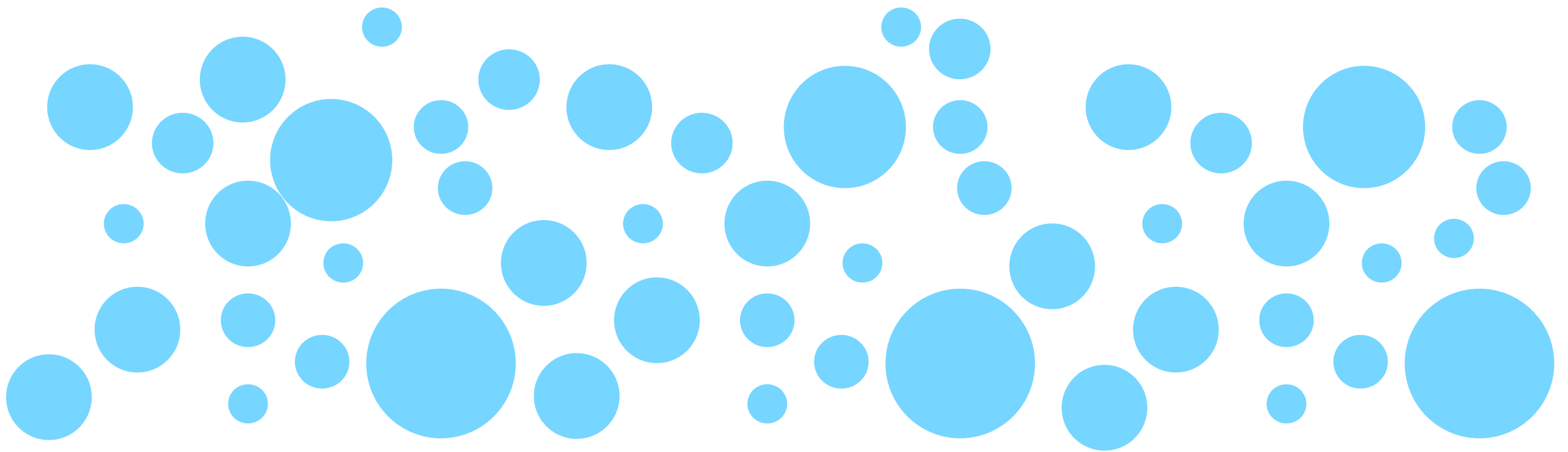
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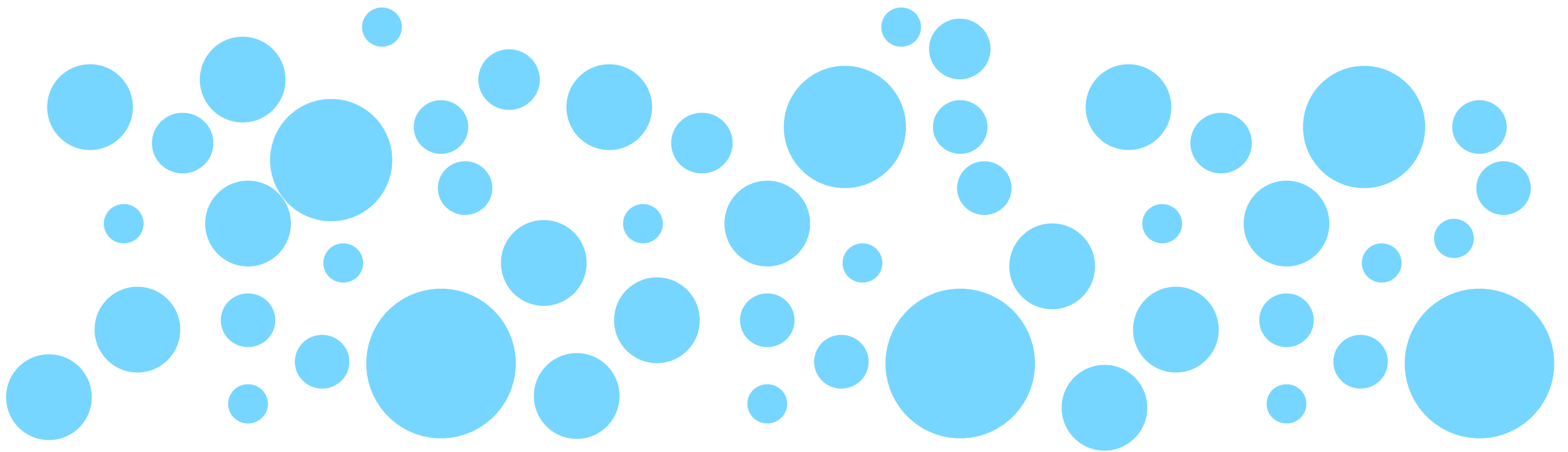
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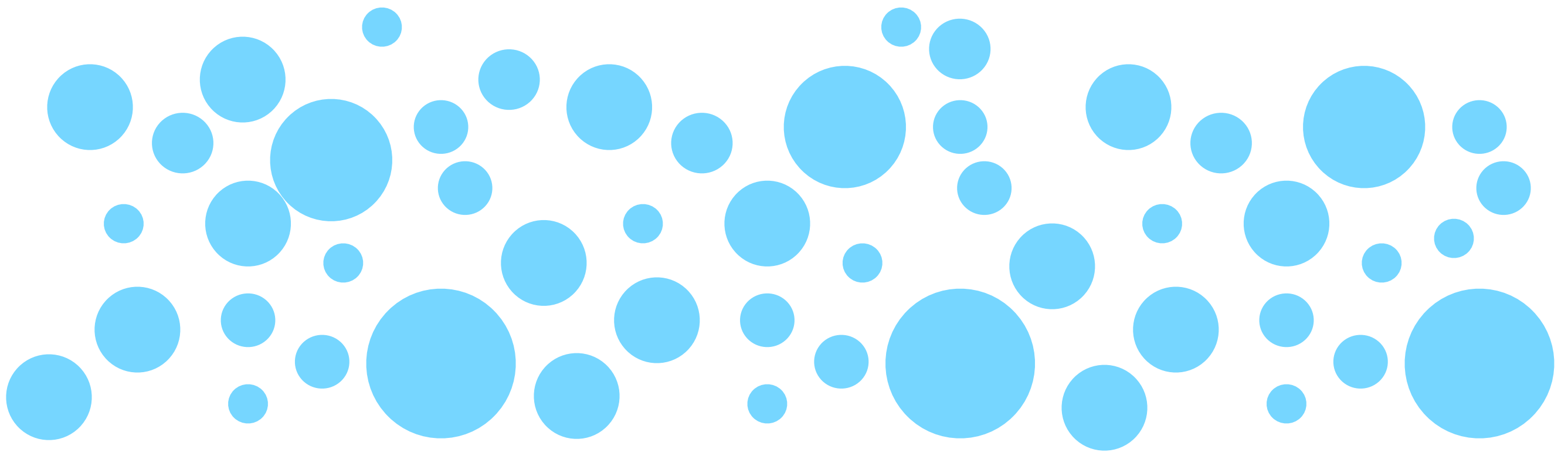
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Connectivity, Biconnectivity, Trees, Stars, Eulerian, etc.



Graph Class or “property”, Π

Lewis &
Yannakakis
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[1988]

Making a graph P_k -free by deleting the minimum number of edges is NP-hard for every $k > 2$.

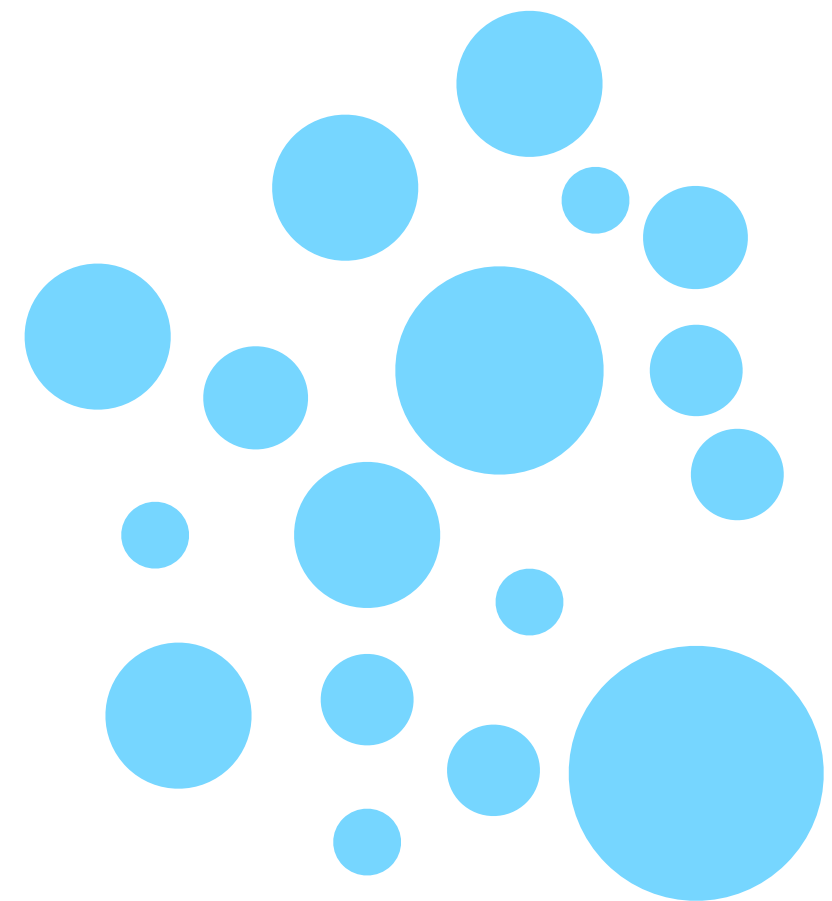
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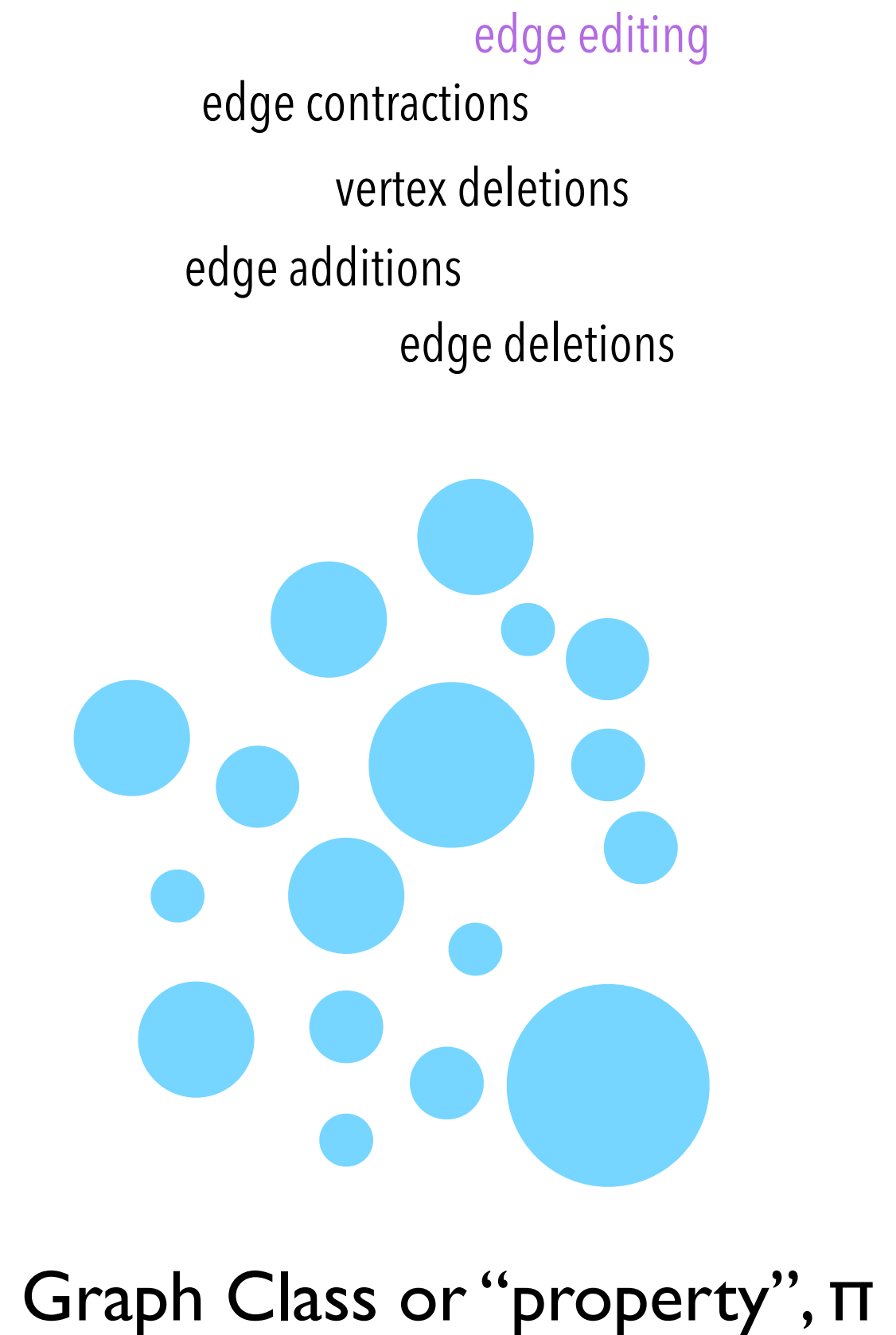
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Graph Class or “property”, Π

Perfect
Trivially Perfect
Cographs
Permutation Graphs
Bipartite
Trees
Weakly Chordal
Chordal
Strongly Chordal
Split
Interval
Proper Interval
Unit Interval
Forests
Caterpillars
Chain
Chordal Bipartite
Distance Hereditary
Comparability
Trapezoid
CoChordal
Circle
Planar



GRAPH MODIFICATION PROBLEMS

A Modern Perspective

GRAPH MODIFICATION PROBLEMS

Why bother?

Special Graph Classes – correspond to some desirable property in real-world data.

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Planar Graphs

Interval Graphs

Cluster Graphs

k-Connected Graphs

Directed Acyclic Graphs

Chordal Graphs

Special Graph Classes – correspond to some desirable property in real-world data.

Planar Graphs

Graph Drawing

Interval Graphs

Physical Mapping of DNA

Cluster Graphs

Correlation Clustering

k-Connected Graphs

Reliability of Networks

Directed Acyclic Graphs

Deadlock Recovery, Operating Systems

Chordal Graphs

Gaussian Elimination over Sparse Matrices

Special Graph Classes – correspond to some desirable property in real-world data.

We would like to “achieve” these properties with minimum cost, which naturally leads us to the graph modification framework.

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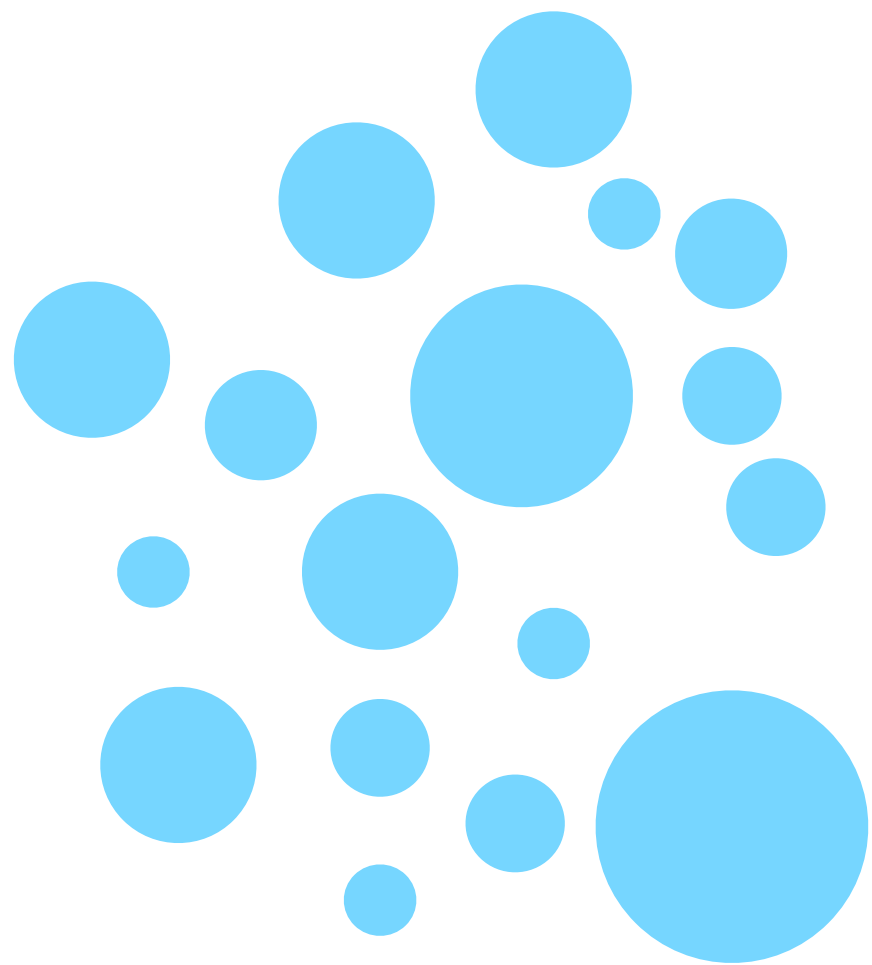
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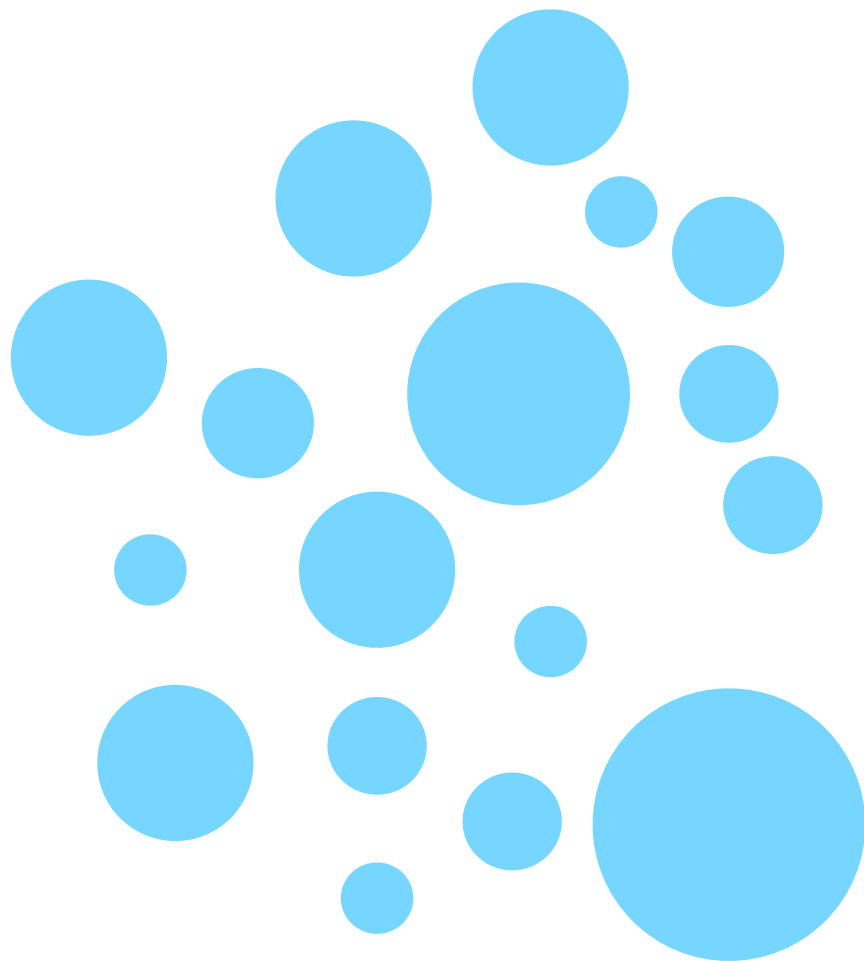
Algorithms



Graph Class or “property”, Π

Forbidden Subgraph Characterization

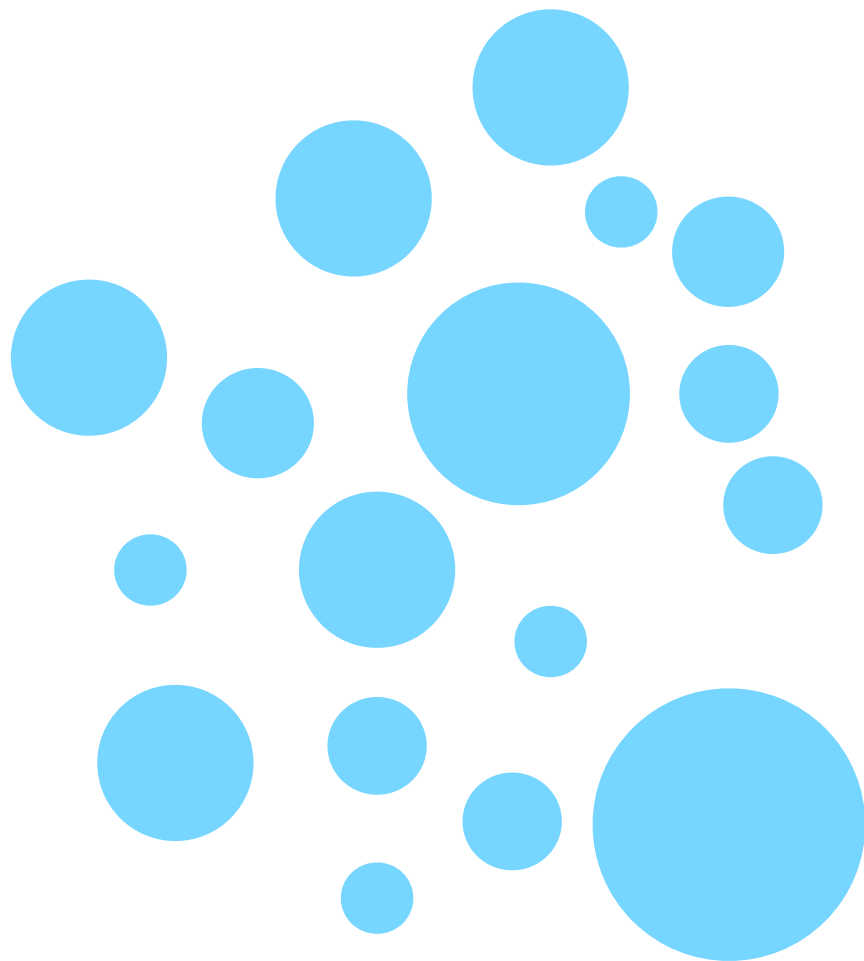
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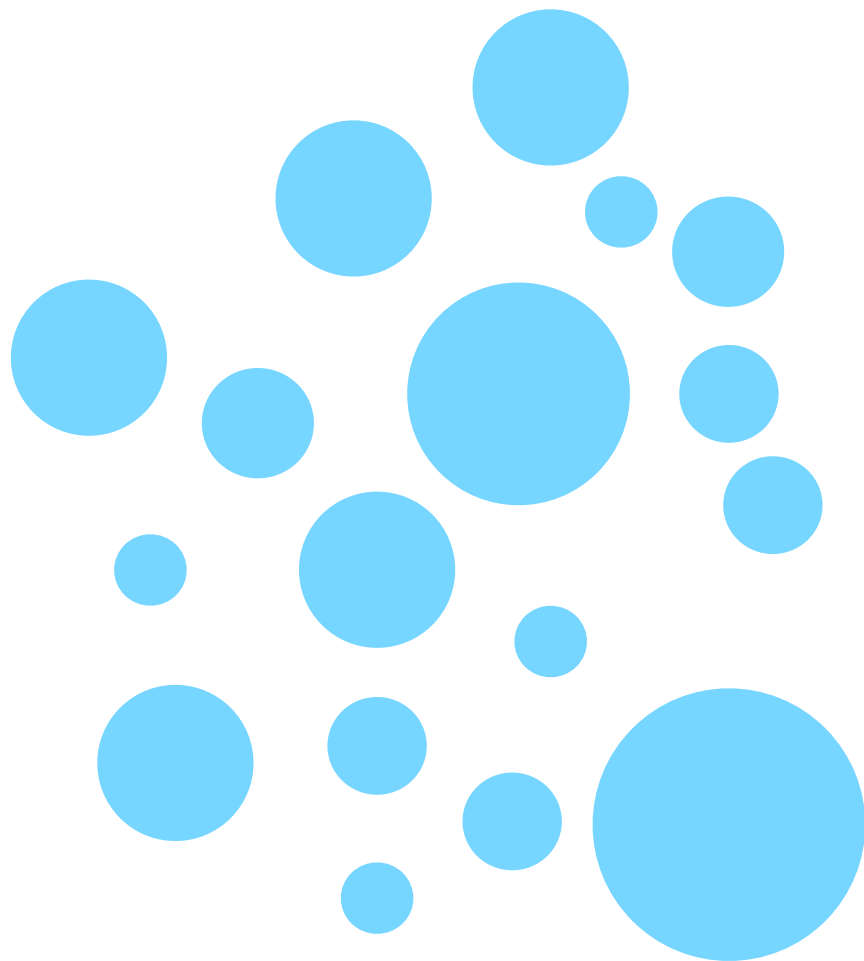
Graph Class or “property”, Π

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A graph admits a **forbidden subgraph characterization** if, and only if, it is **closed under taking induced subgraphs (hereditary)**, that is, the property is preserved under vertex deletions.



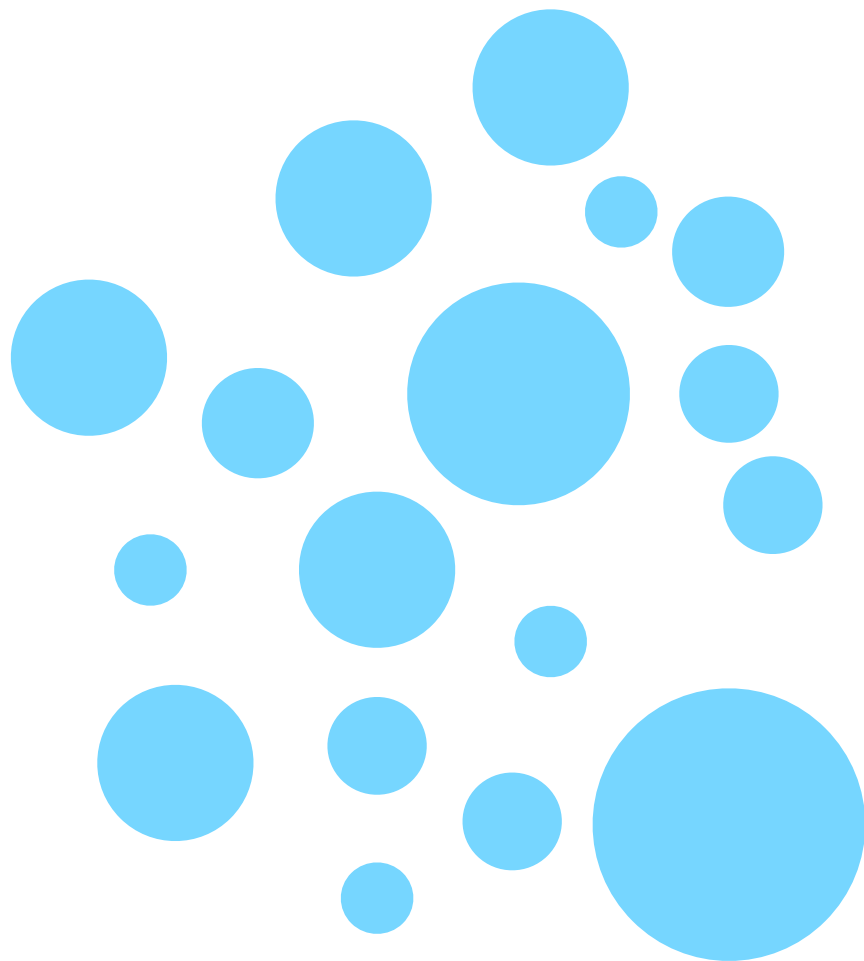
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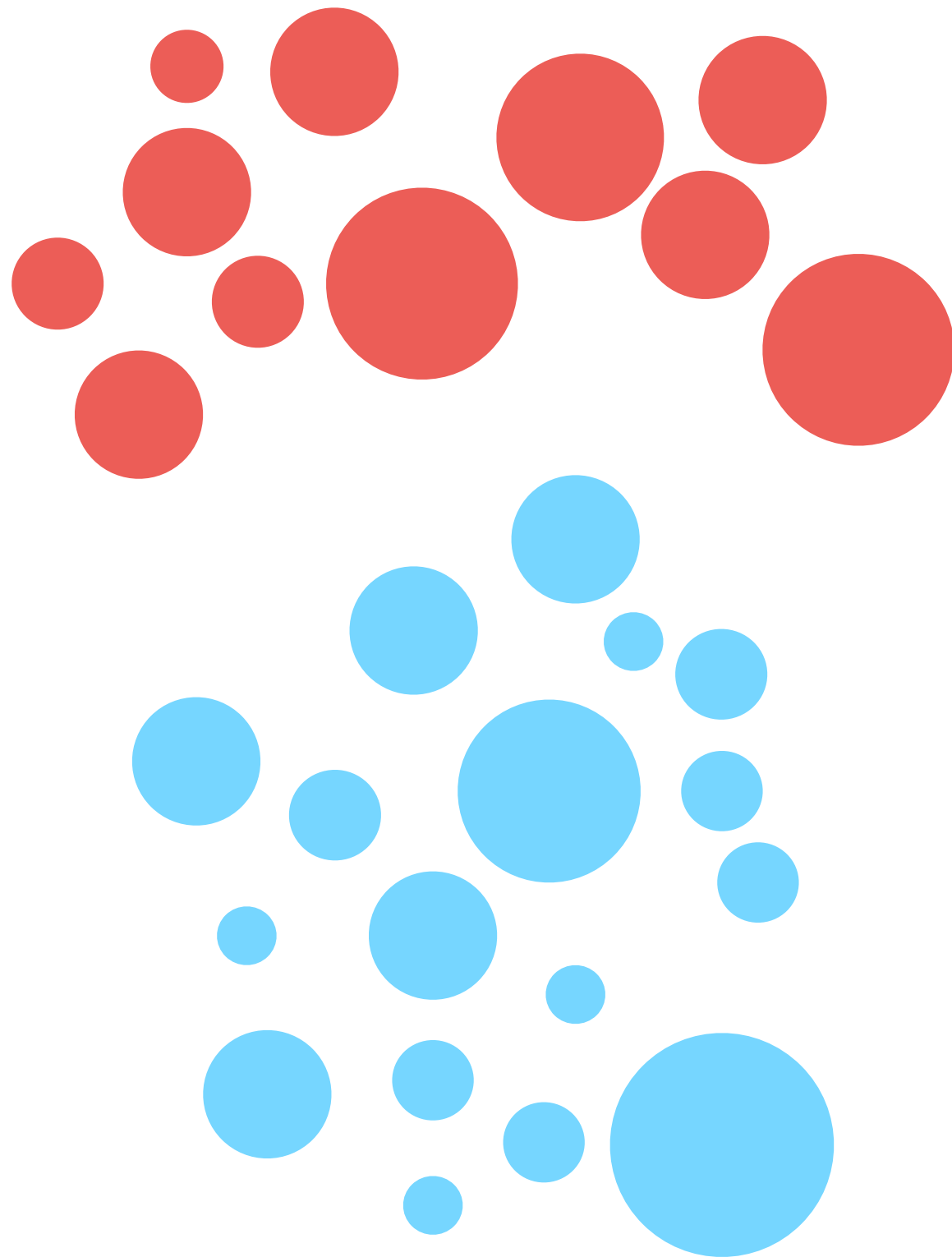
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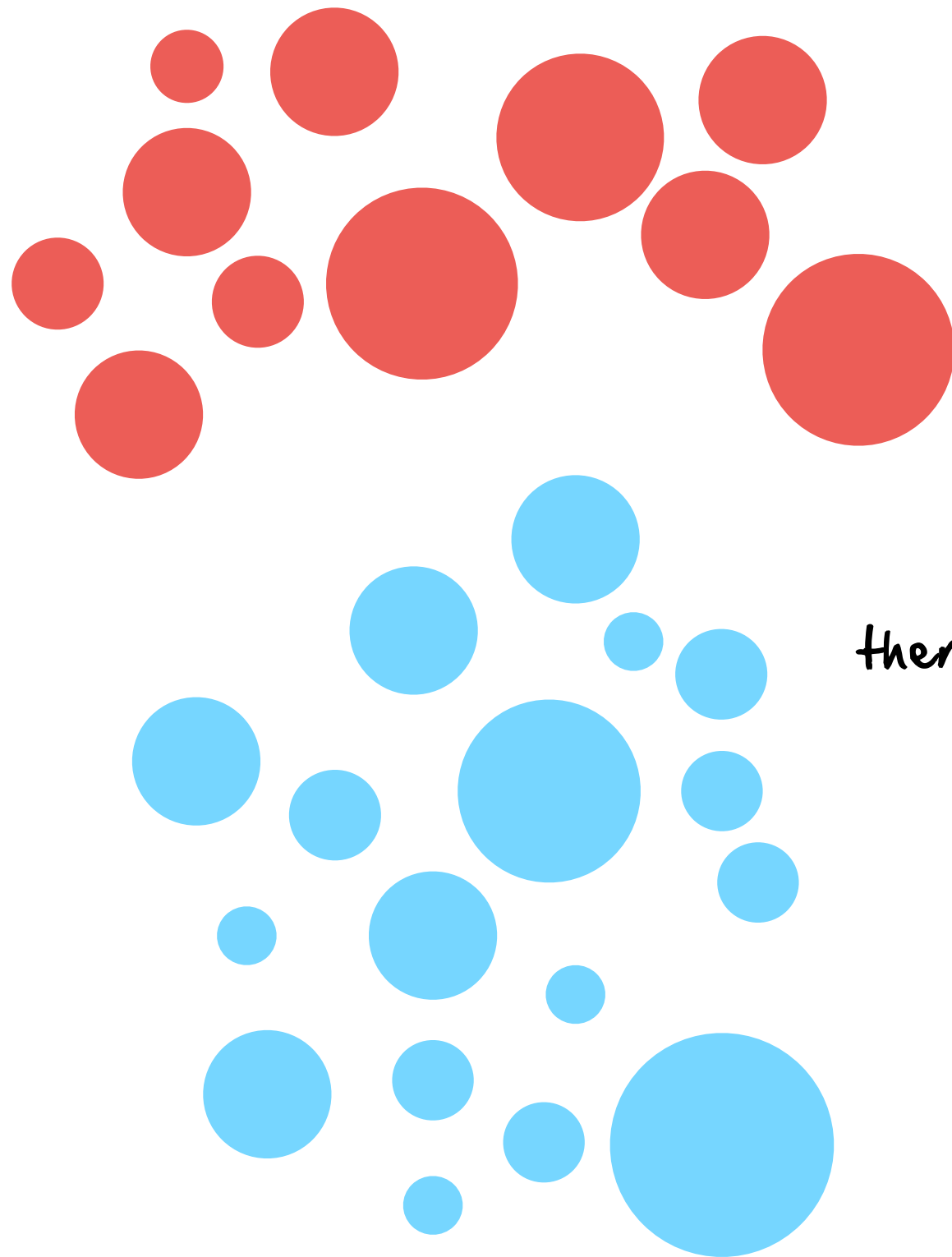
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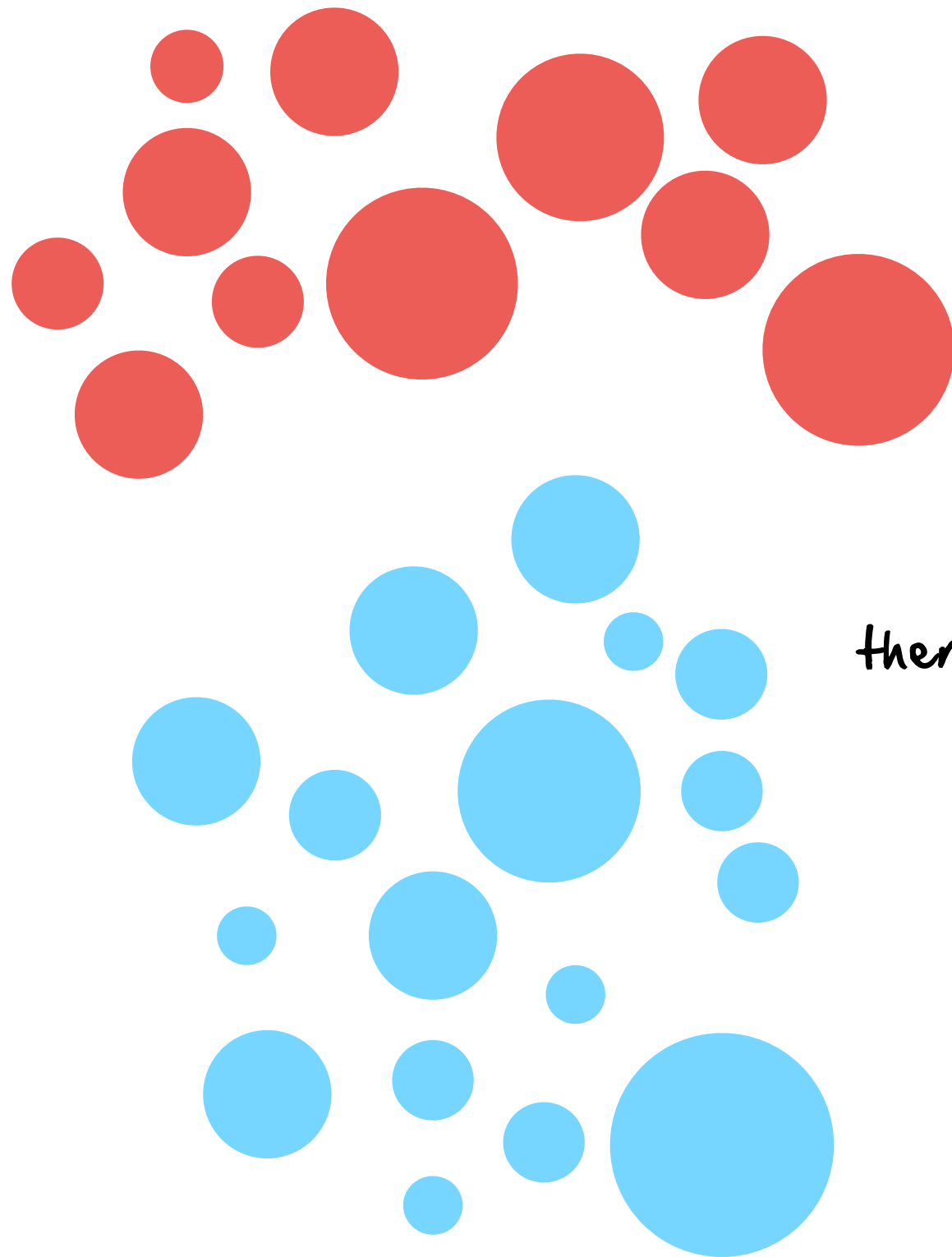
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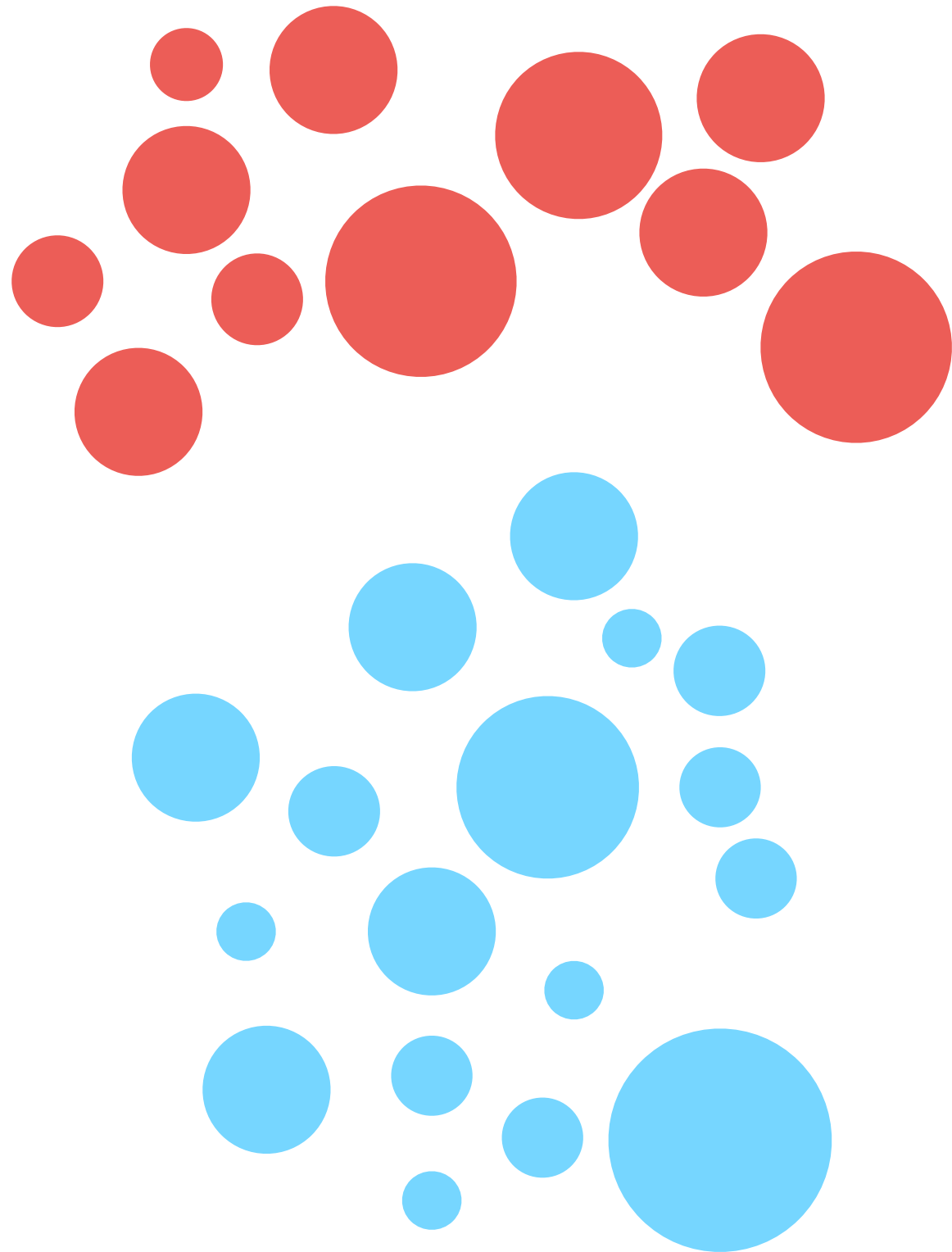
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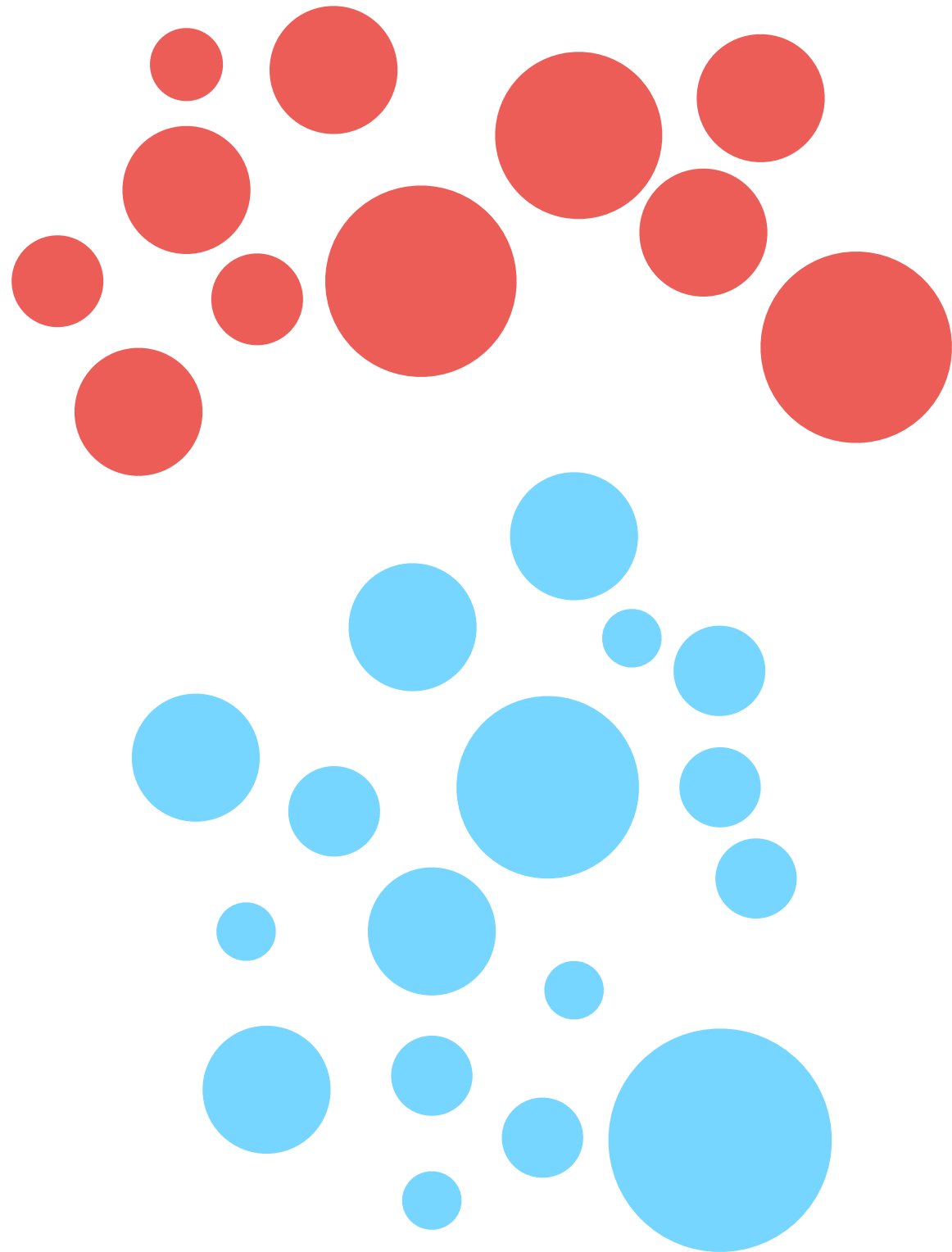
If there are finitely many forbidden minors...?



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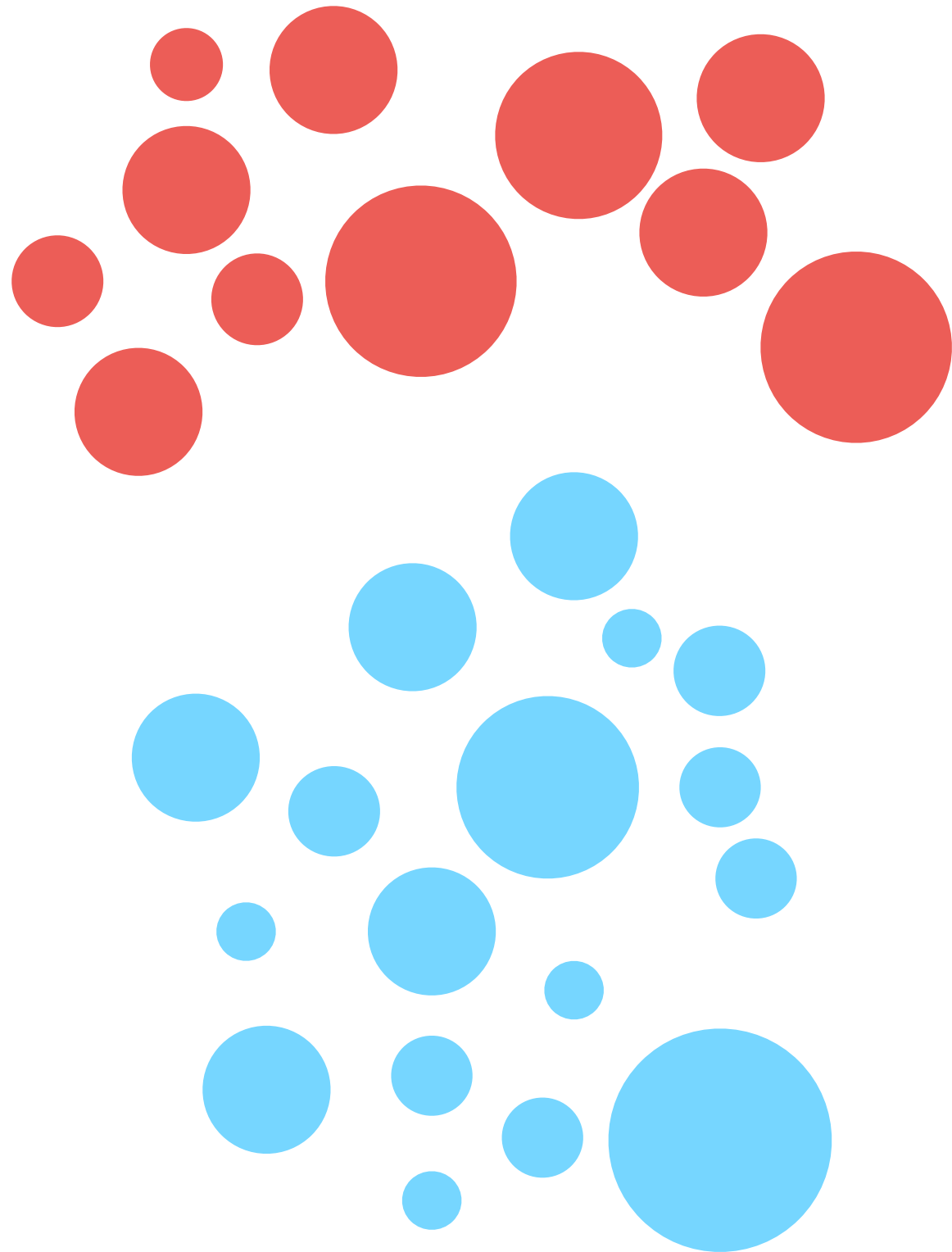


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In fact, there is always a finite forbidden set!
(Robertson-Seymour; Graph Minors Theorem)



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In fact, there is always a finite forbidden set!
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Now: the graph modification problem has boiled down
to a membership testing problem, which can be
done in cubic time, given the finite forbidden set.

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A graph admits a **forbidden subgraph characterization**
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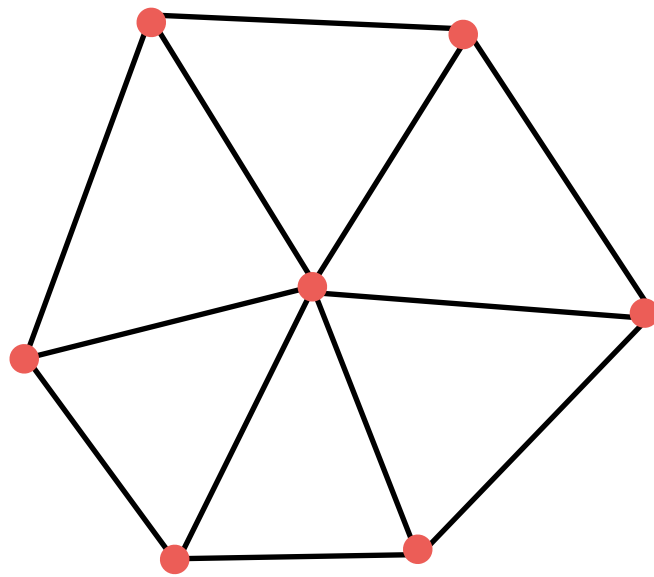
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**Can the node deletion question for hereditary properties
always be answered with the “graph minors hammer”?**

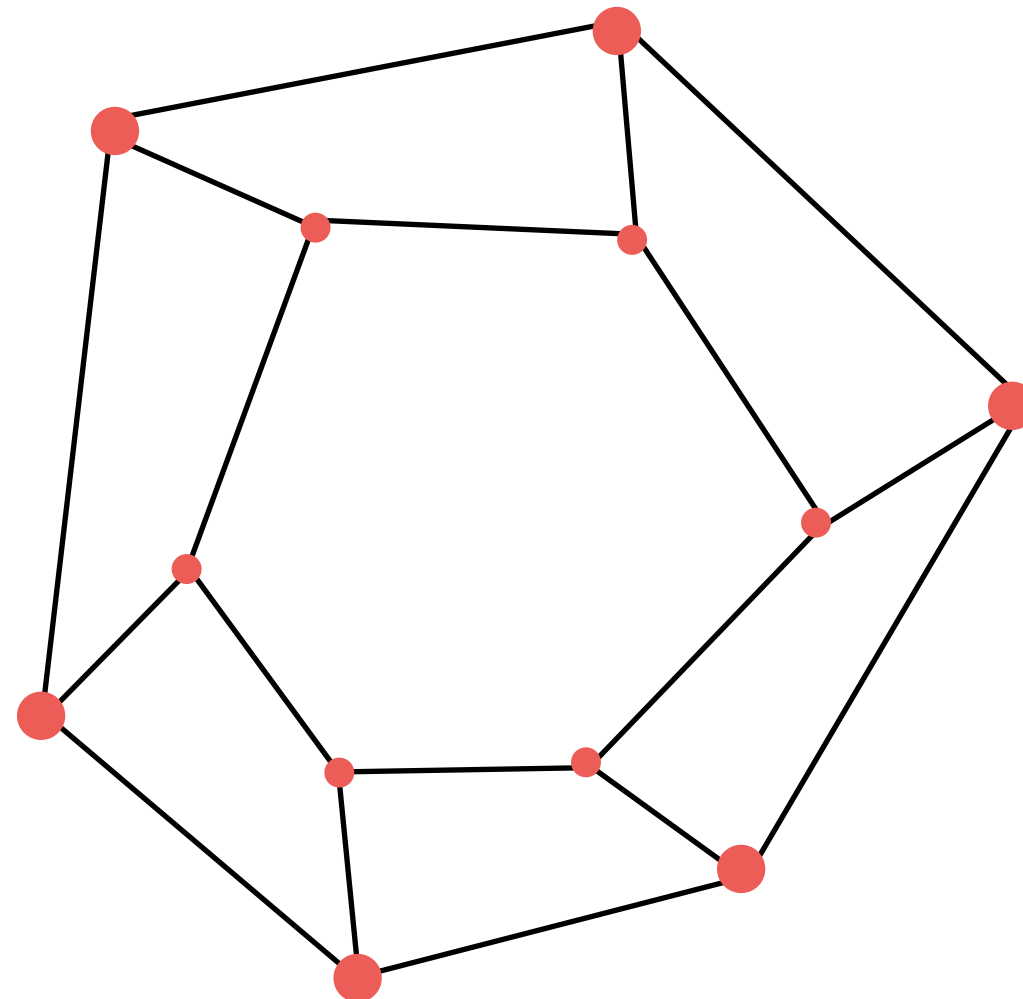
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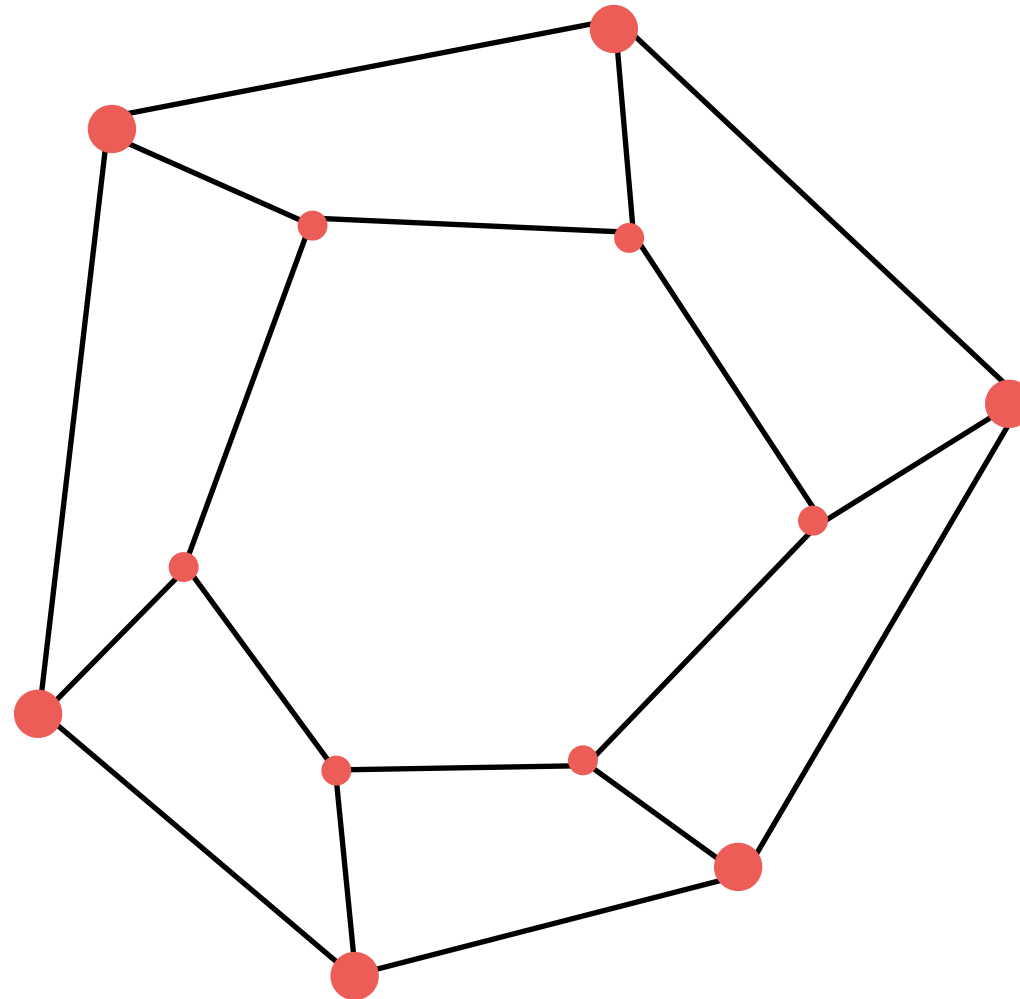


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The property is hereditary, but **not** minor-closed.

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not having any wheel as an induced subgraph.



Lokshtanov
(2008)

Wheel-Free Deletion and Wheel-Free Vertex Deletion
are **$W[2]$ -hard**.

Finding large induced subgraphs with property Π .

Khot and Raman, (2002)

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Ramsey Numbers!

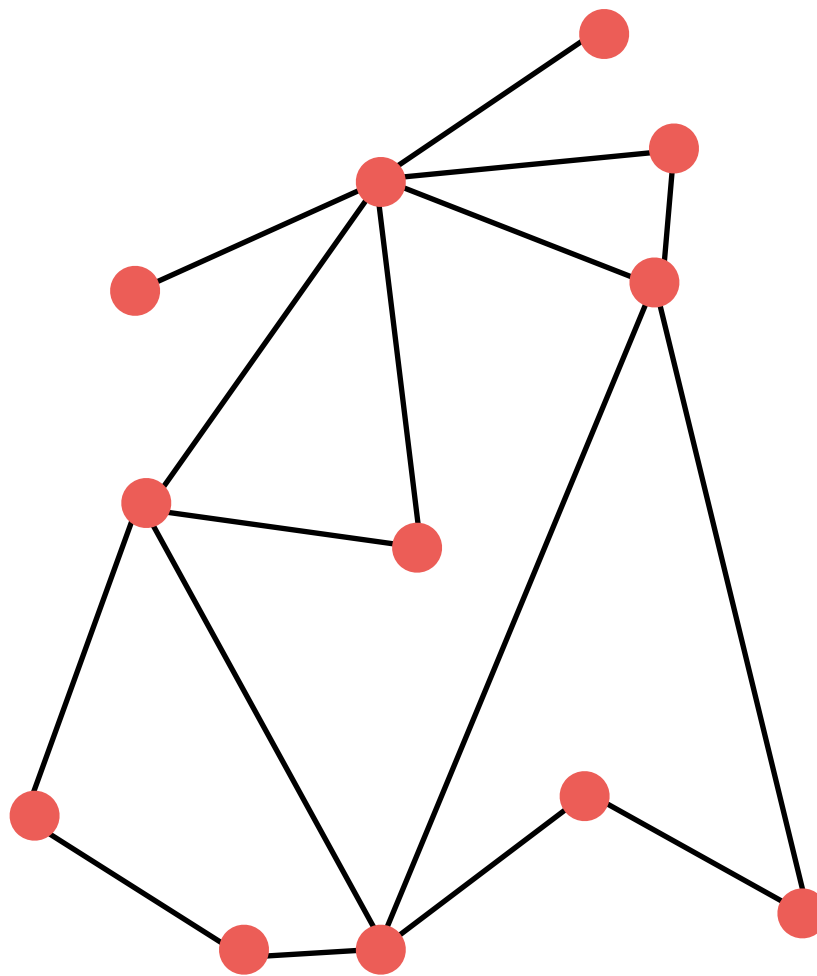
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VERTEX COVER

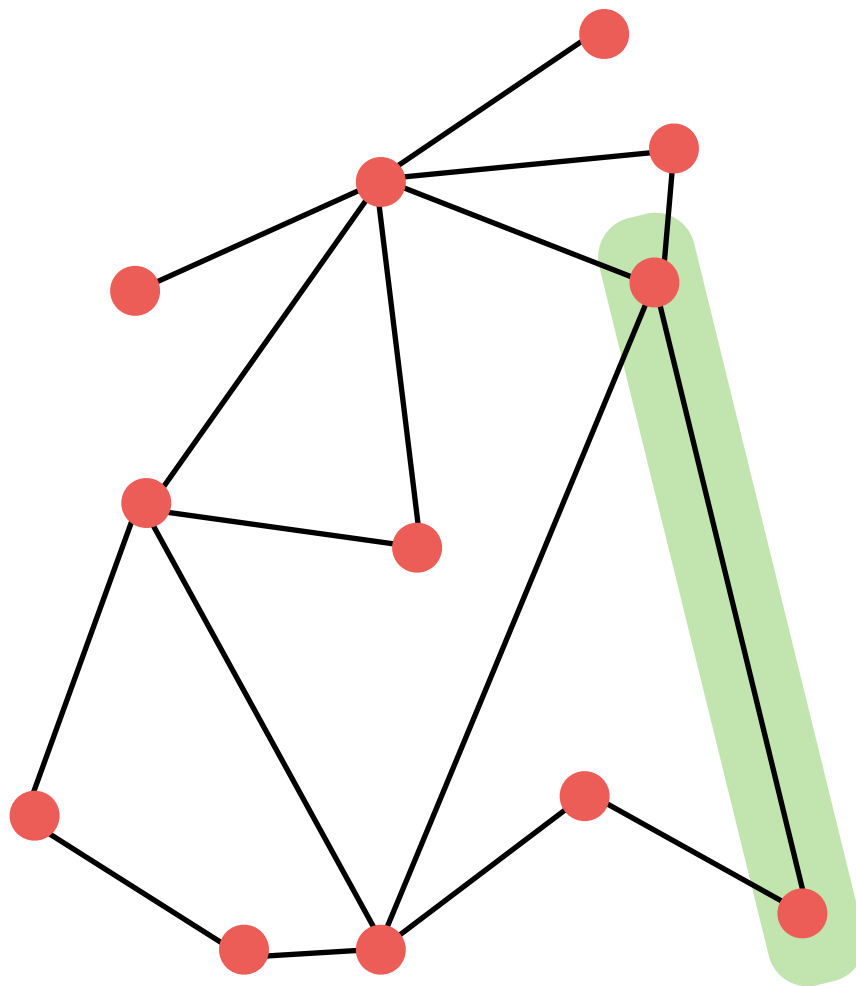
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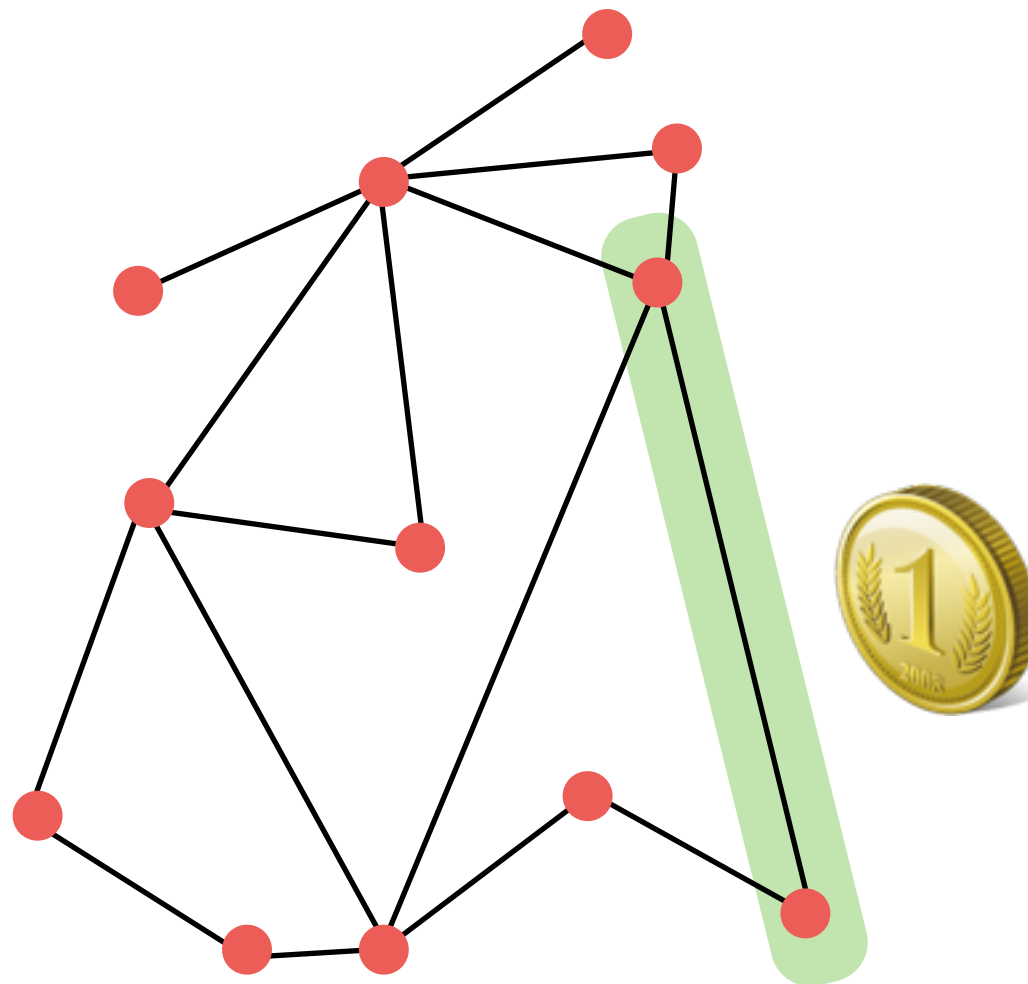
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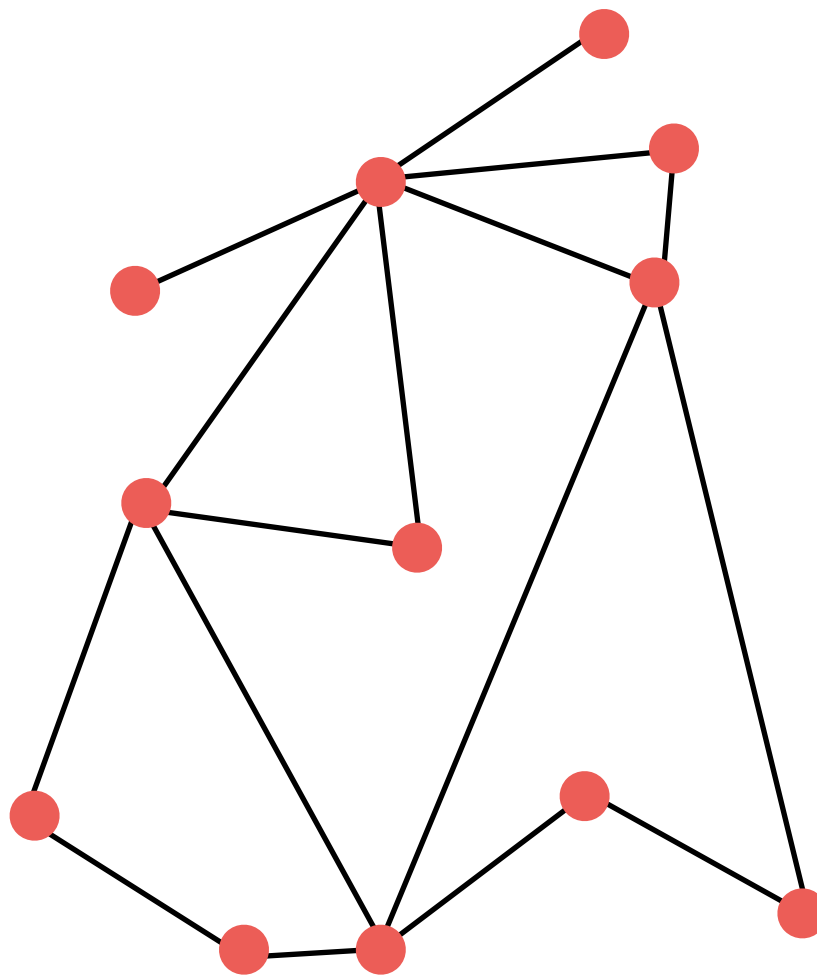
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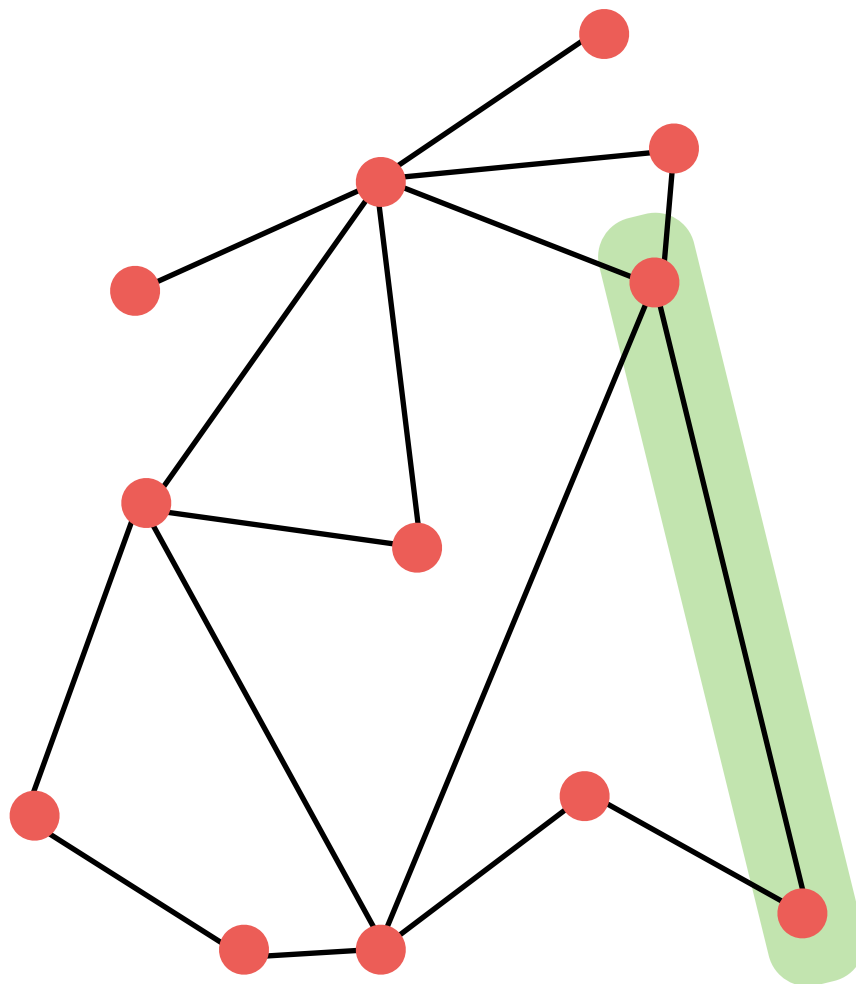
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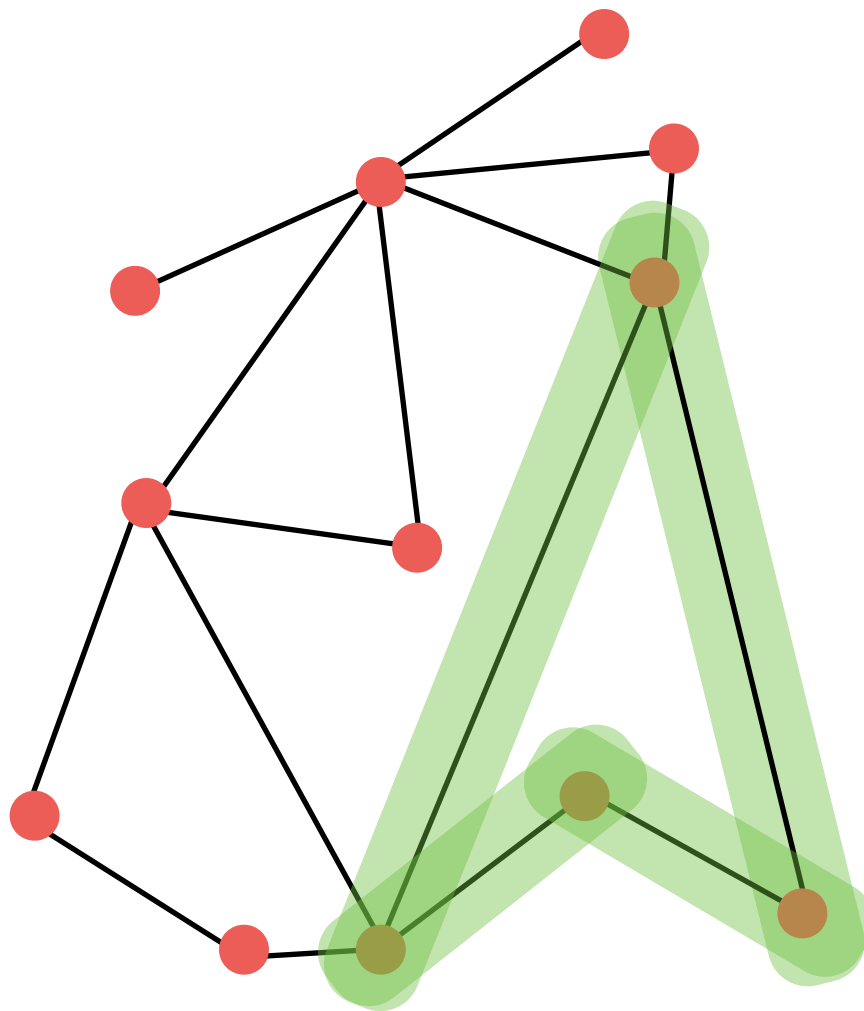
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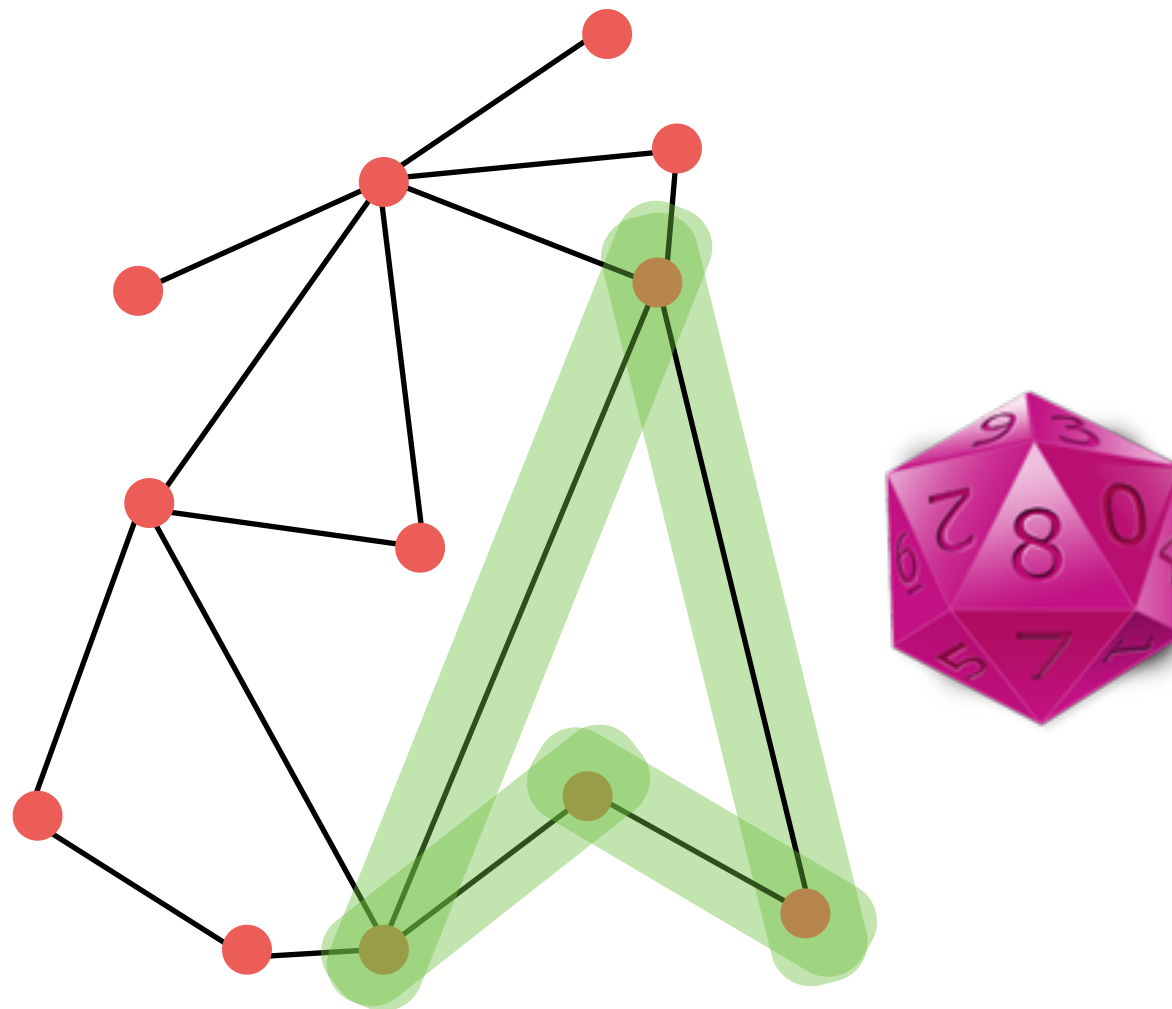
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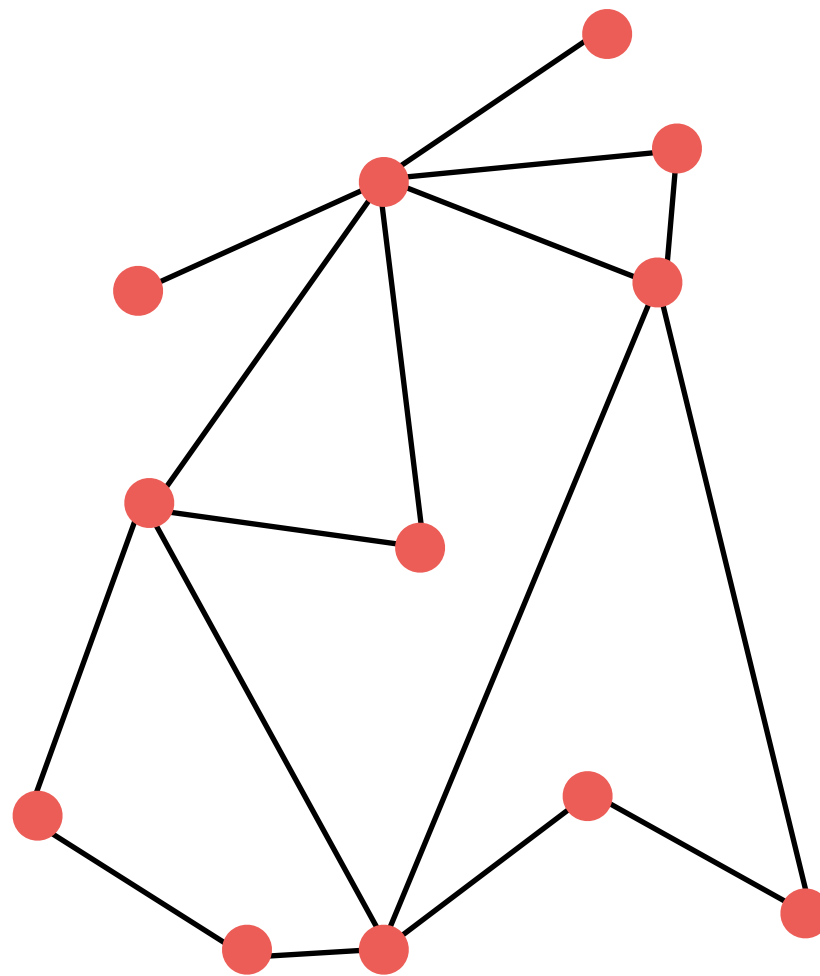
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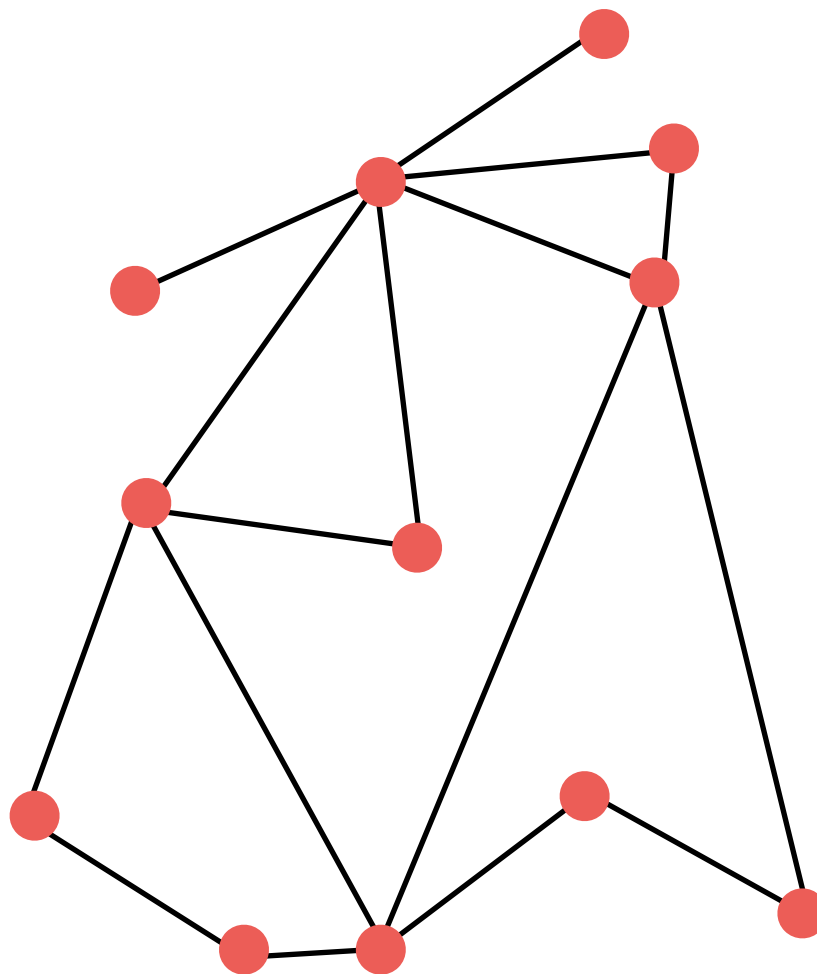
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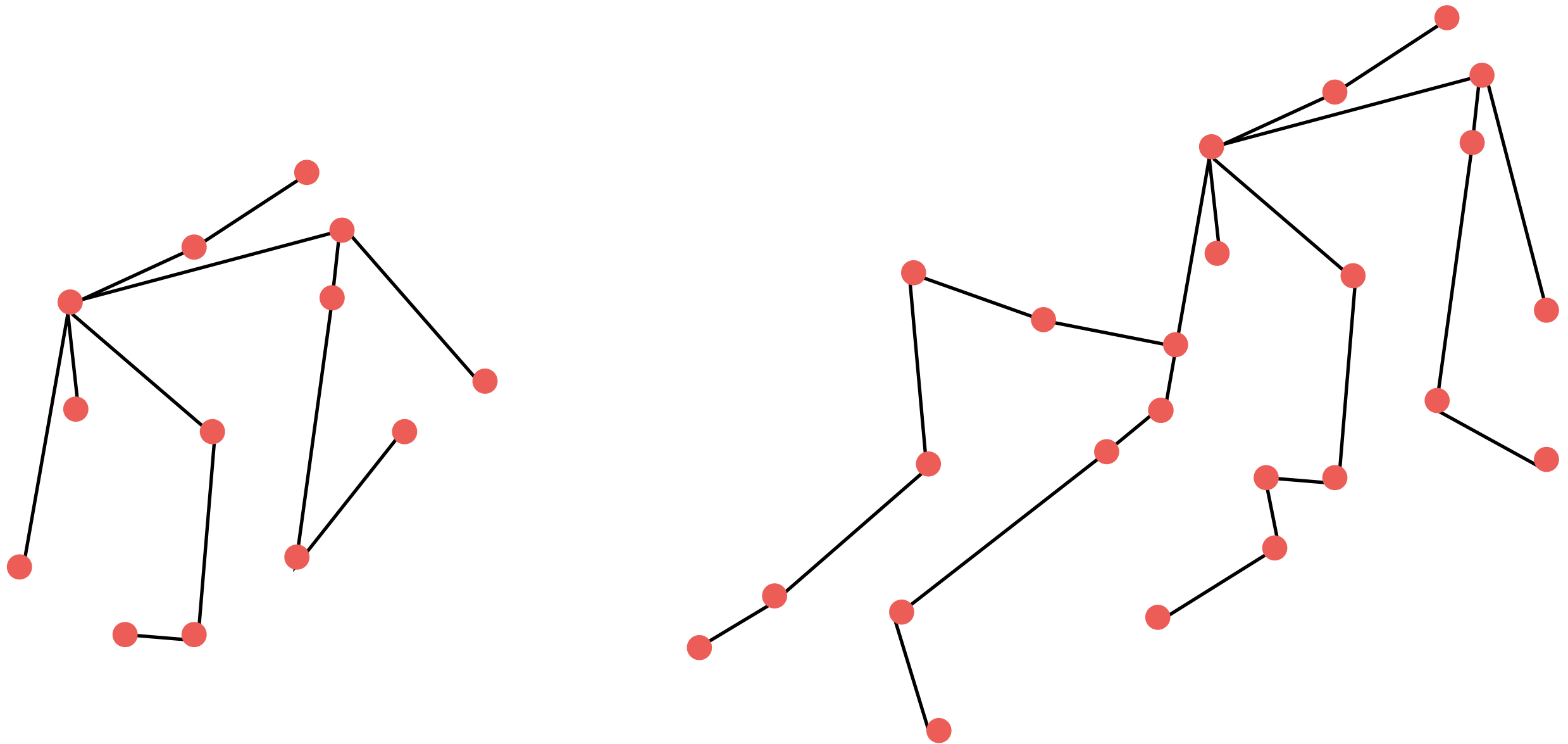
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Let's stare at the *structure* of a YES-instance.

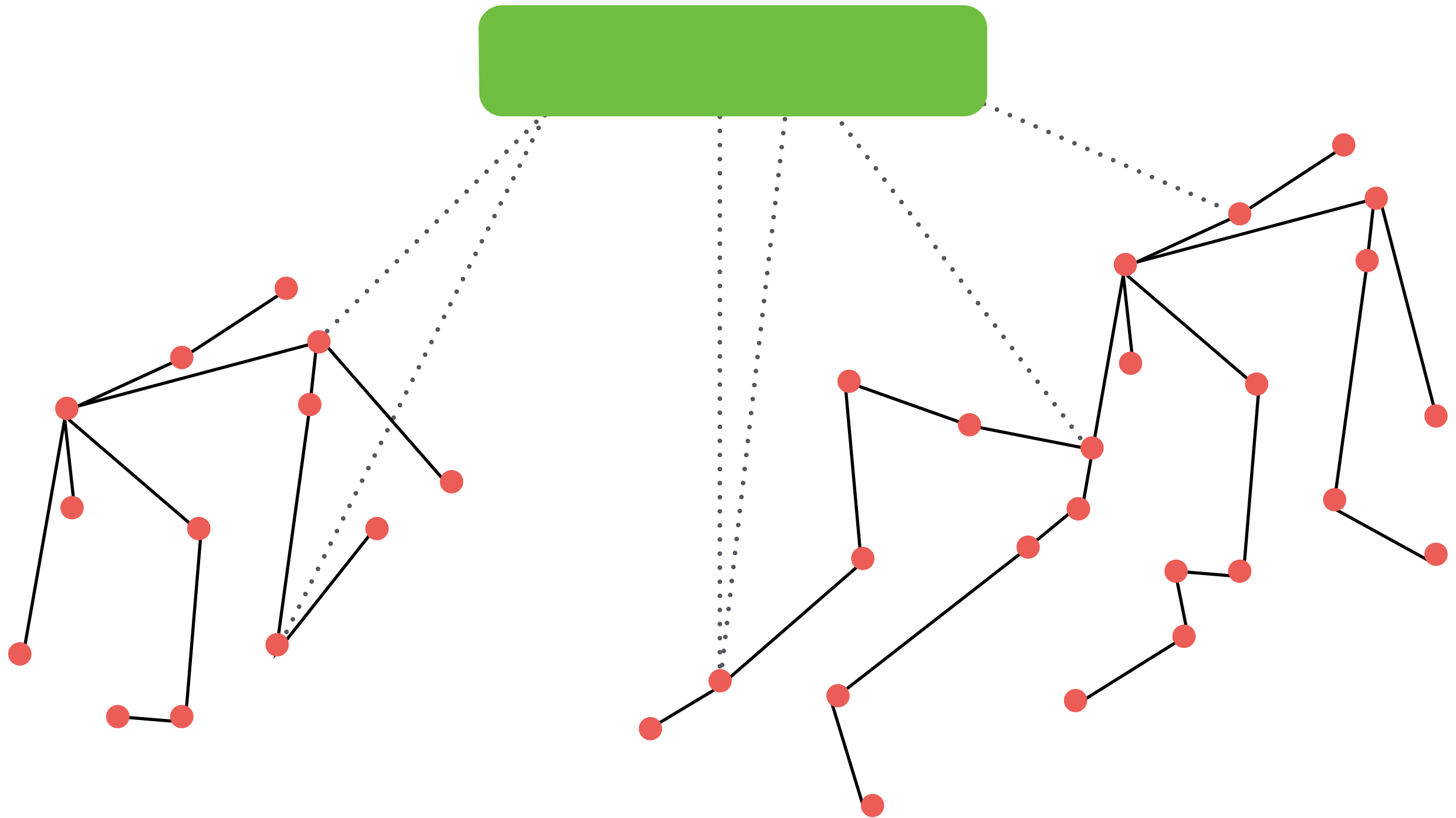
#whisper: Let us also restrict ourselves to graphs of constant maximum degree, say five.

the k vertices corresponding to the FVS

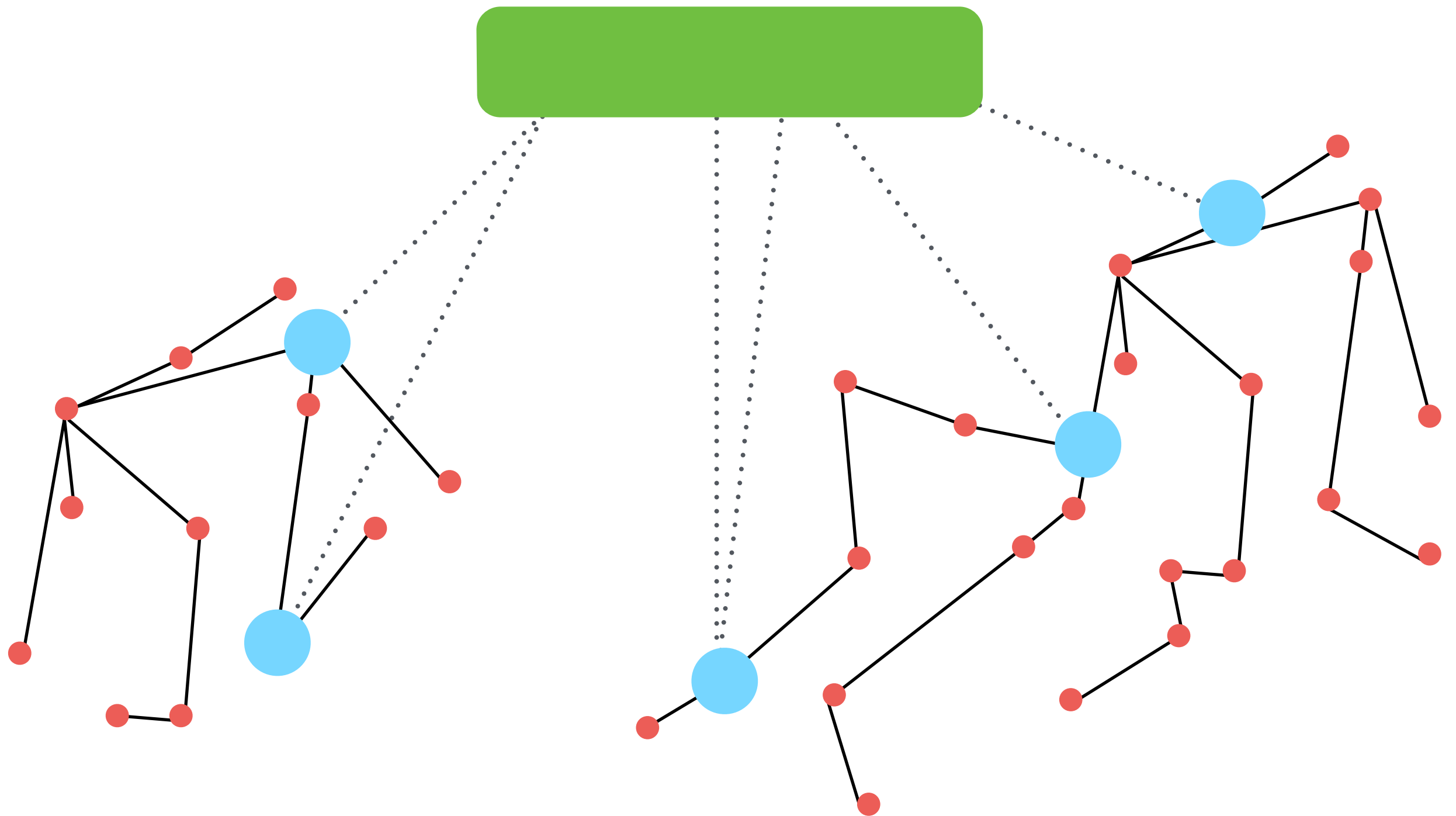


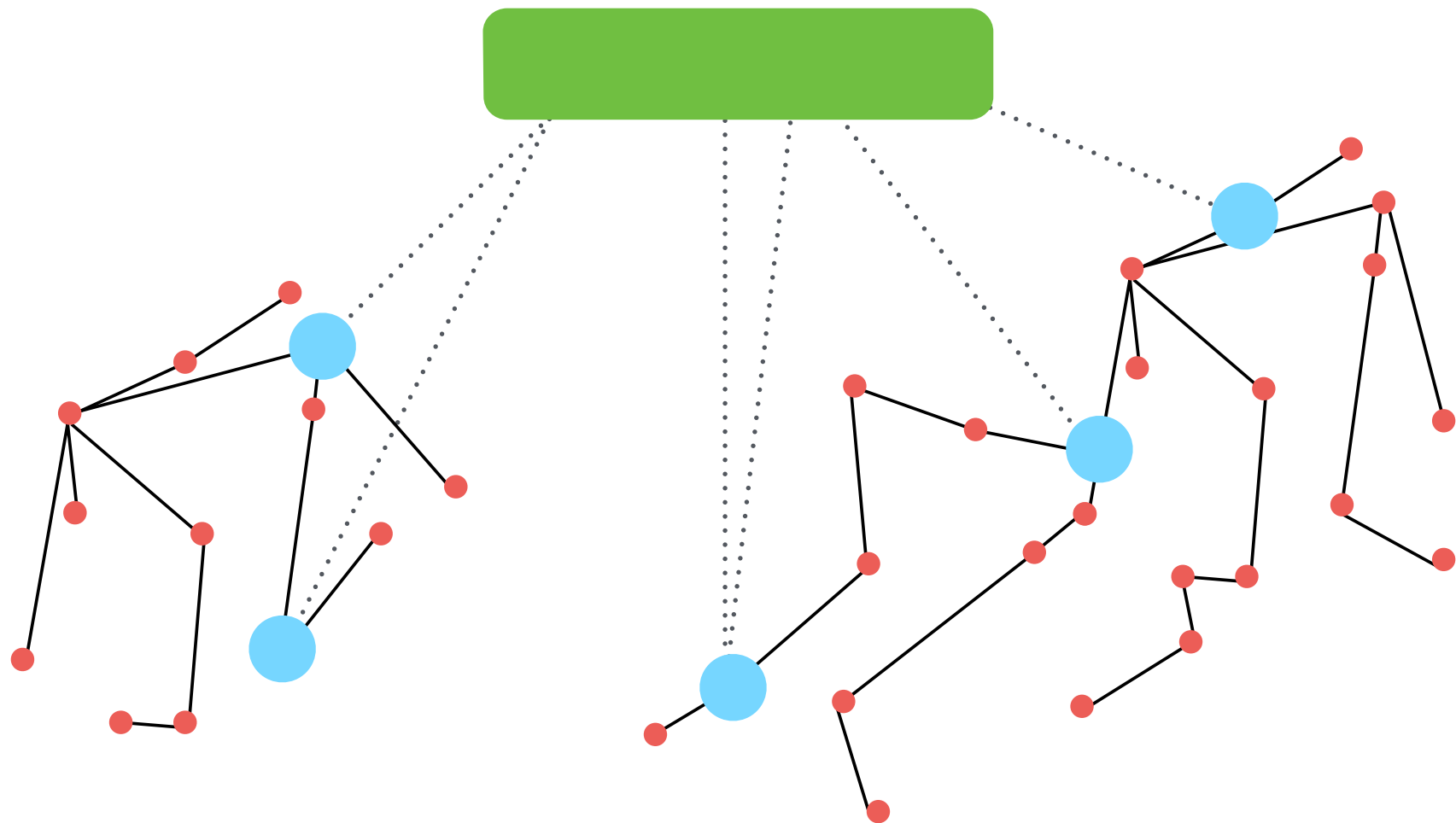
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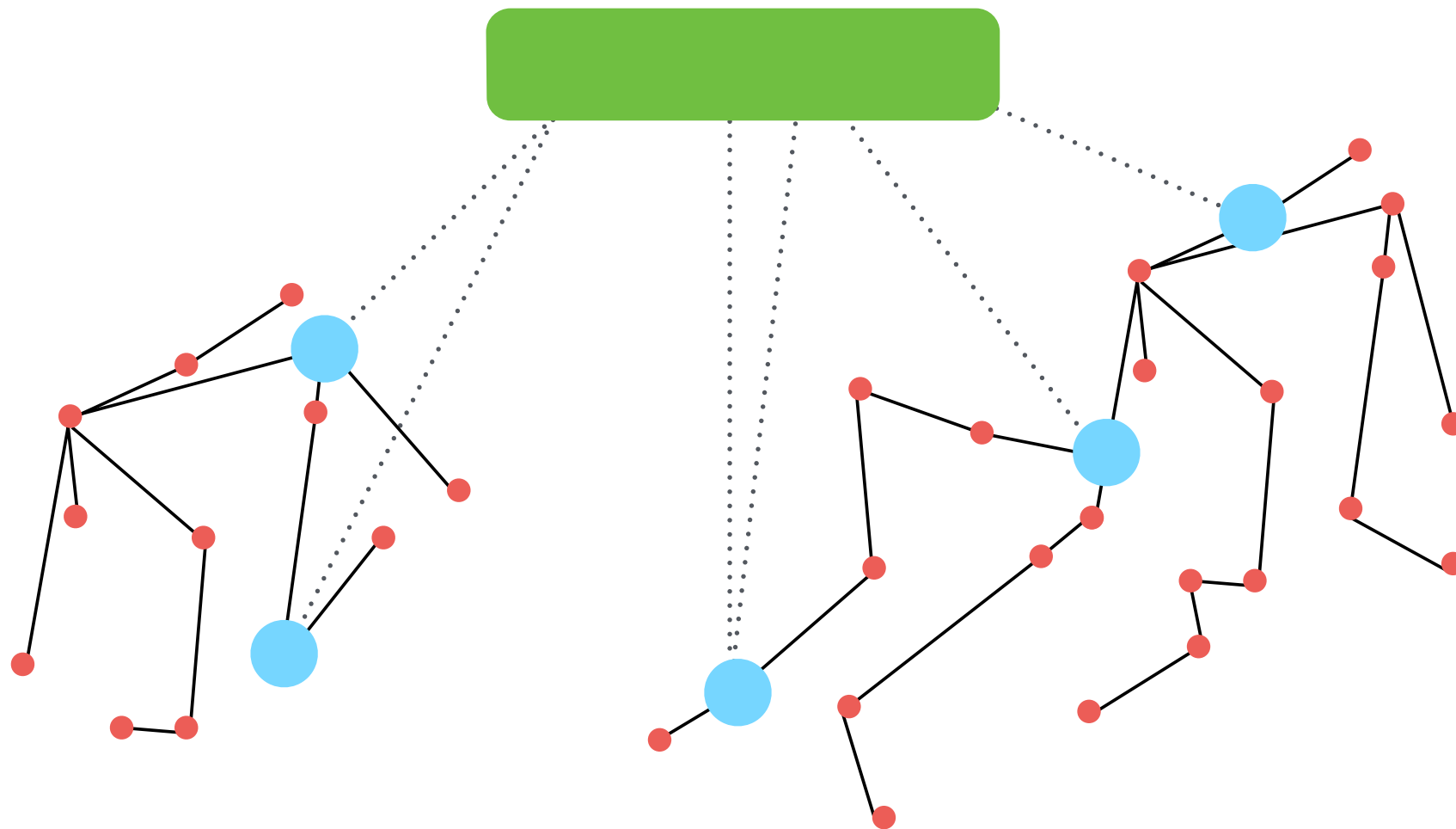
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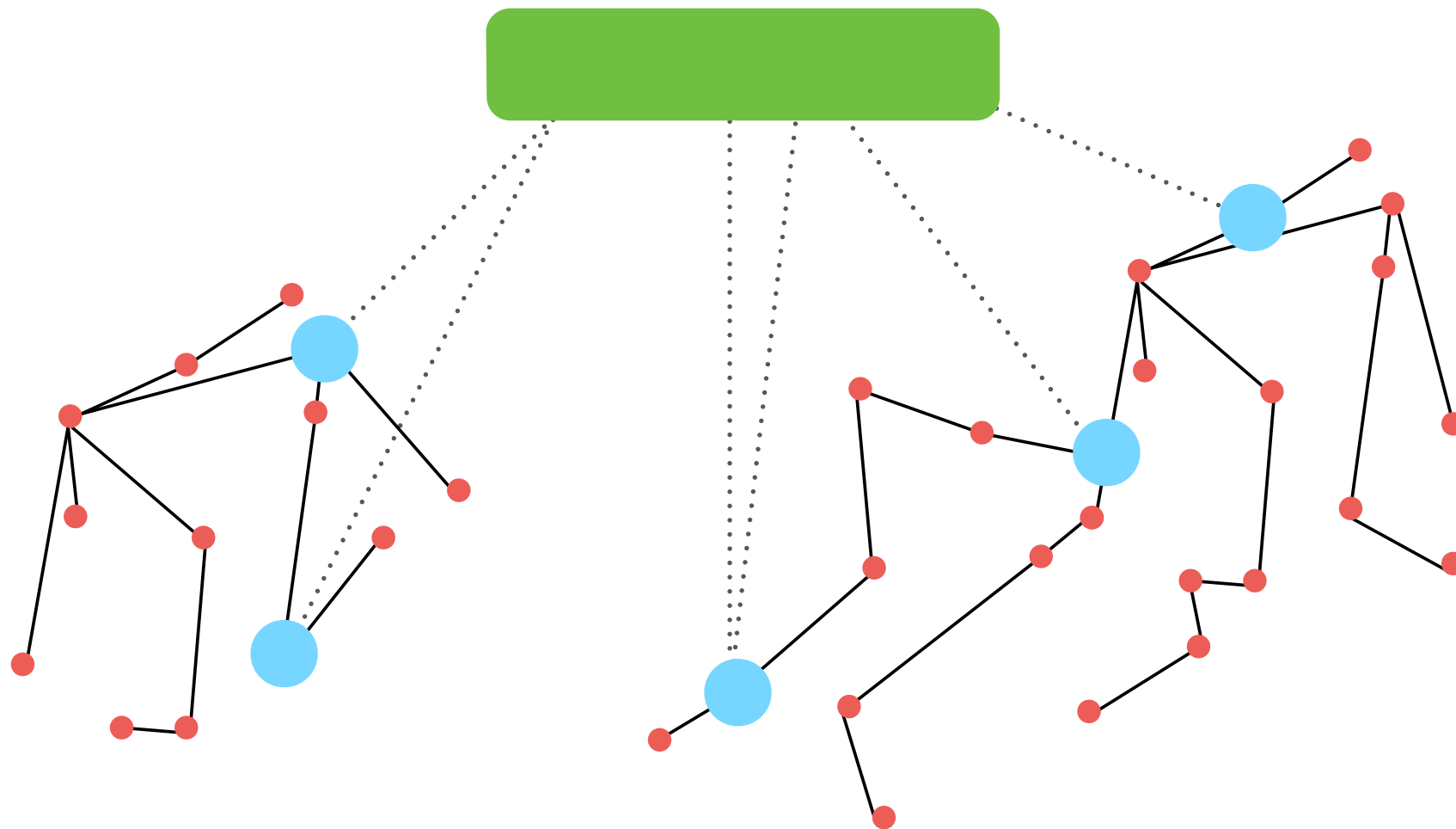
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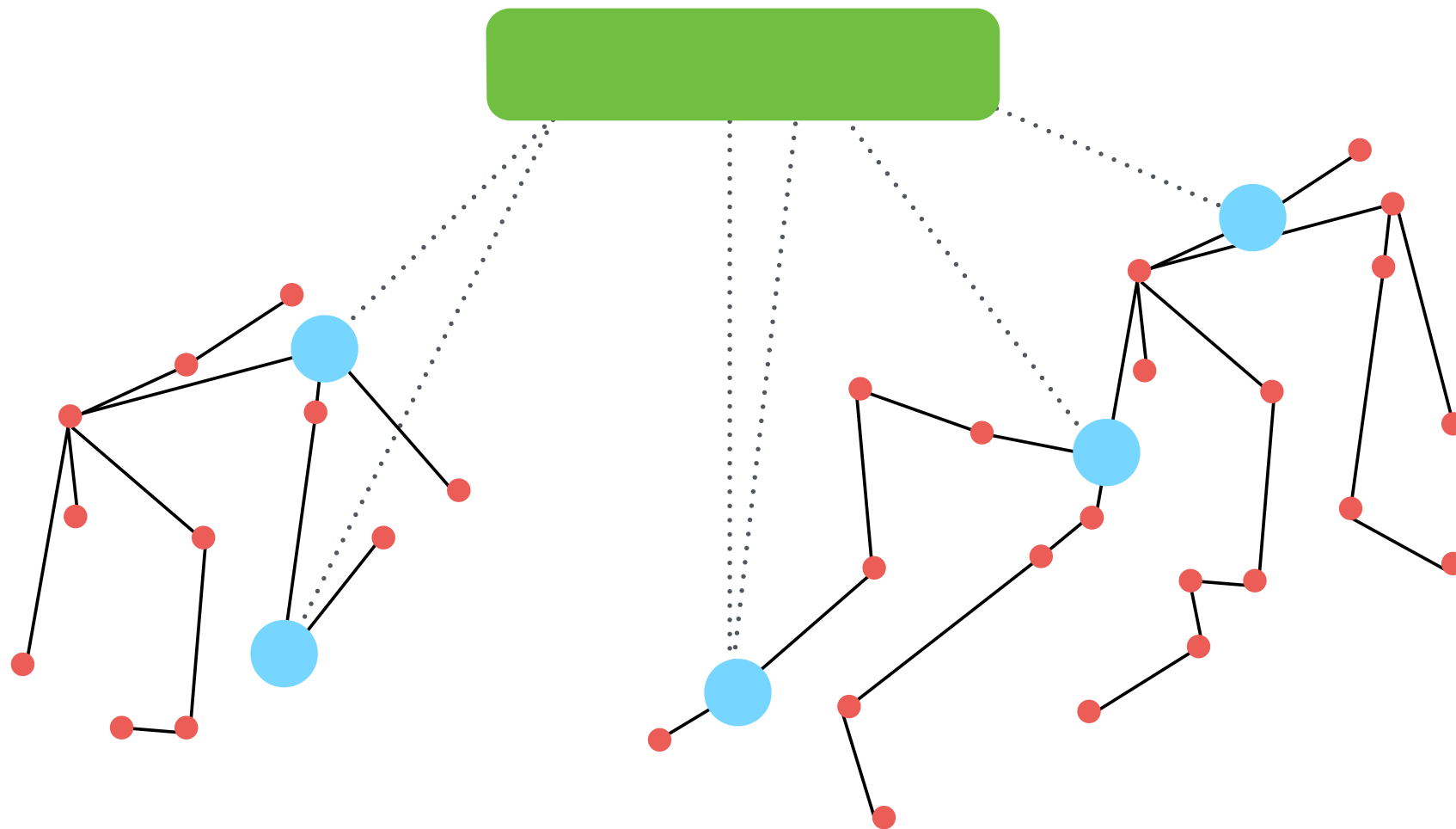




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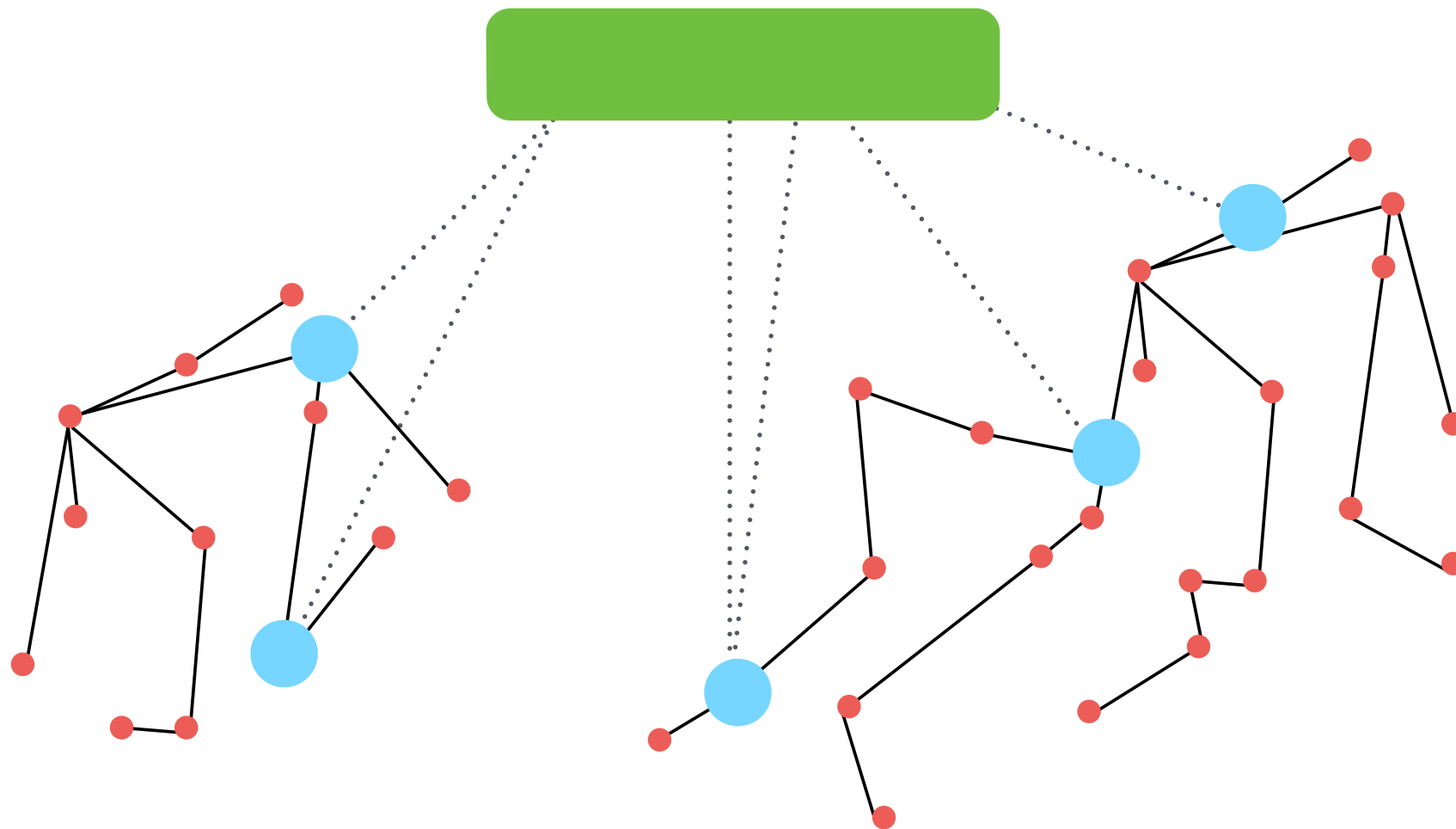


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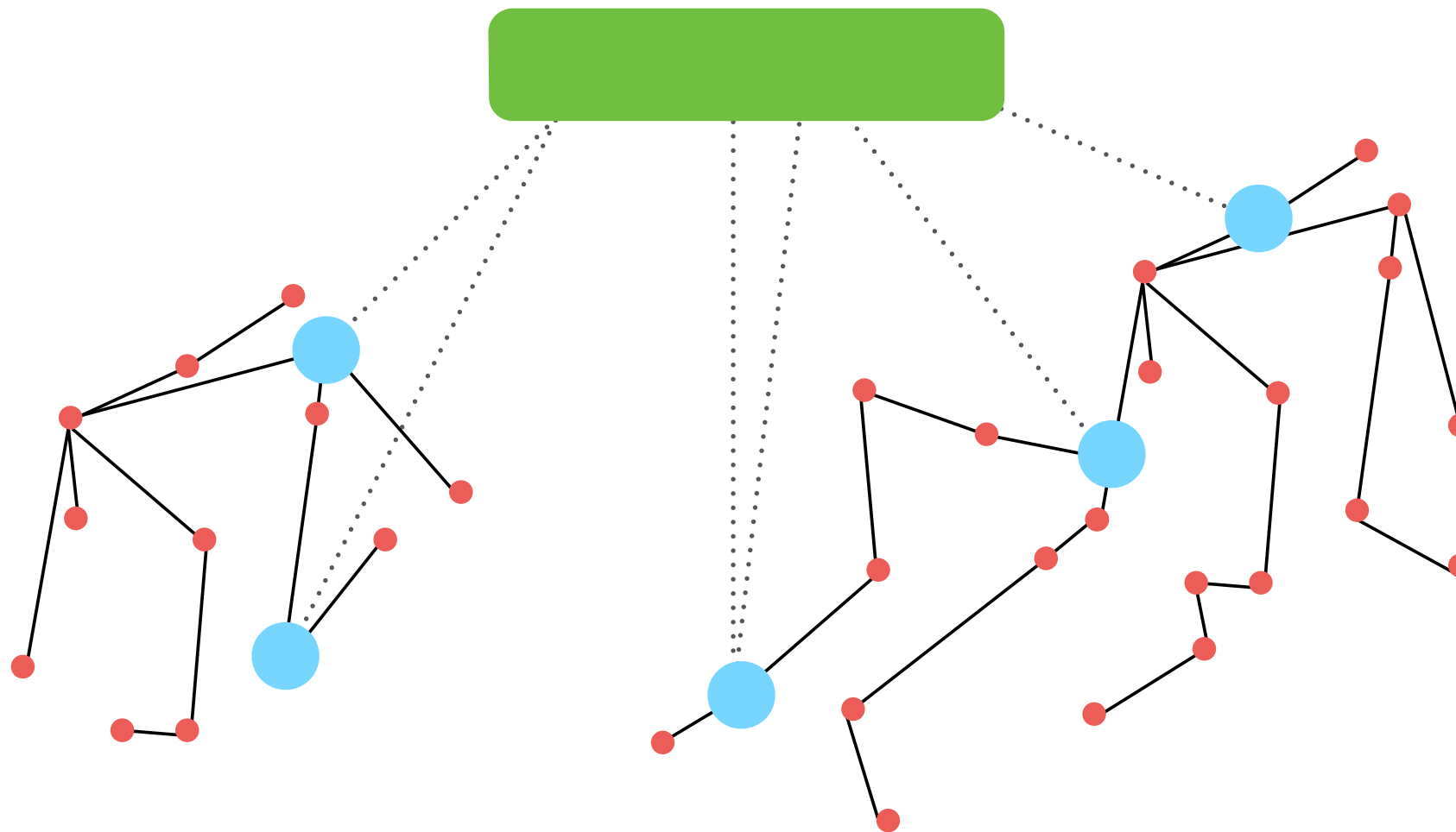
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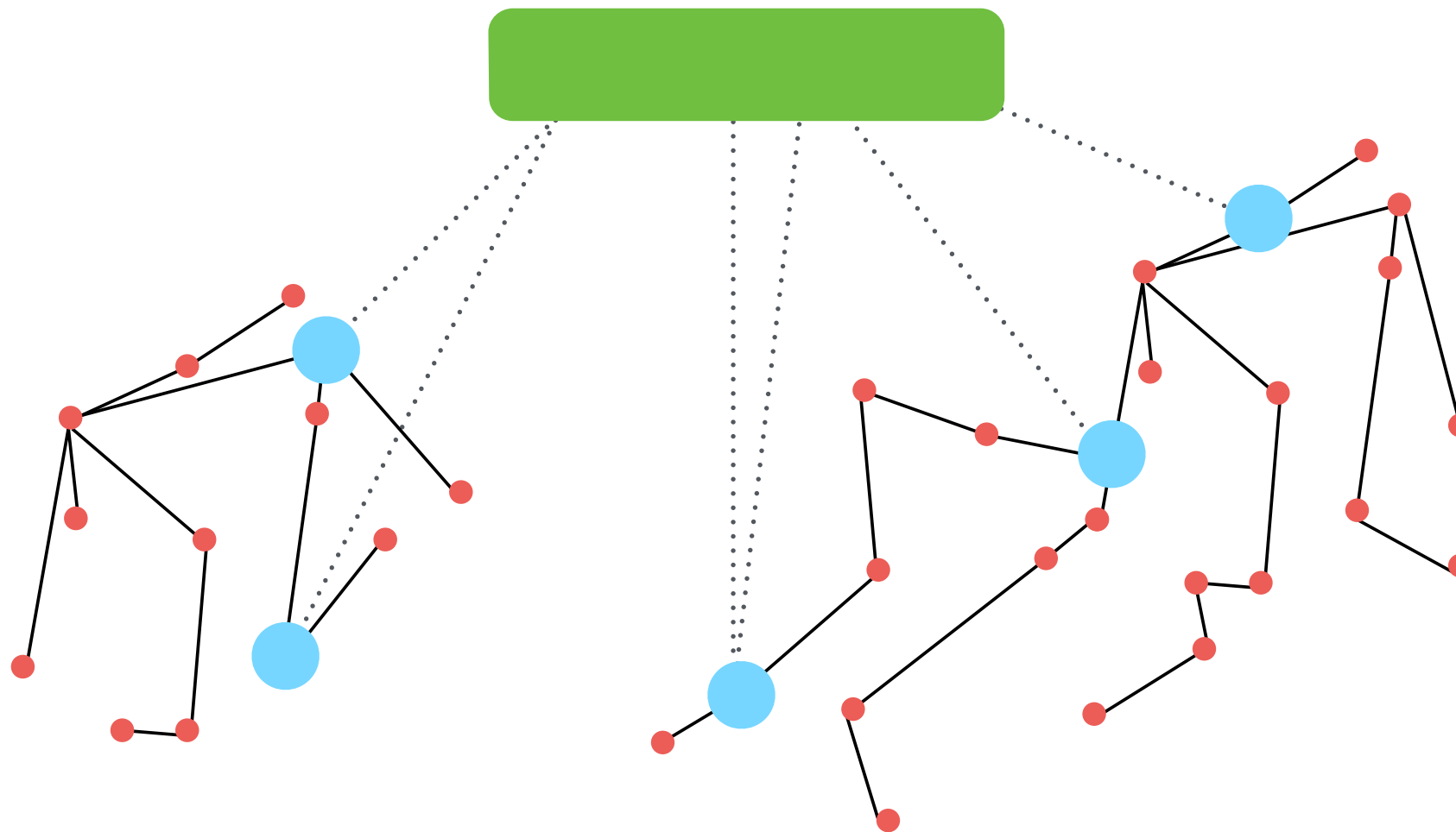


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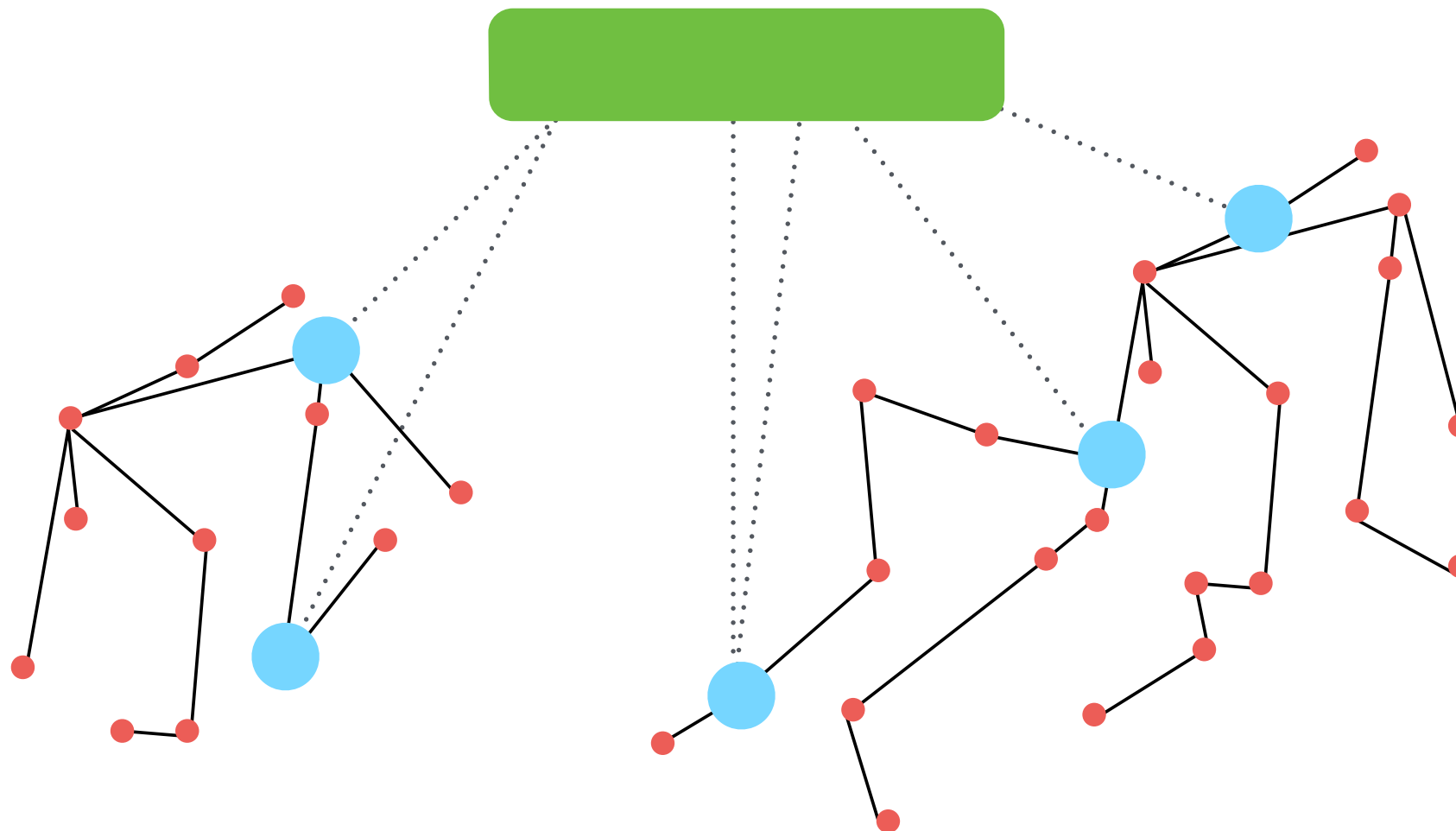
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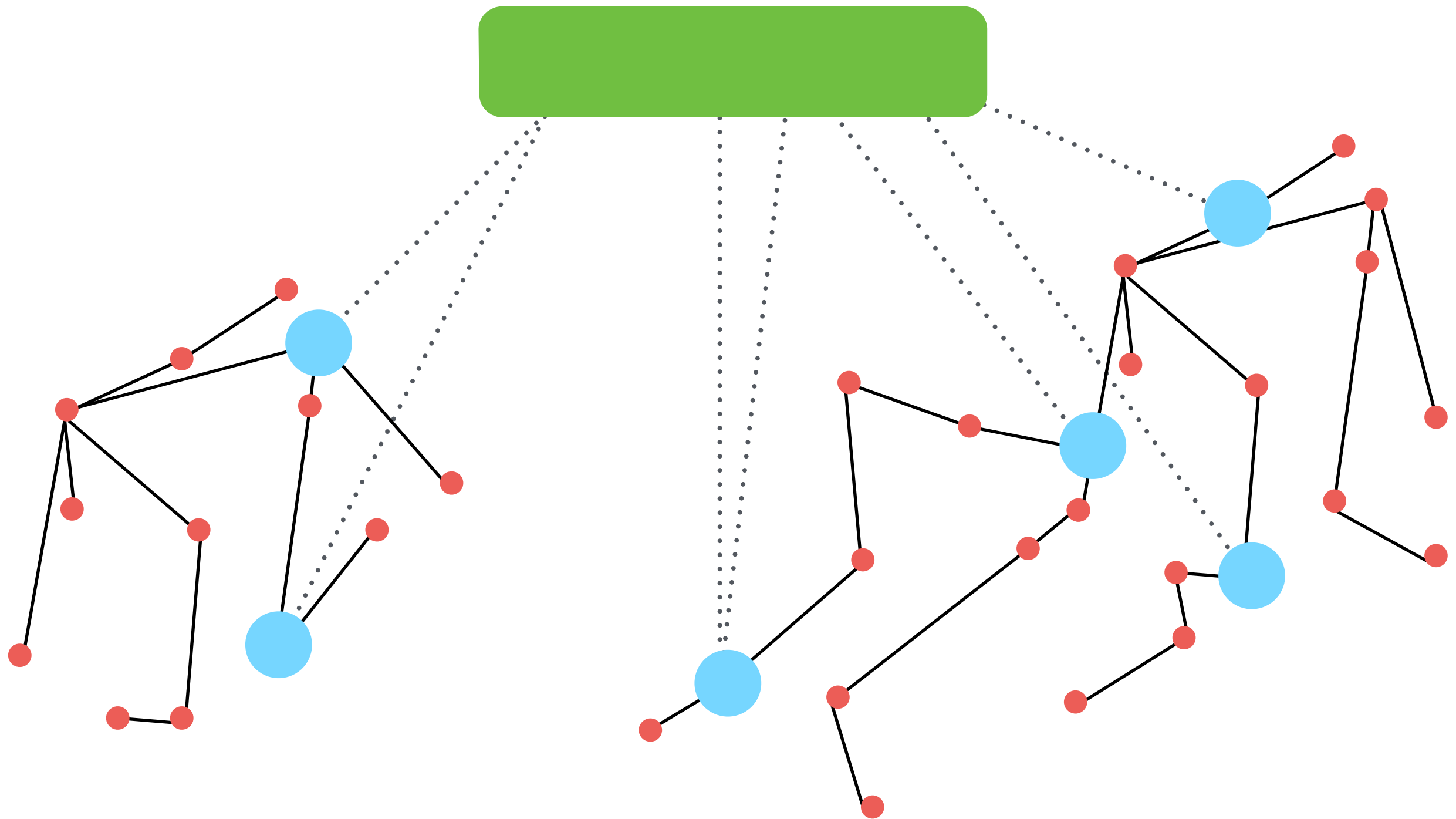
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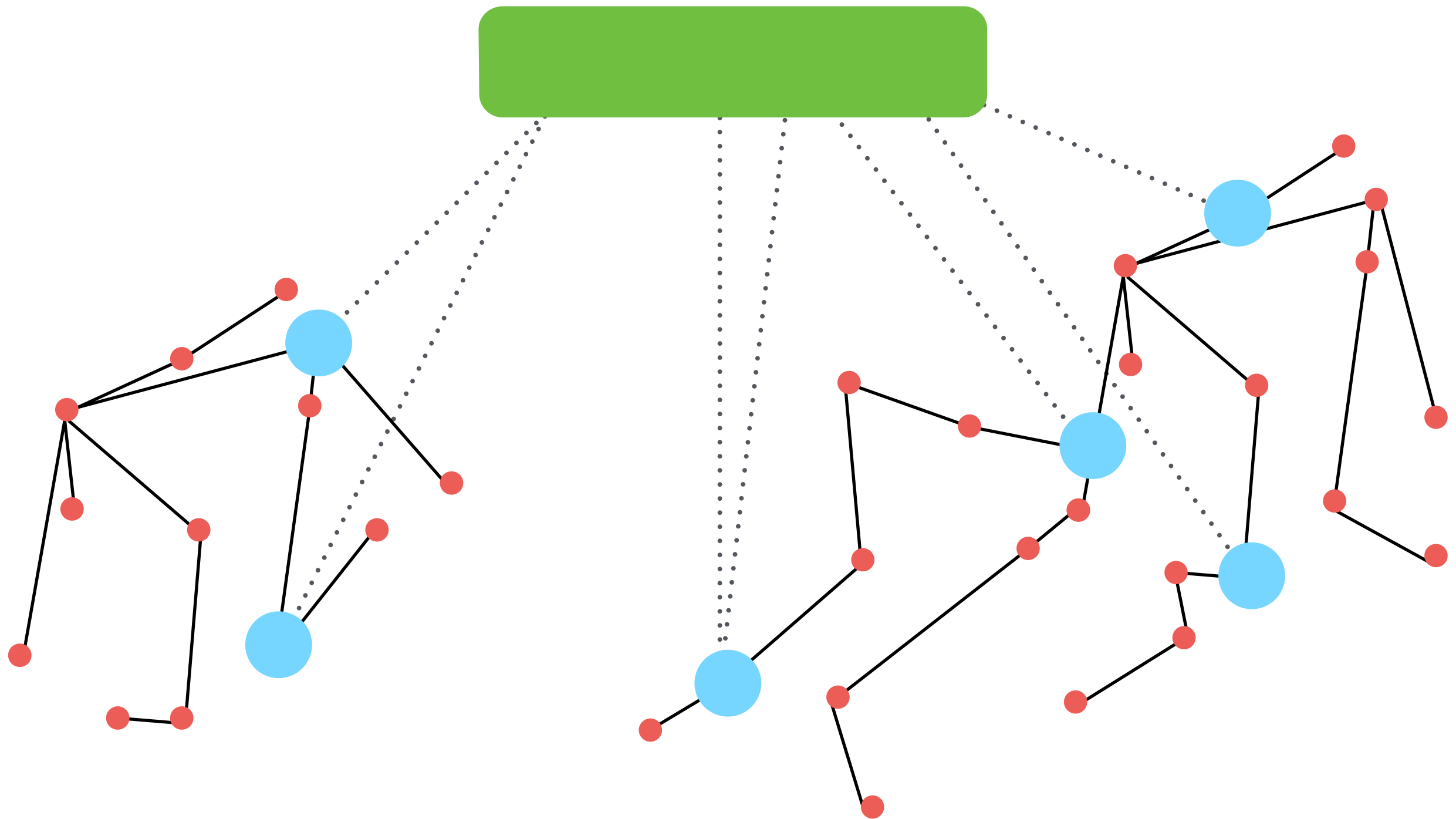
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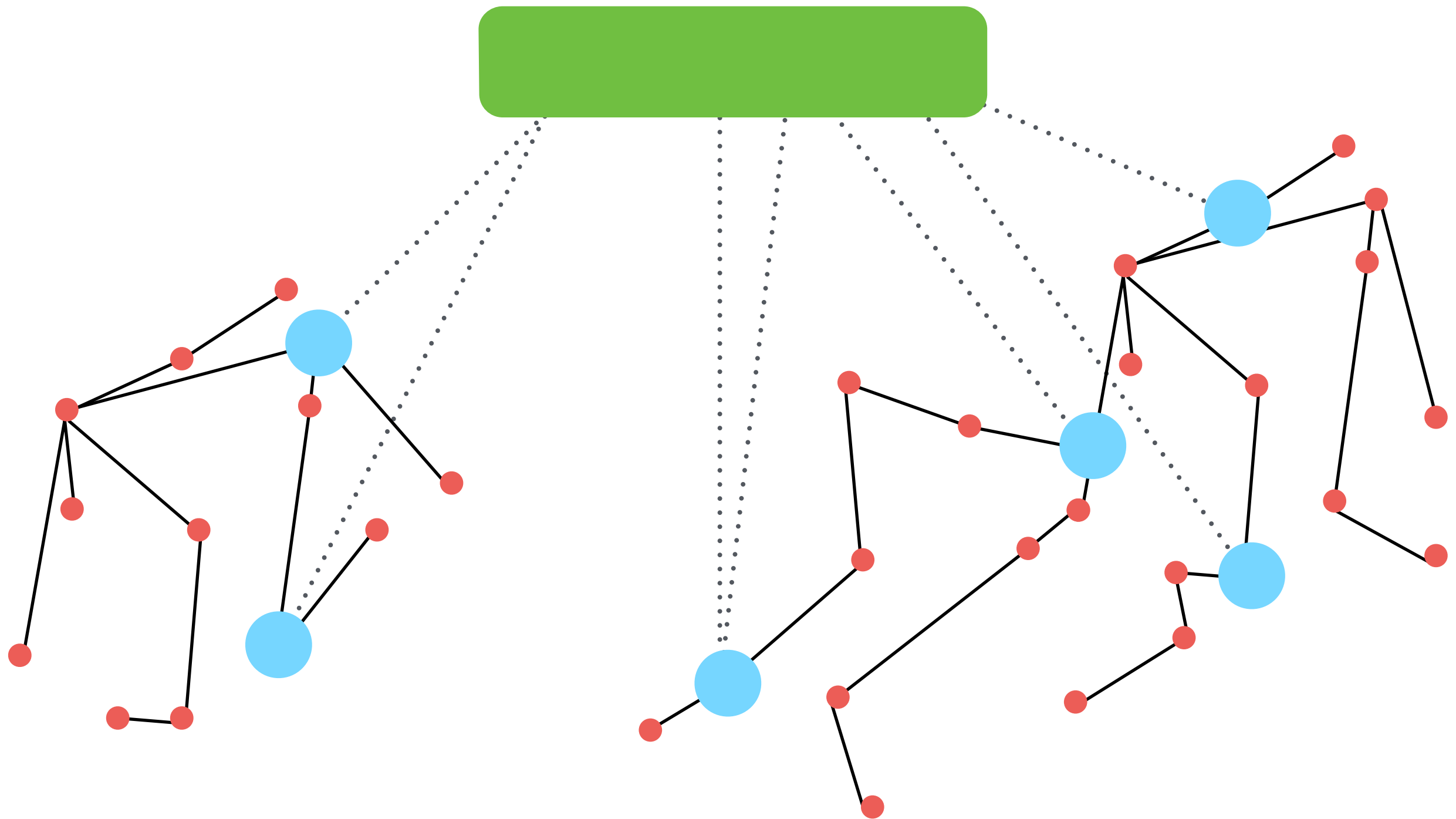
In this scenario, a randomly chosen edge will be **good with constant probability!**



Bad scenario: **one of the pieces is large.**



These pieces have **simple structure** and **bounded interaction** with the outer world.



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Such pieces are called "**protrusions**".

A Boundary of Constant Size



Constant Treewidth

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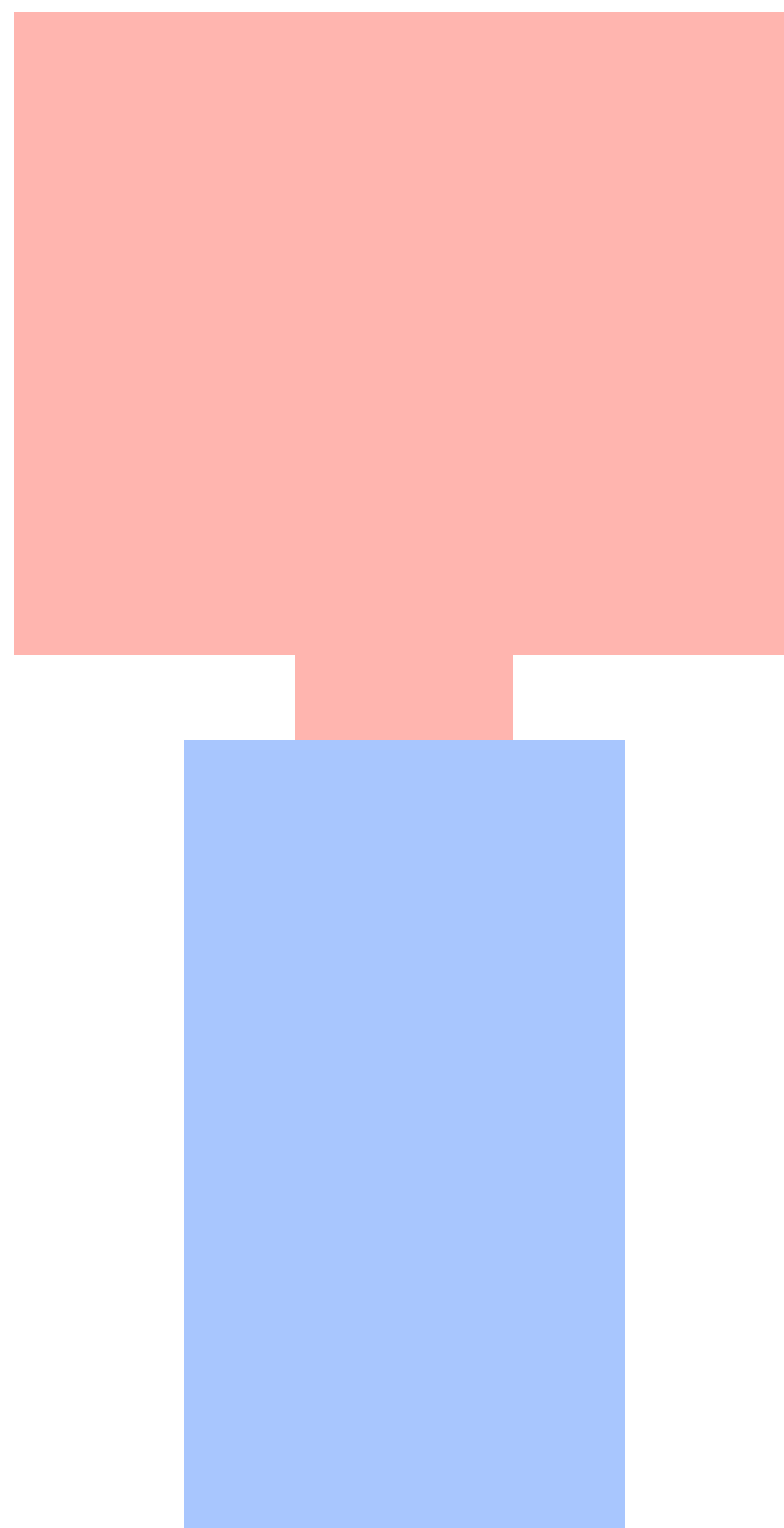
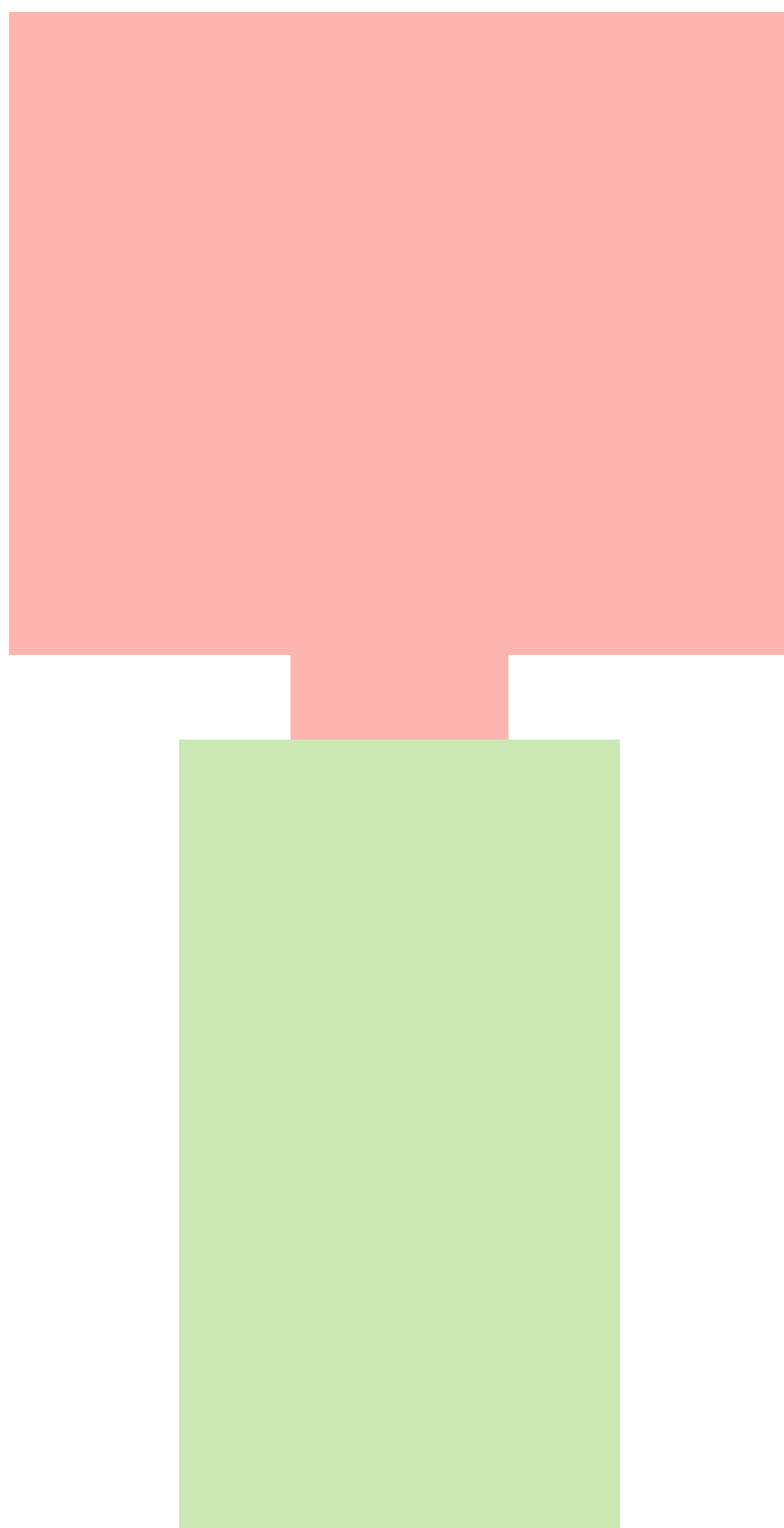
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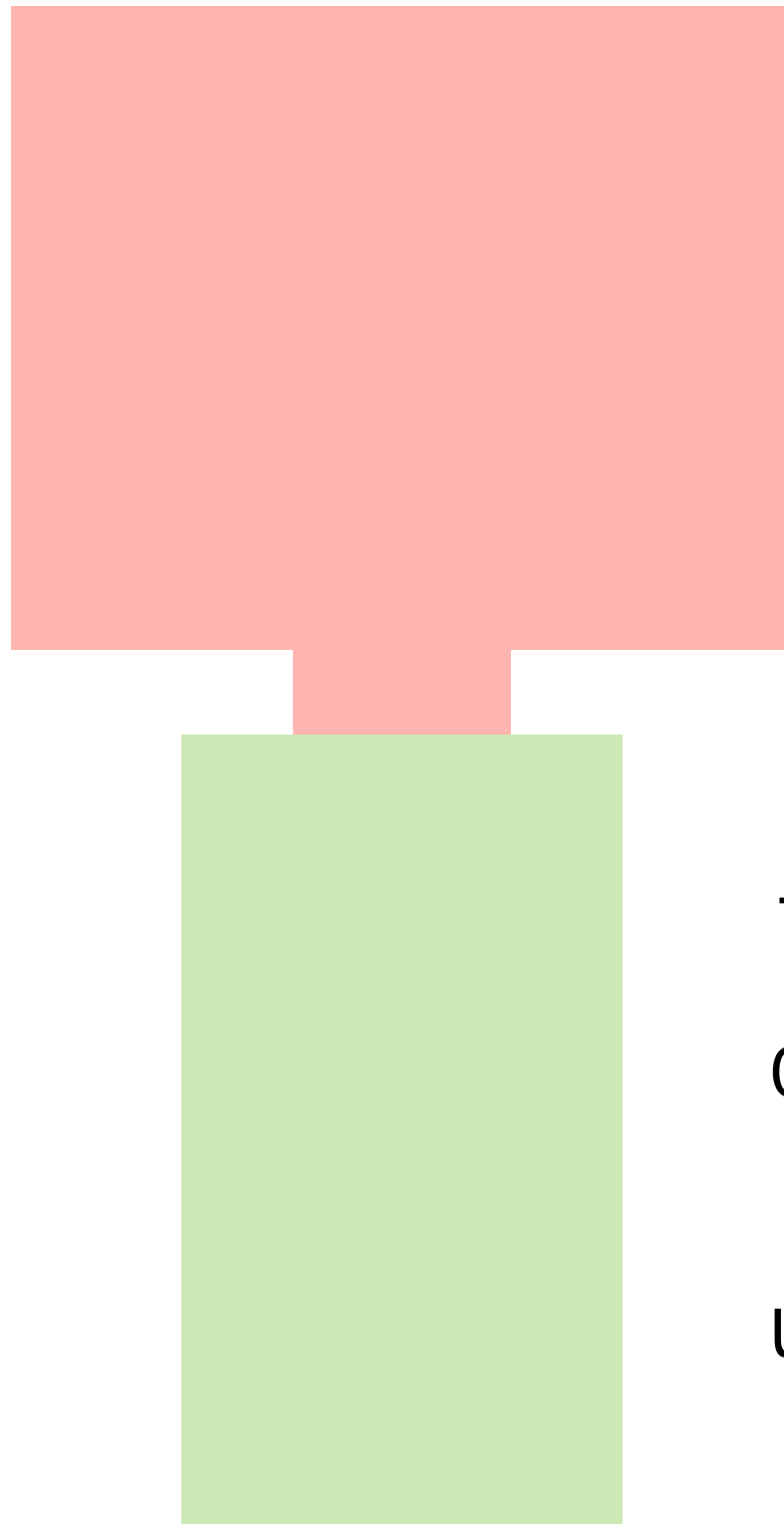




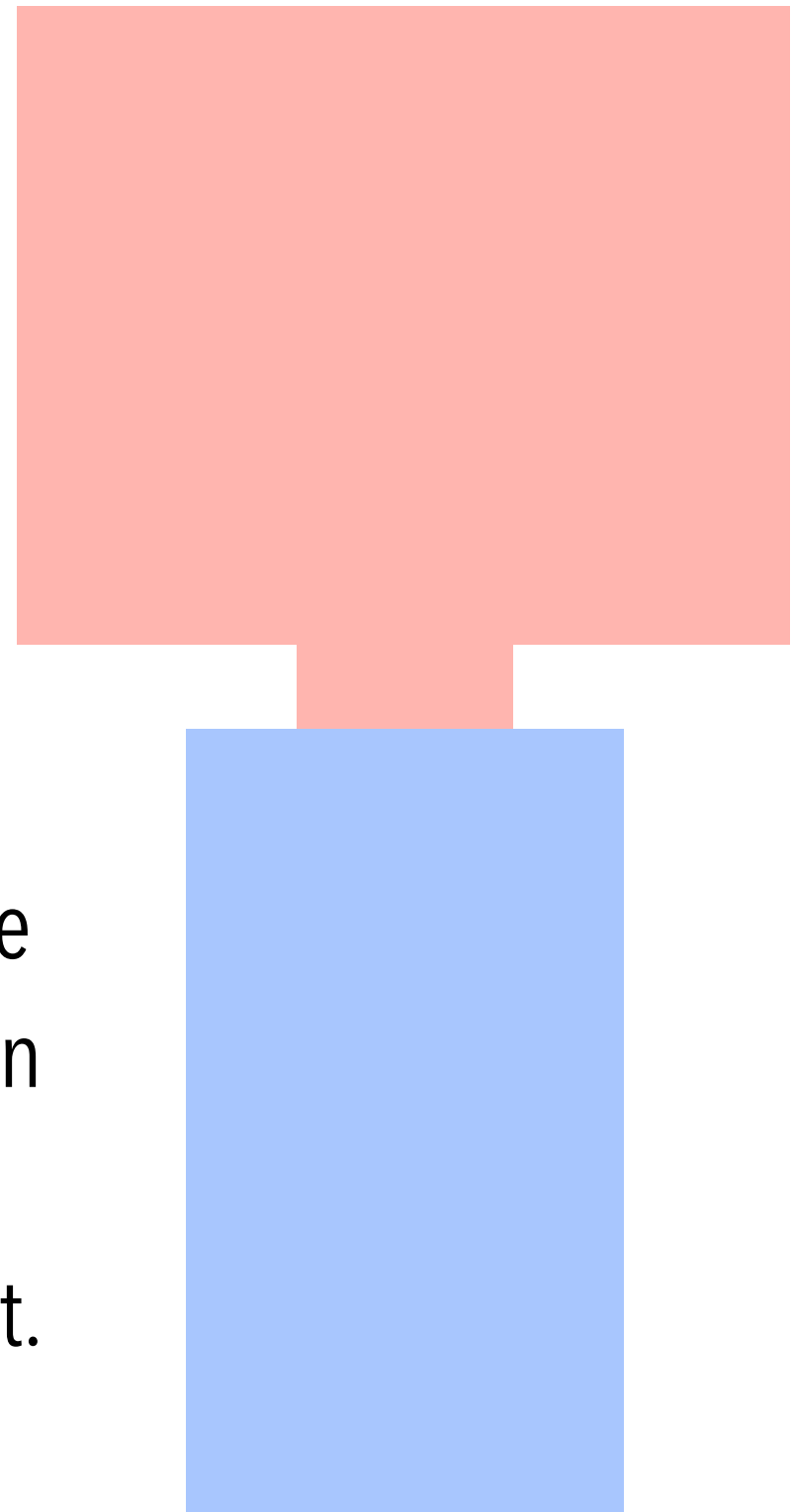
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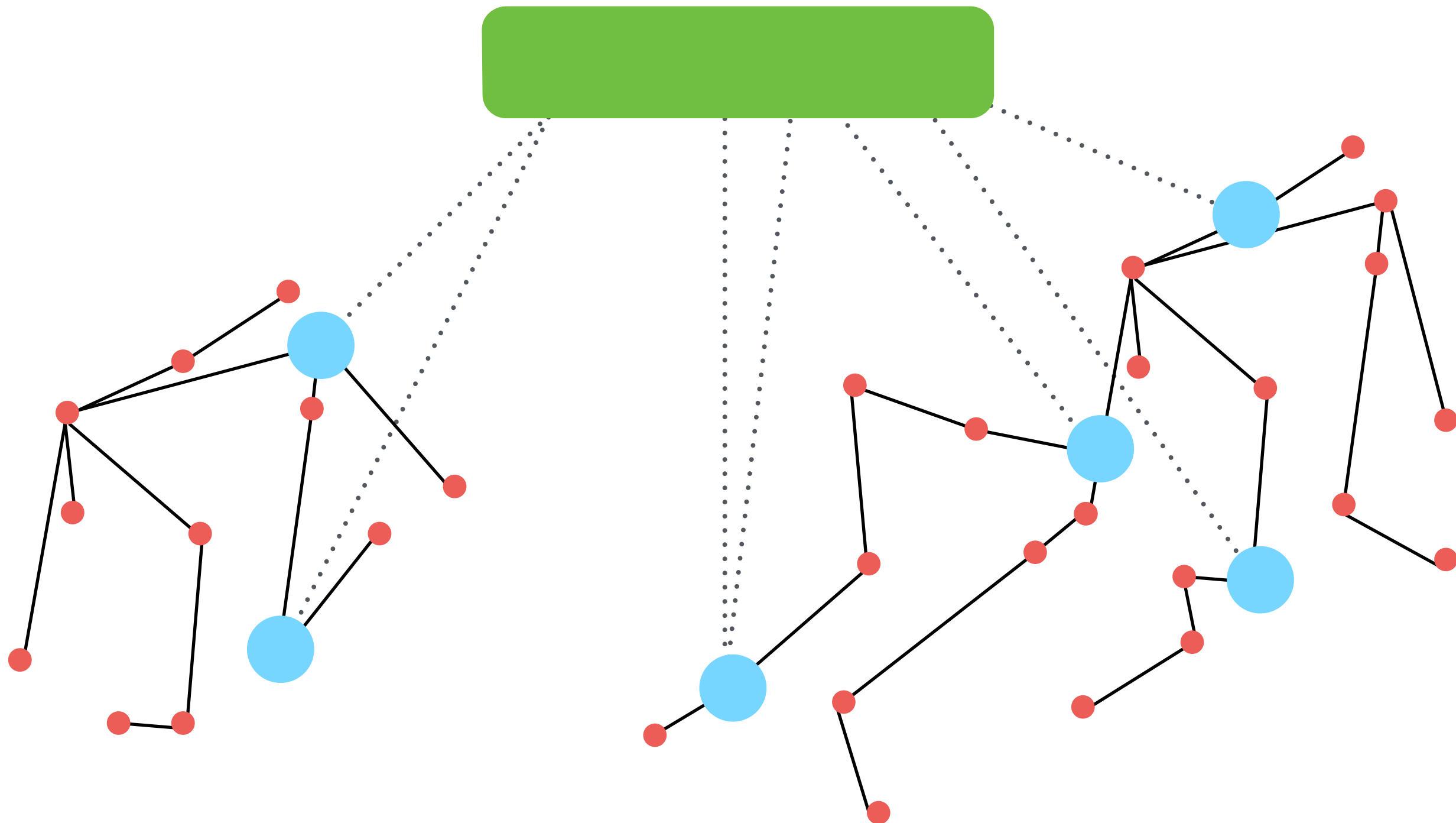
The value of the
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is the same
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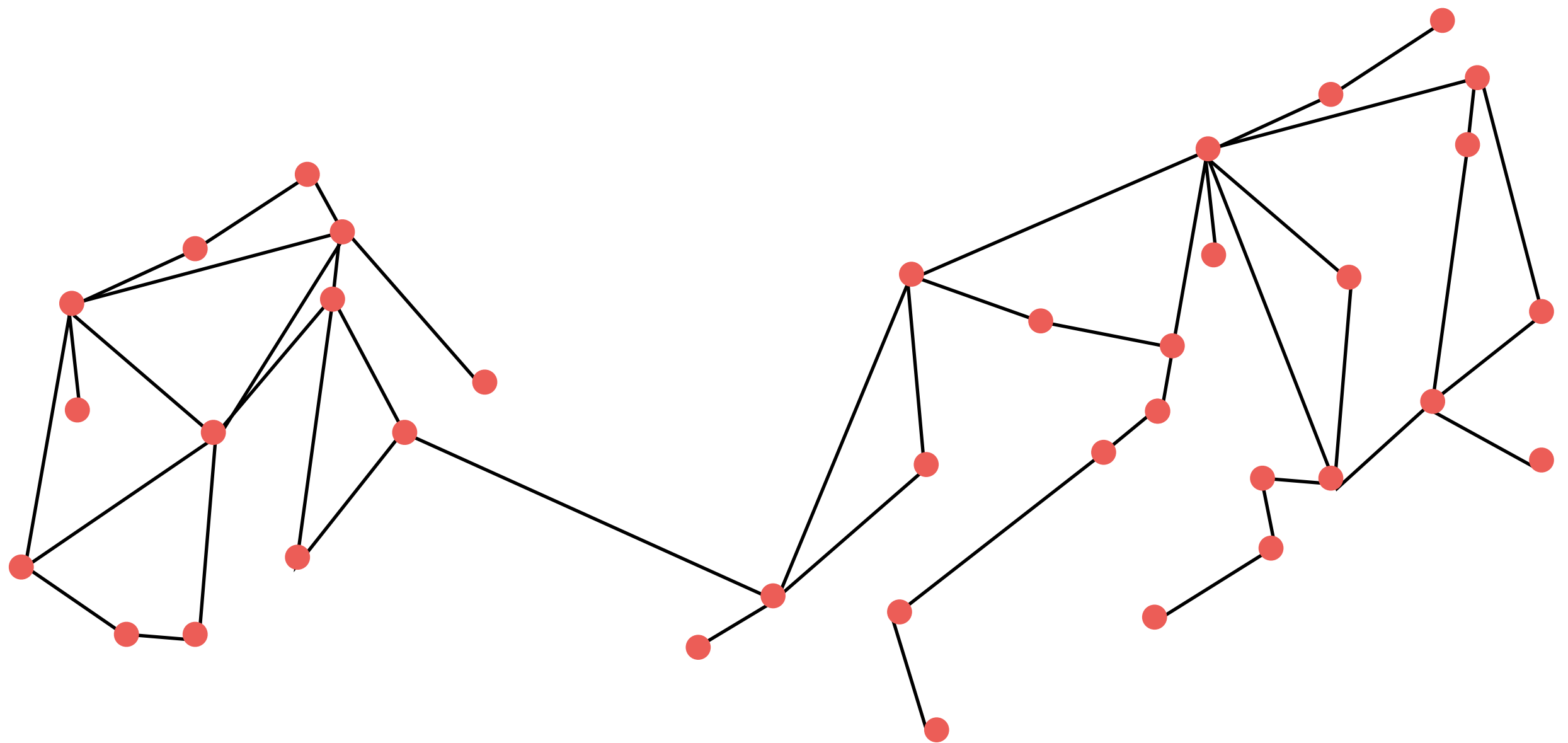


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For some problems,
the number of equivalence classes is **finite**,
allowing us to replace protrusions in graphs.





Finding protrusions? What do we replace them with?

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\mathcal{F}

K_2

Vertex Cover

K_3

Feedback Vertex Set

$((k+1)\text{-by-}(k+1))$ Grids

Treewidth k

$K_{2,3}, K_4$

Outerplanar

K_4

Series-Parallel

K_3, T_2

Pathwidth-One

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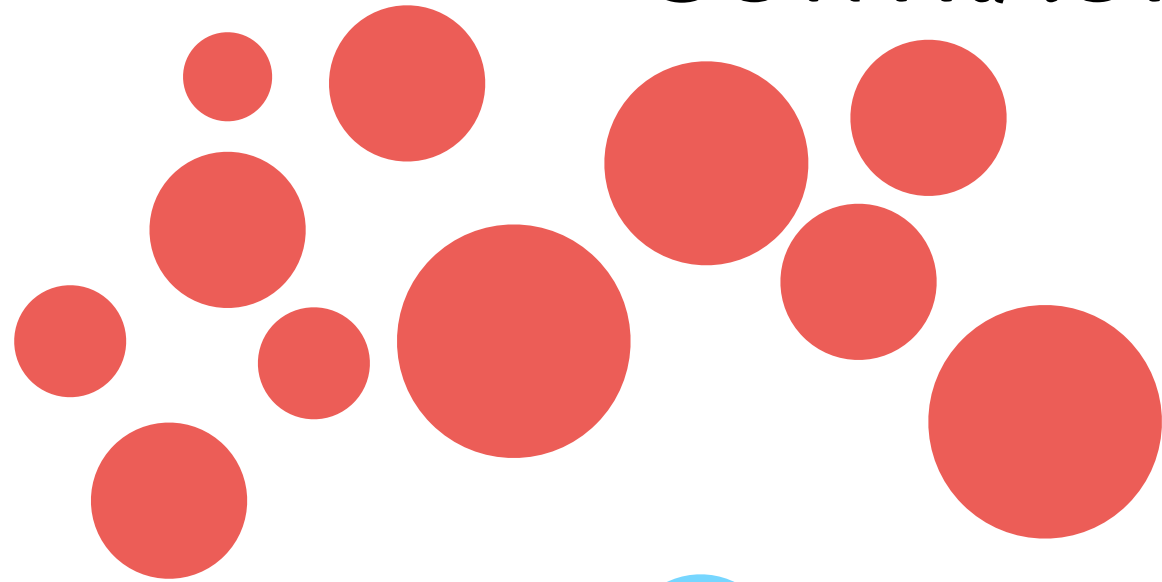
The question of kernels is **completely open**.

GRAPH MODIFICATION PROBLEMS

When the operation induces hardness

CONTRACTION PROBLEMS

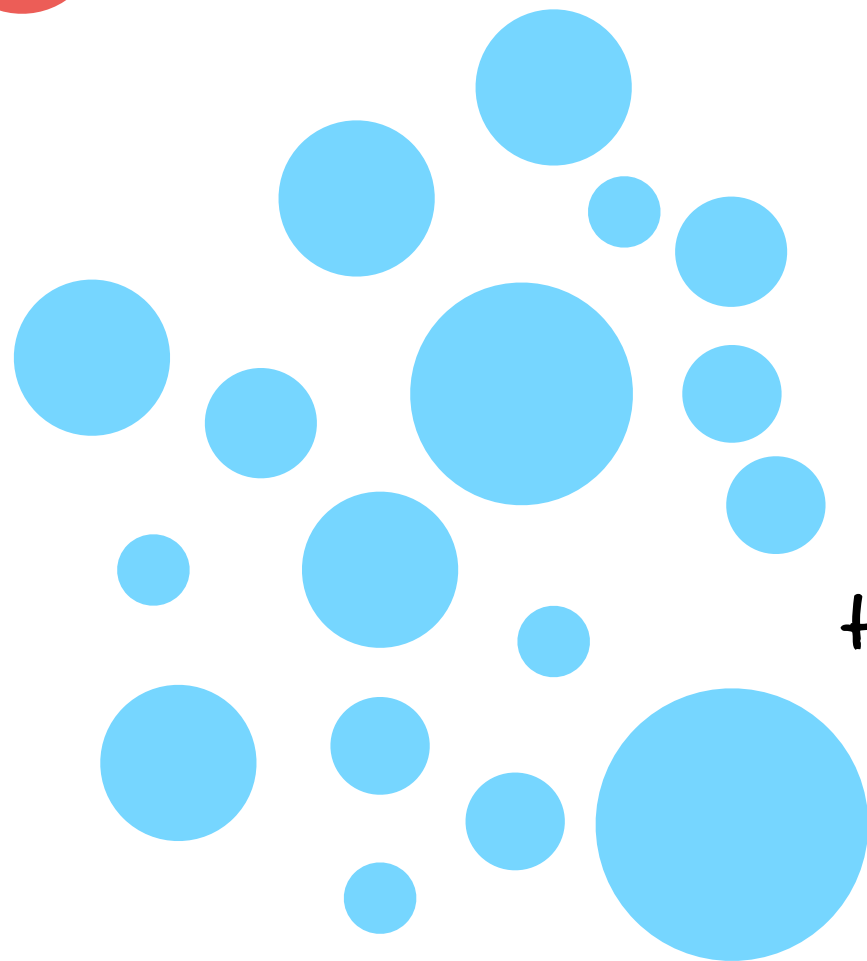
CONTRACTION PROBLEMS



Forbidden Subgraph Characterization

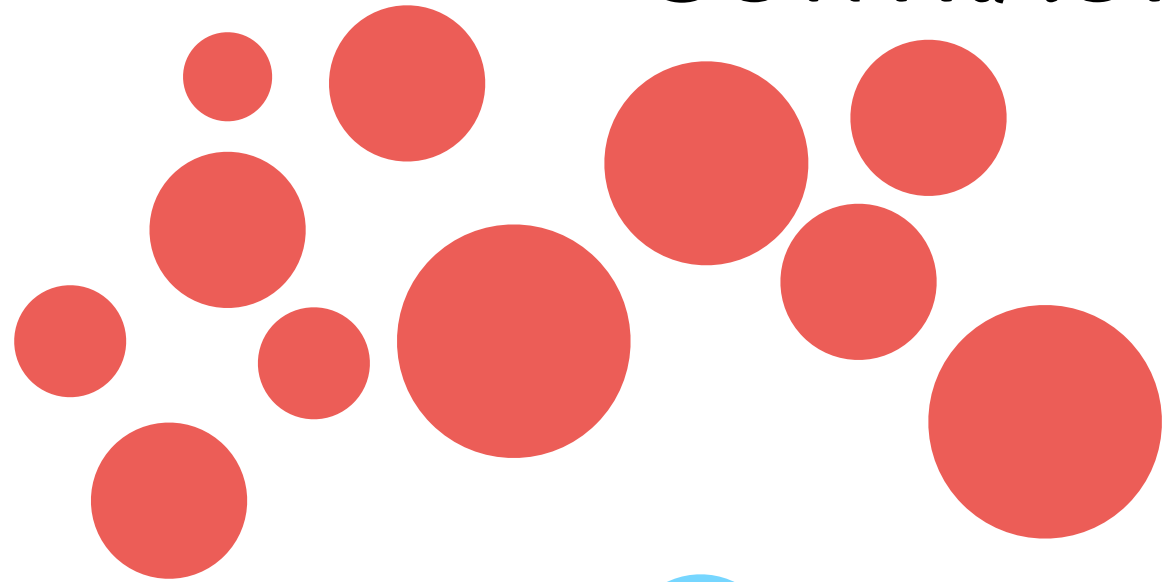
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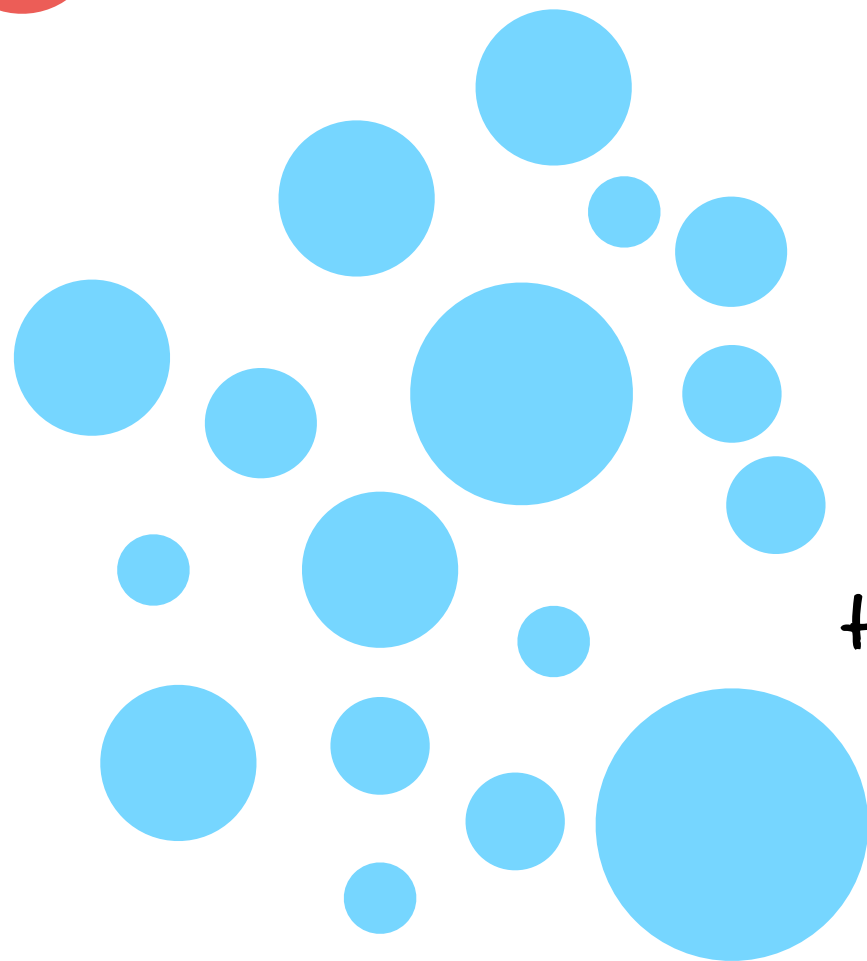


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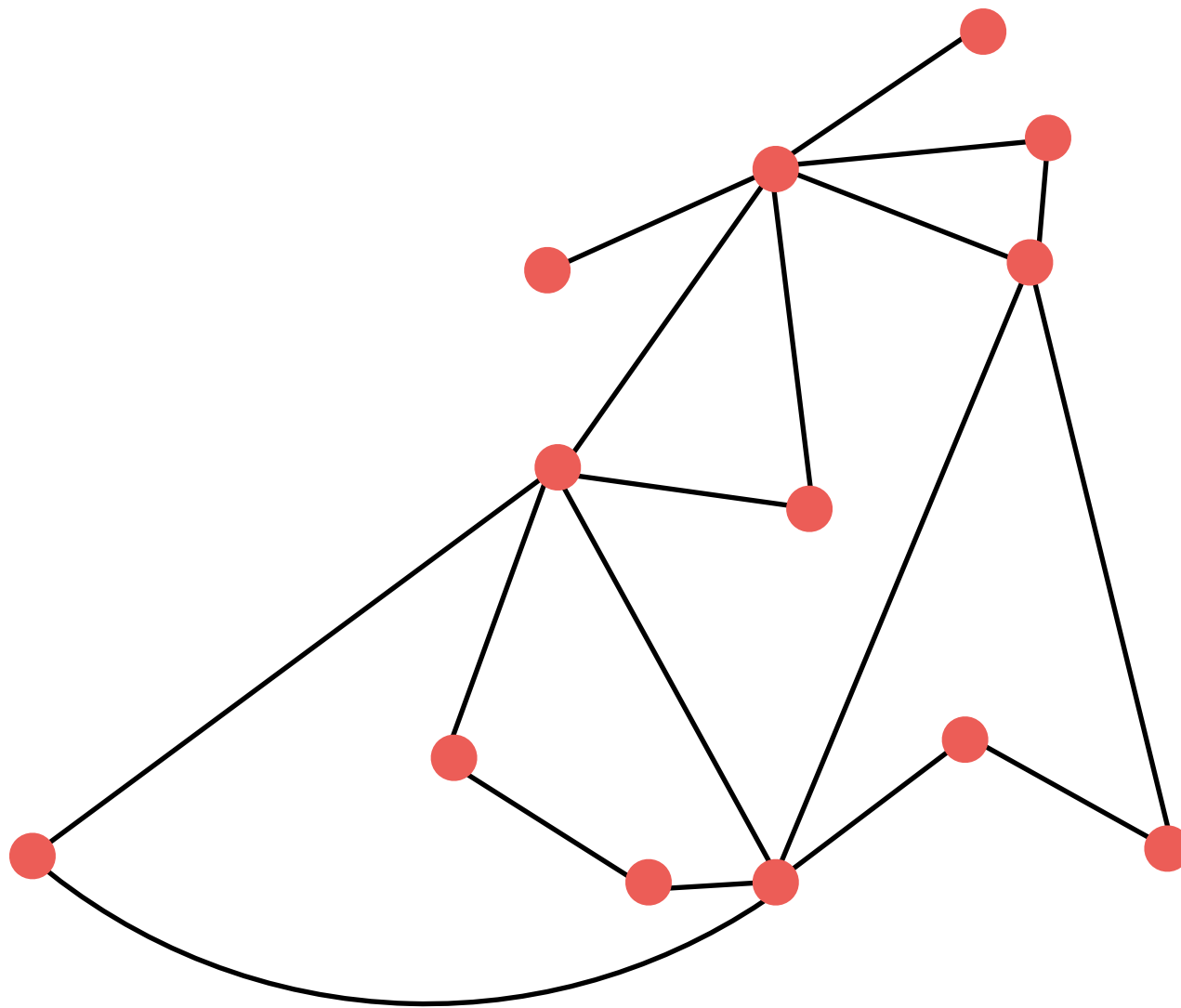
Not true any more!



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CONTRACTION TO C_4 -FREE GRAPHS

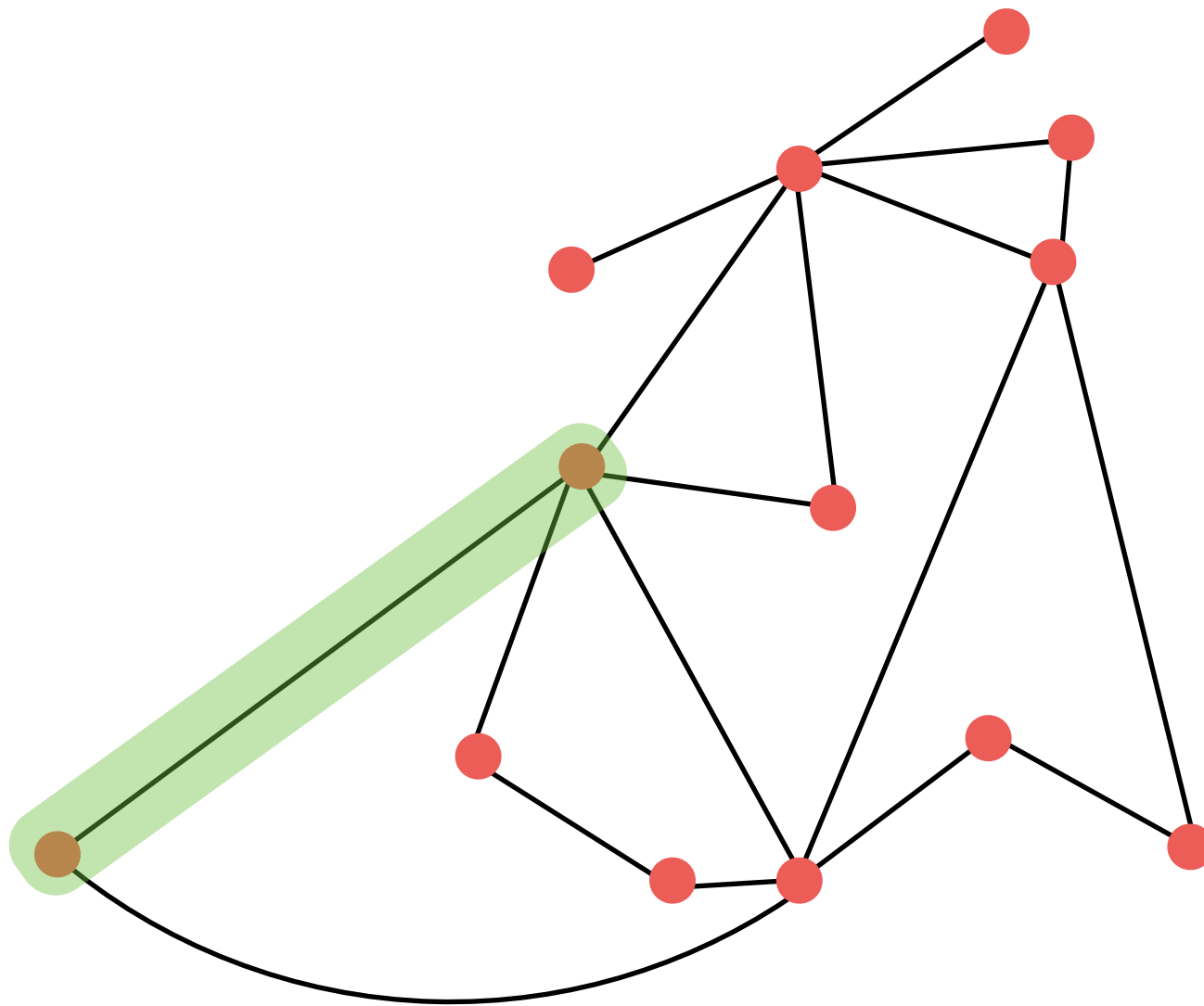
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Contracting to paths is **FPT** and has a **linear-vertex kernel**; while
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GRAPH MODIFICATION PROBLEMS

Completion

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GRAPH MODIFICATION PROBLEMS

A Summary

Edge Deletions

Kernels on Planar Graphs & the Meta-Kernel project

Special Graph Classes, eg, Feedback Arc Set on Tournaments

Connectivity Augmentation

The descriptive complexity of graph modification

Structural parameters and other objective functions

Backdoor Sets!

