

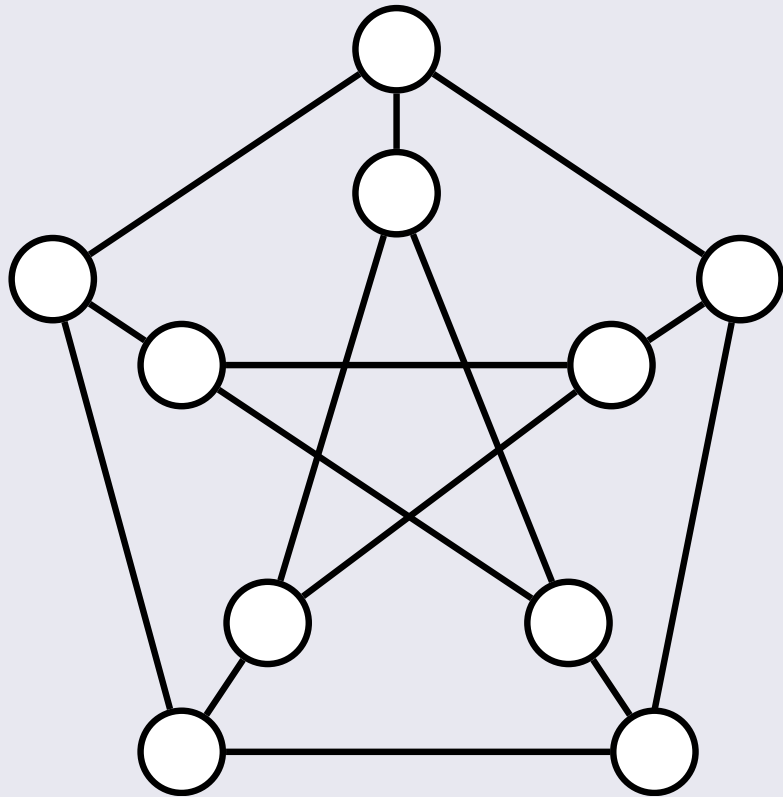
Finer Tight Bounds for Coloring on Clique-width

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LAMSADE
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ICALP 2018

Coloring



Input:

Graph $G = (V, E)$

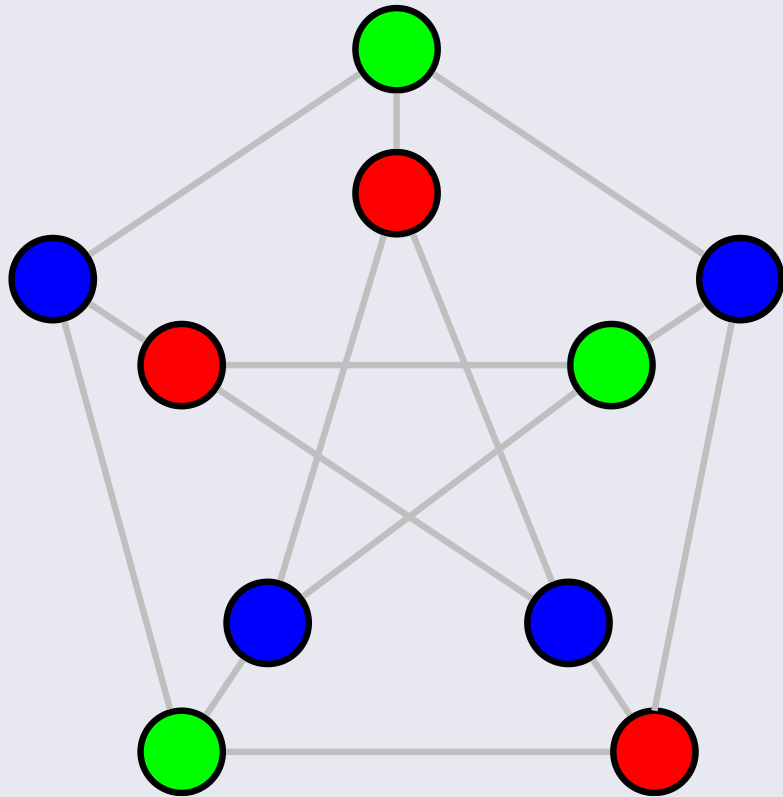
n vertices

k colors

Question:

Can we partition V into k independent sets?

Coloring



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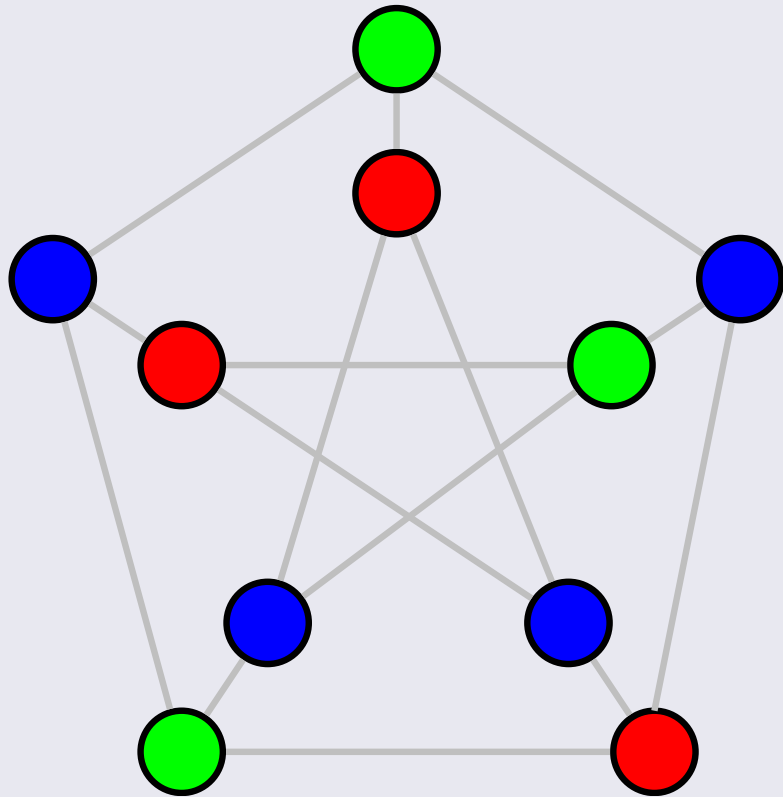
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k colors

Question:

Can we partition V into k independent sets?

Note: For the rest of this talk, k denotes the number of **colors**.

Problem NP-hard for any $k \geq 3$:

We look at graphs with restricted structure.

Finer Tight Bounds?

- What is a “finer” tight bound?



Finer Tight Bounds?

- Tight bound: complexity-theoretic bound that “matches” running time of **existing** algorithm.
- Finer bounds:
 - Increased “granularity”.
 - More precise about secondary parameters.

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- We know the “correct” complexity of Coloring for clique-width
 - $\dots \approx k^{2^w}$ (more details in a bit)
- This bound is only tight for k **sufficiently large**.
- What is the **exact** complexity of 3-coloring, 4-coloring for clique-width?

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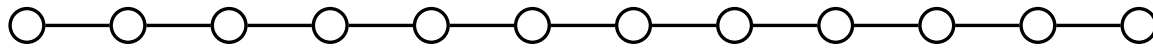
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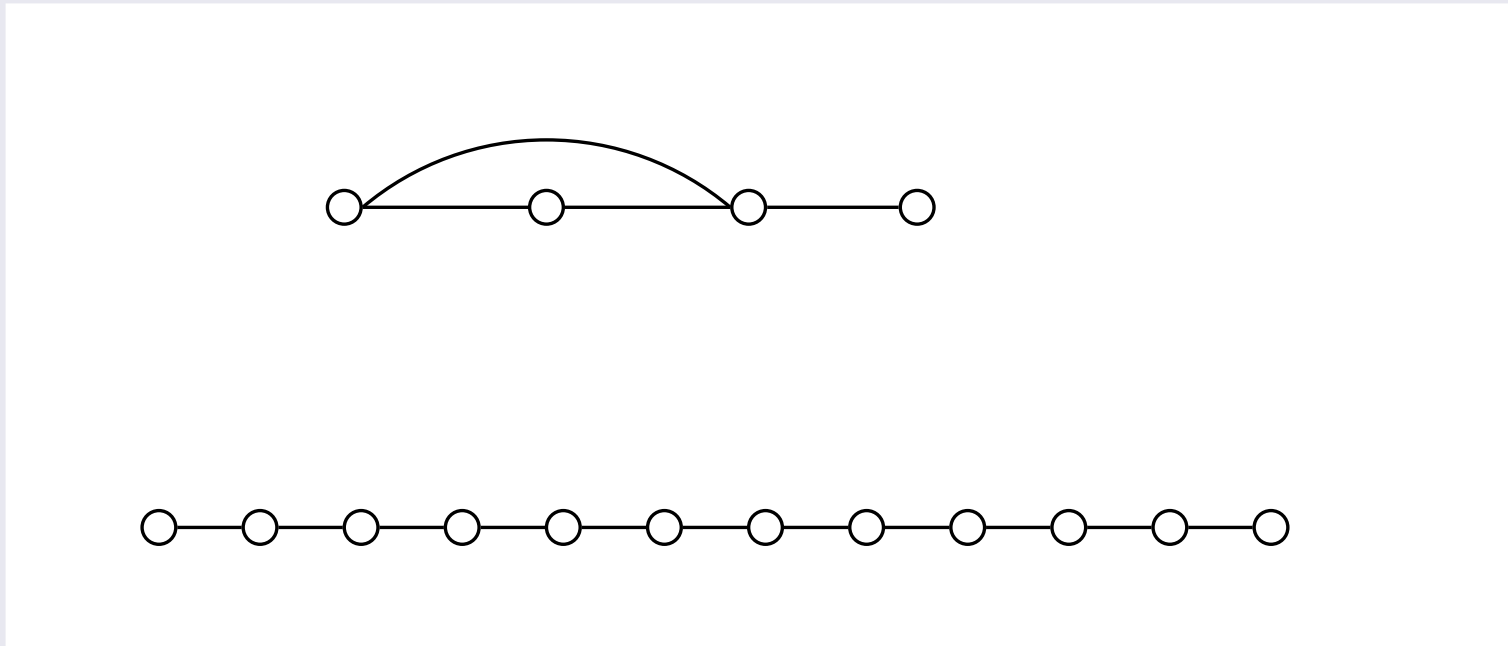
The story so far: Treewidth



Consider this (**very very special**) class of graphs of treewidth w :

- The graph consists of a long path

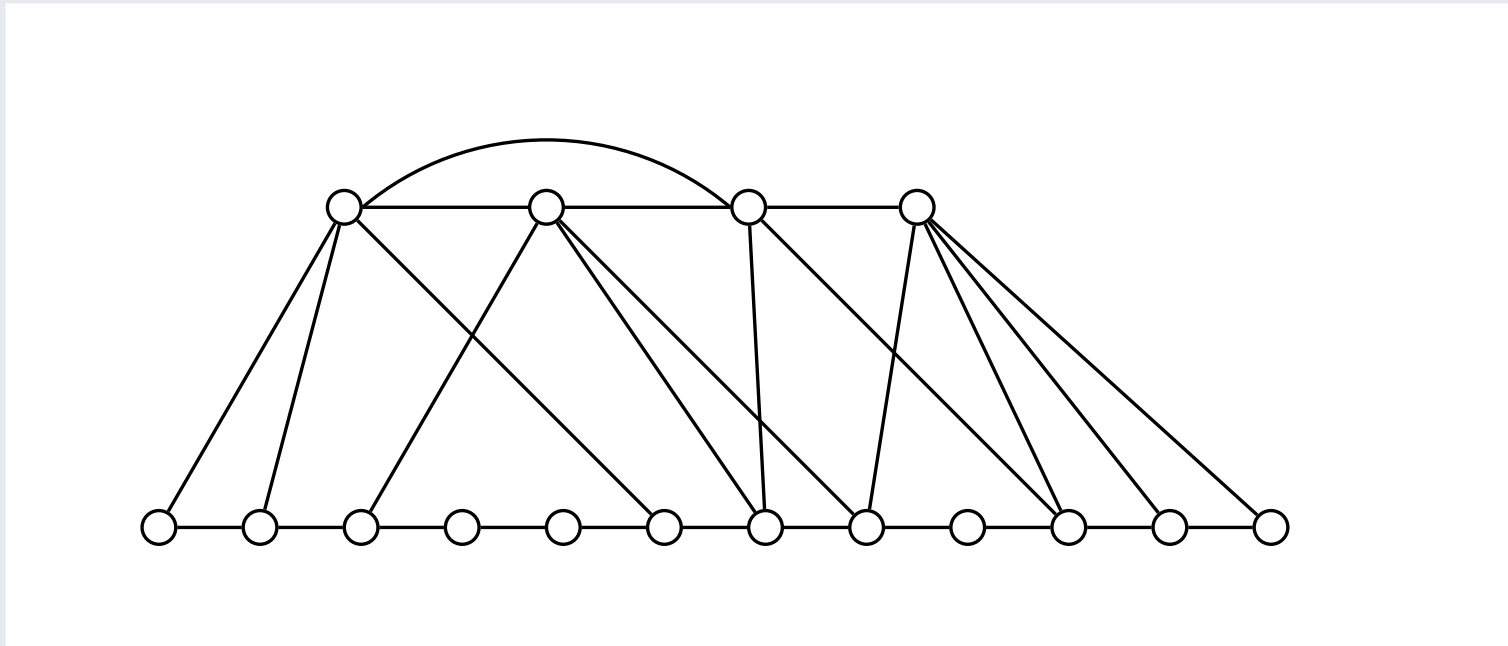
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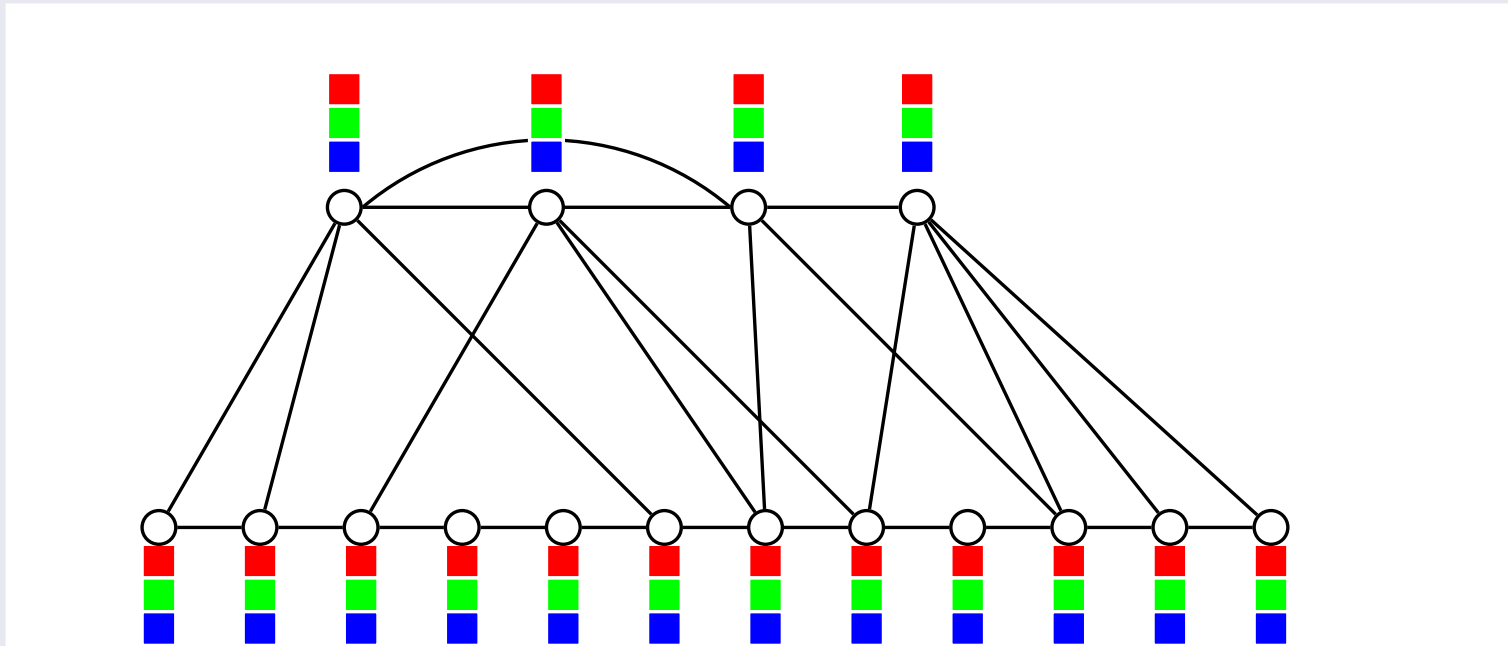


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- w extra vertices, arbitrarily connected to each other
- and arbitrary edges between these two parts

Interesting case: $w \ll n$.

The story so far: Treewidth



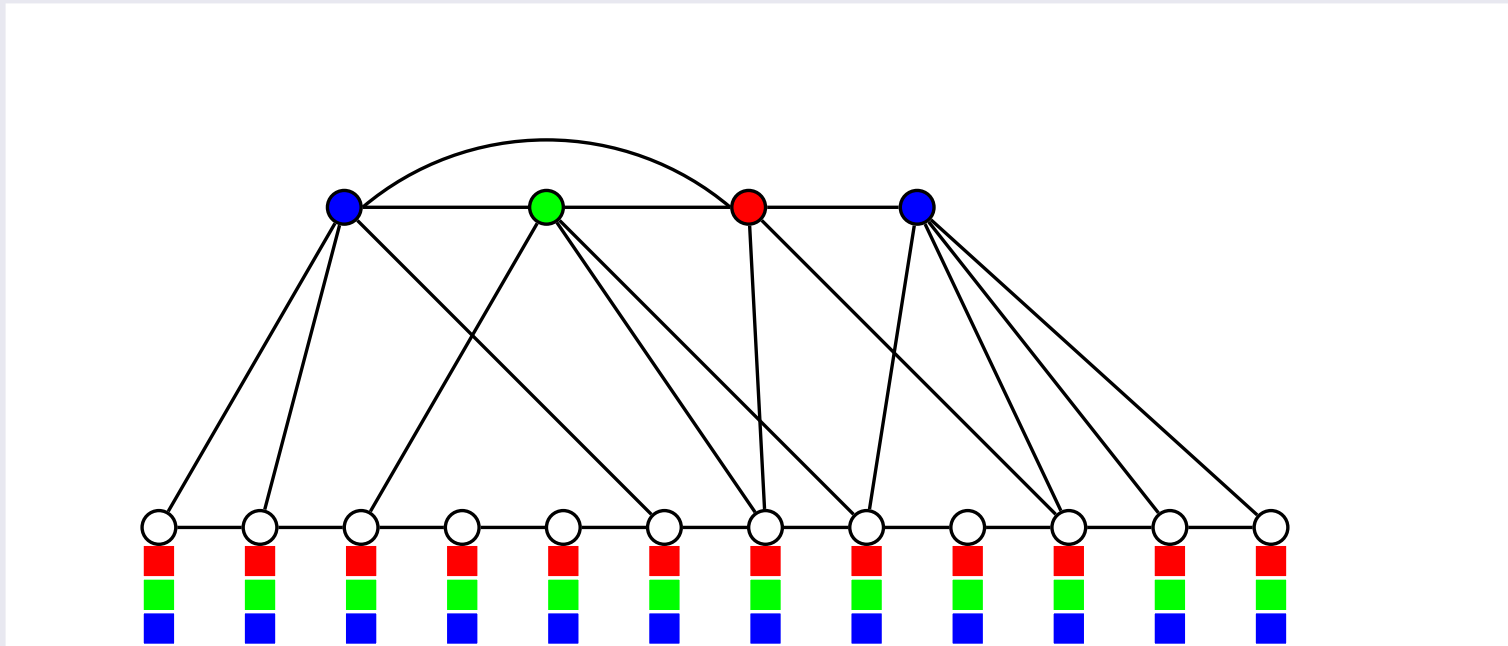
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3-Coloring algorithm on these graphs:

- Guess a valid coloring of the w non-path vertices
- Try to extend it to a coloring of the whole graph (easy!)

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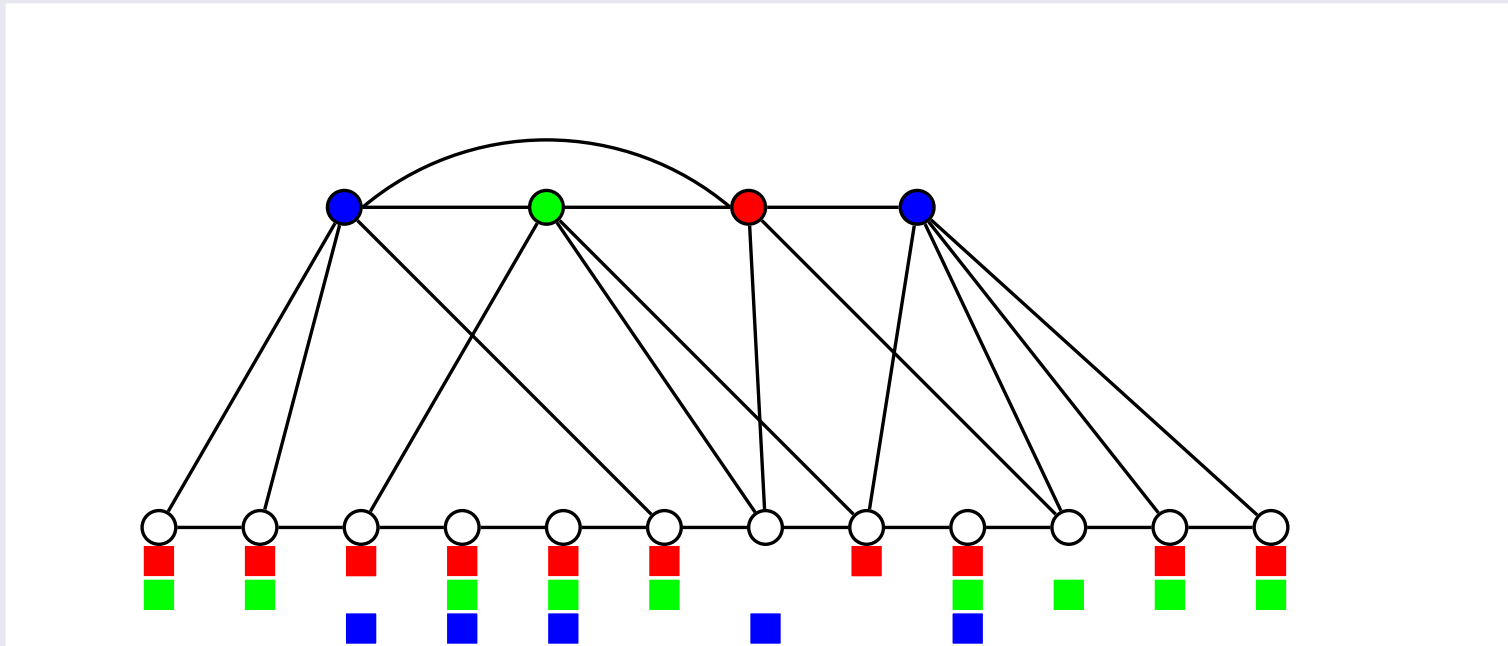
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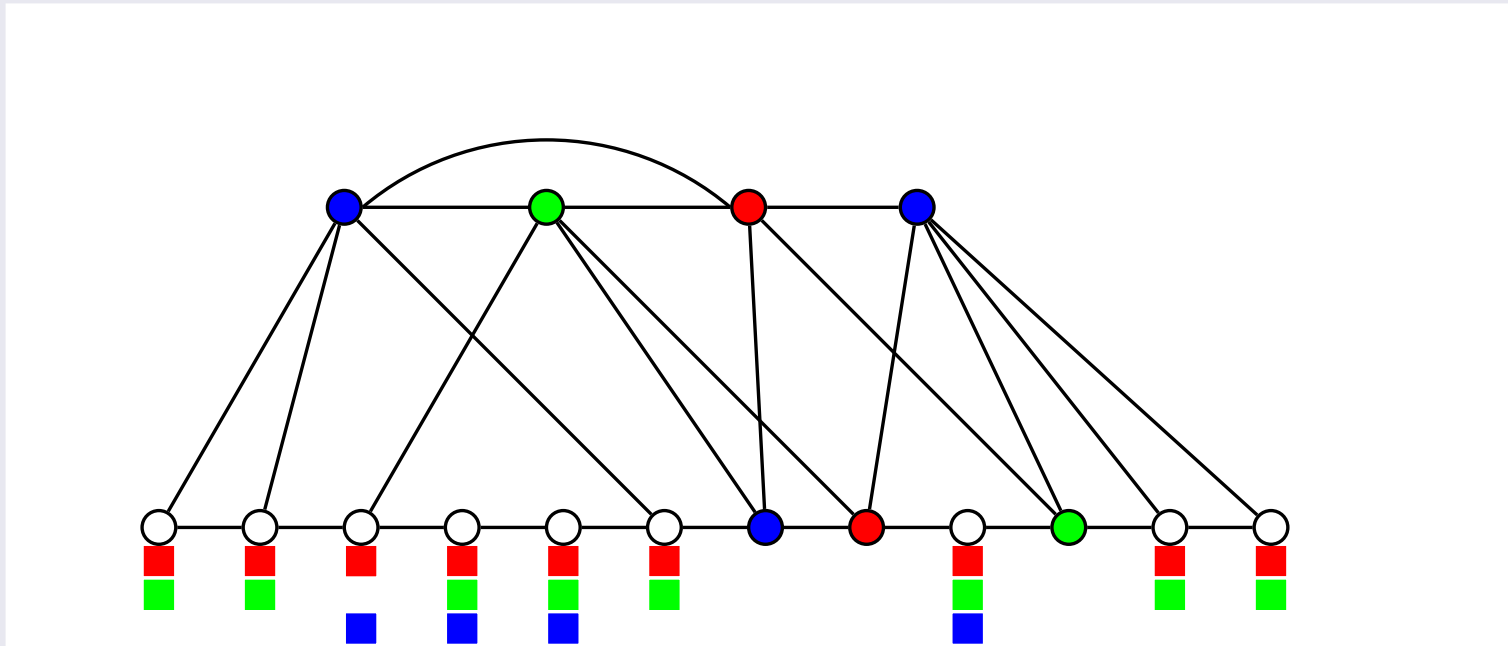
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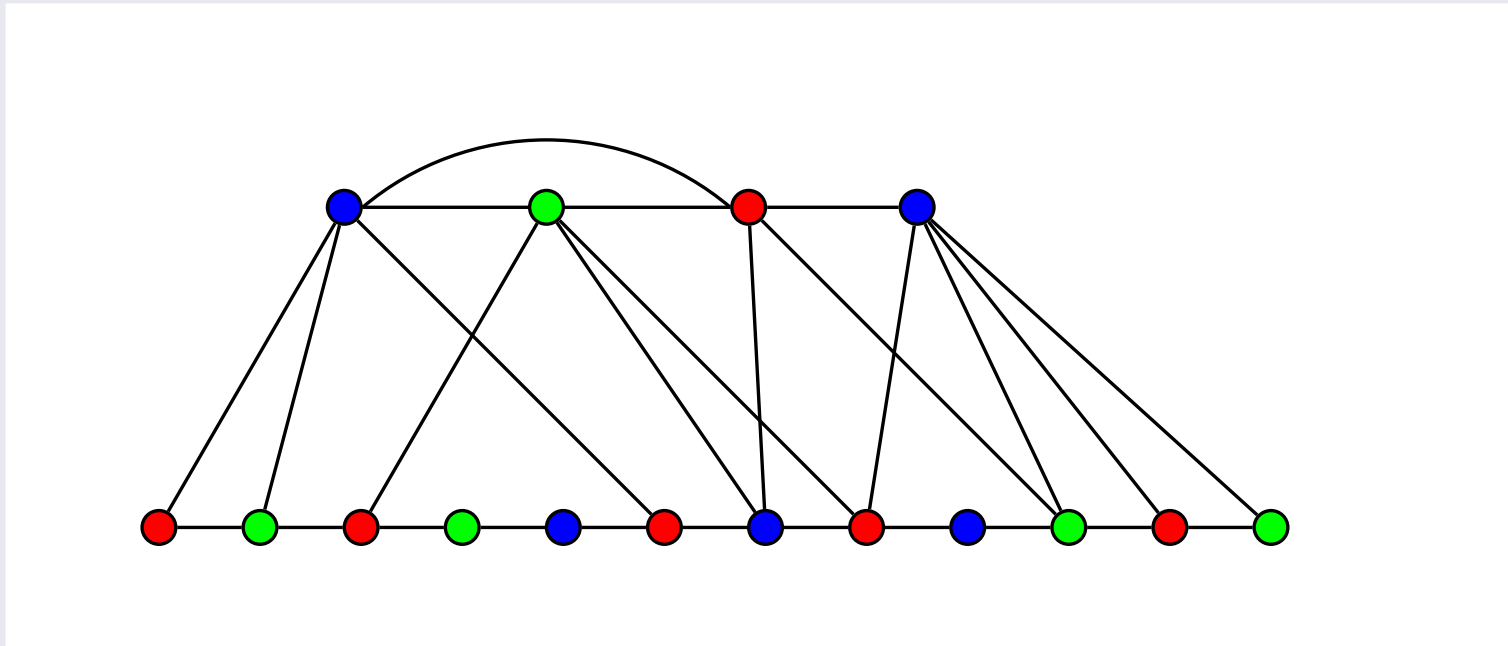
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- Try to extend it to a coloring of the whole graph (easy!)
- Either found a valid coloring, or try another coloring for w vertices.

Running time: 3^w

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- Graphs of treewidth w are **much more general** than the graphs of the previous slide.
 - Algorithm generalizes easily (DP)
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Previous Work:

- Lokshtanov, Marx, Saurabh, SODA'11
- Jaffke and Jansen, CIAC '17

Result:

(SETH) \rightarrow cannot do $(k - \epsilon)^w$, **for any** k, ϵ , even for Paths+ w !

Very **fine**, completely **tight** bound!

Note: SETH \approx SAT has no 1.999^n algorithm.

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The story so far: Clique-width

- Clique-width is the second most widely studied graph width.
 - Intuition: Treewidth + Some dense graphs.
 - Definition in next slide.

Summary of what is known for k -Coloring on graphs of clique-width w :

- Algorithm in $k^{2^{O(w)}}$ (Kobler and Rotics DAM '03)
- Algorithm in $4^{k \cdot w}$ (Kobler and Rotics DAM '03)
- W-hard parameterized by w (Fomin, Golovach, Lokshtanov, and Saurabh SICOMP '10)
- ETH LB of $n^{2^{o(w)}}$ (Golovach, Lokshtanov, Saurabh, Zehavi SODA'18)

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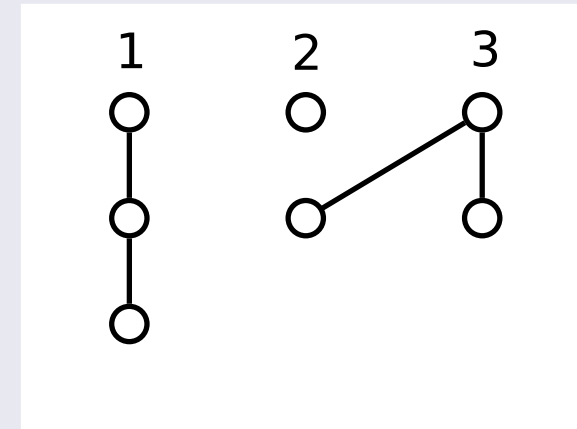
Remark: Last LB is tight (!), but requires k to be large (otherwise contradicts second algorithm)

Story not as clear as treewidth (yet)...

Clique-width: Definition and Intuition

Reminder of the inductive definition of clique-width:

- Each vertex is labelled with a label $\in \{1, \dots, w\}$.
- Base operation:
 - Construct single-vertex graph.
- Inductive operations:
 - Join (add all edges between two labels)
 - Rename (one label to another)
 - Disjoint Union



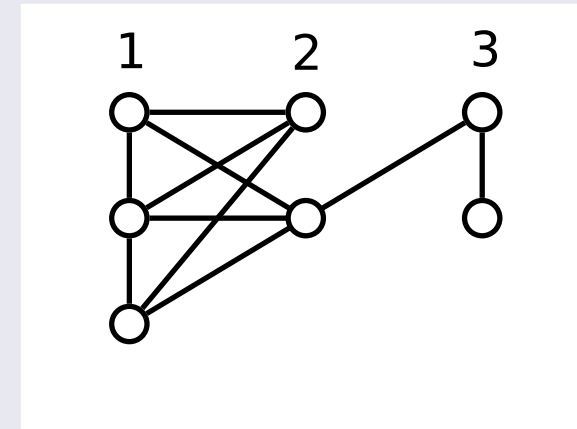
Intuition: Each label set is a **module** with respect to vertices that do not appear in the graph yet.

- Allows us to “forget” some information about what is happening inside a label set, do DP.

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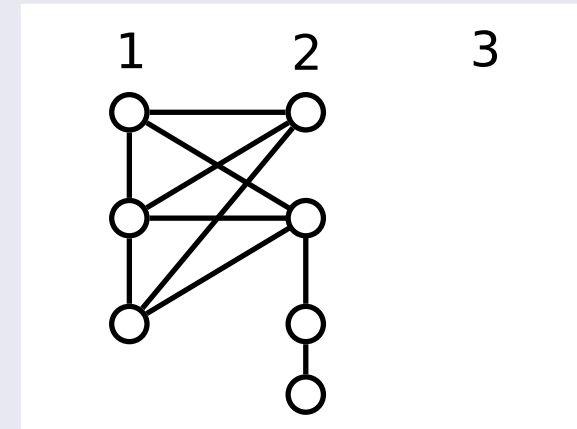
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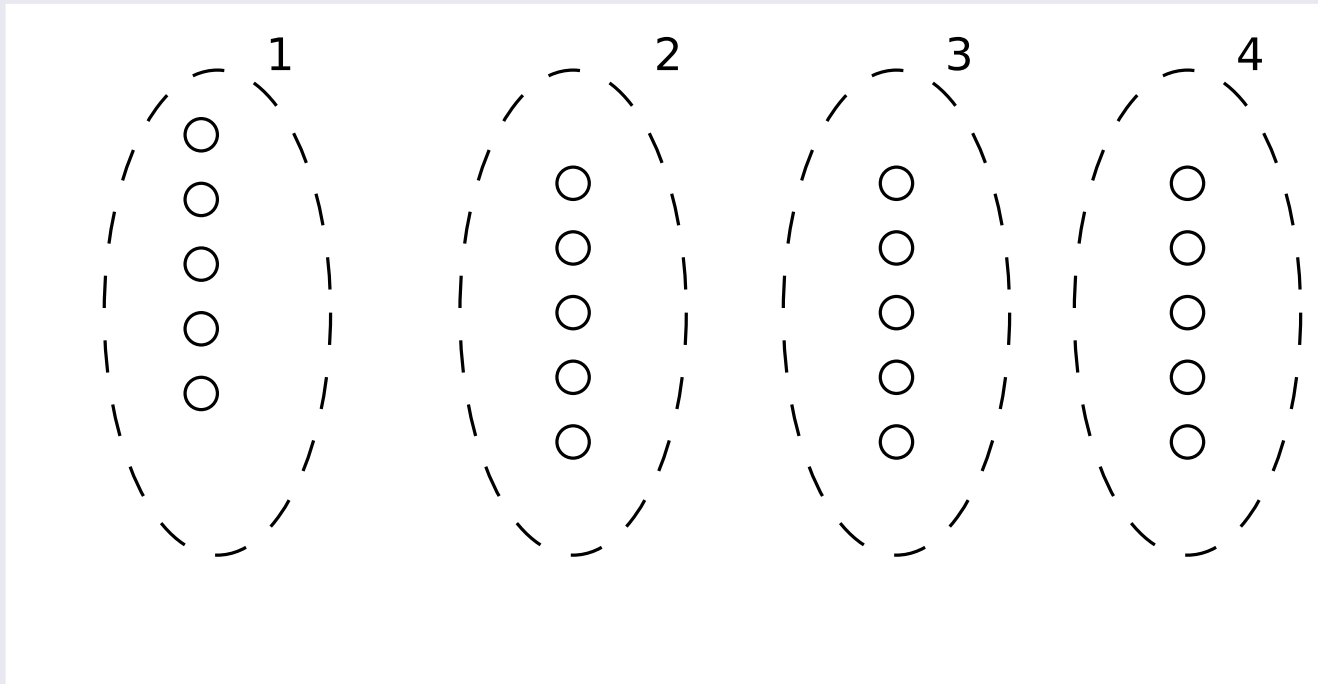
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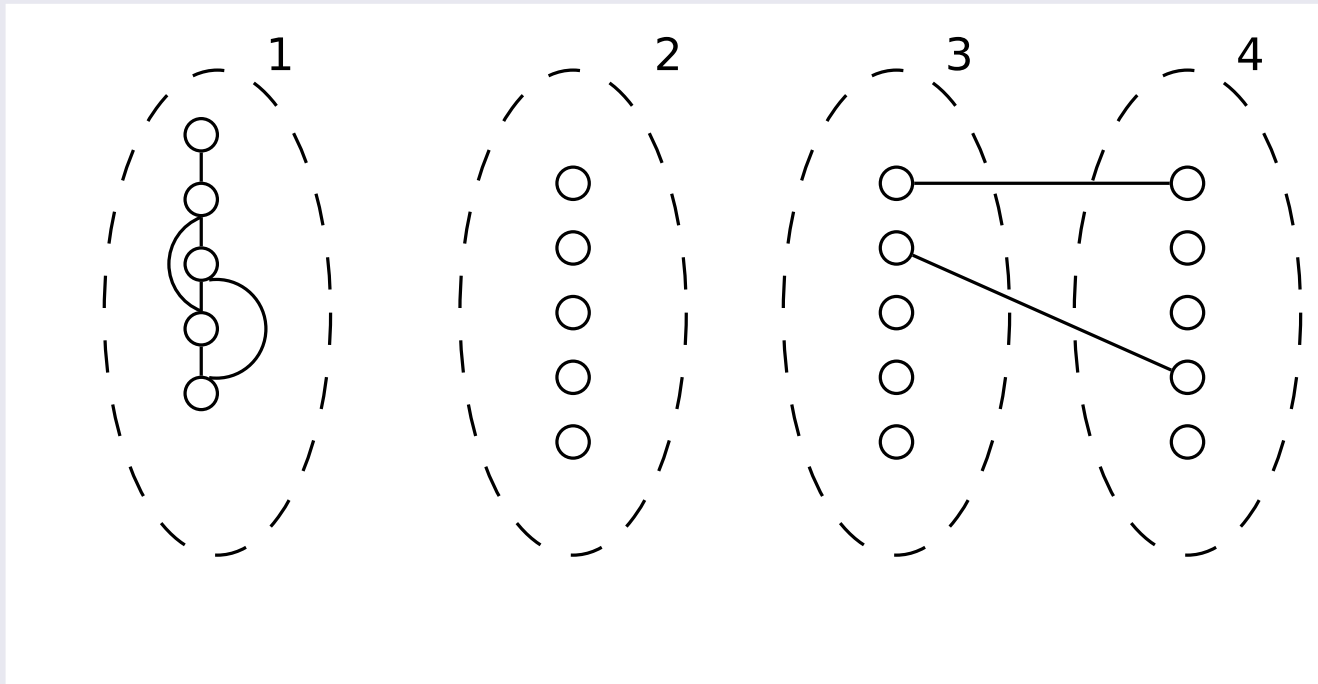
Clique-width: basic algorithm



We recall a basic DP algorithm:

- For every label we remember the **set** of colors used in this label set.

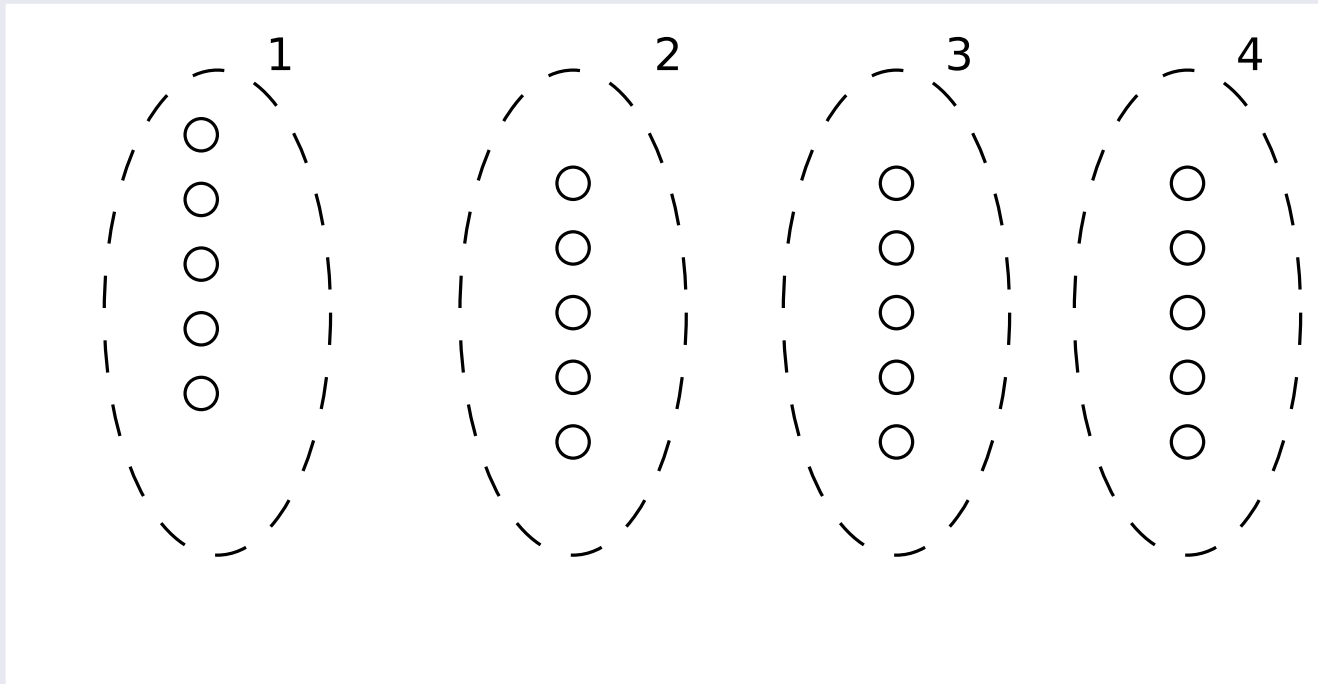
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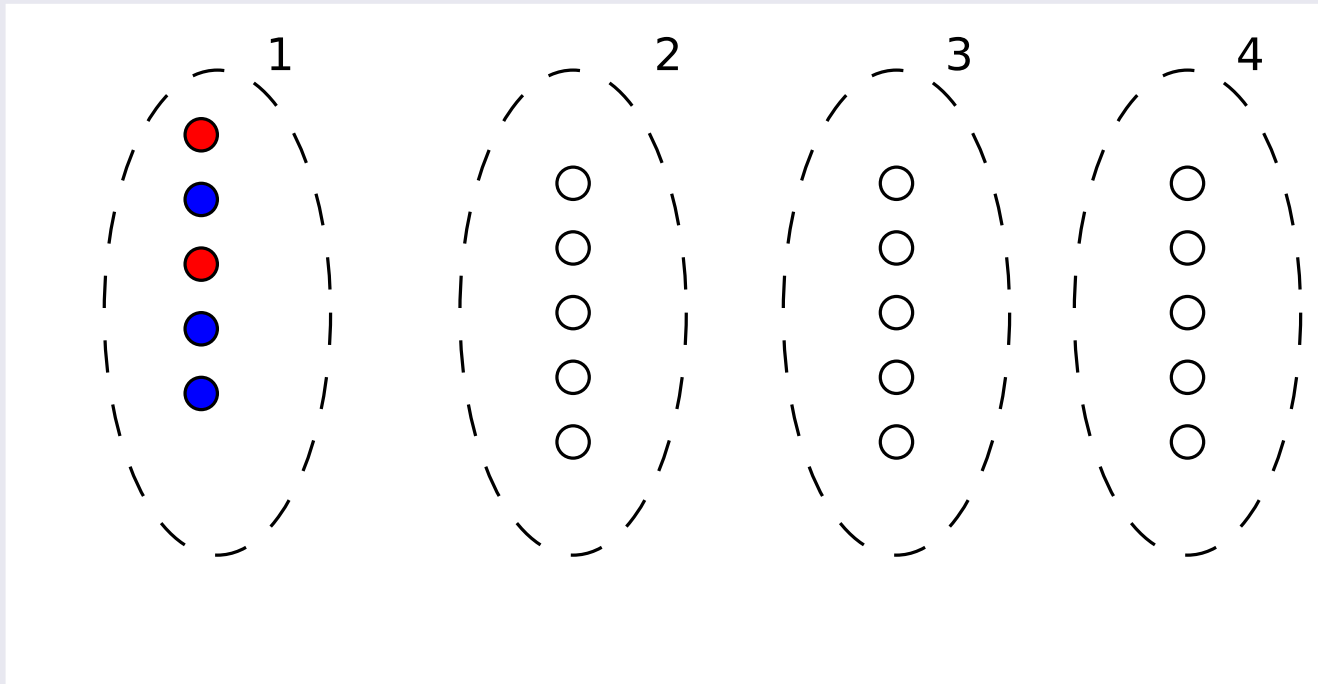
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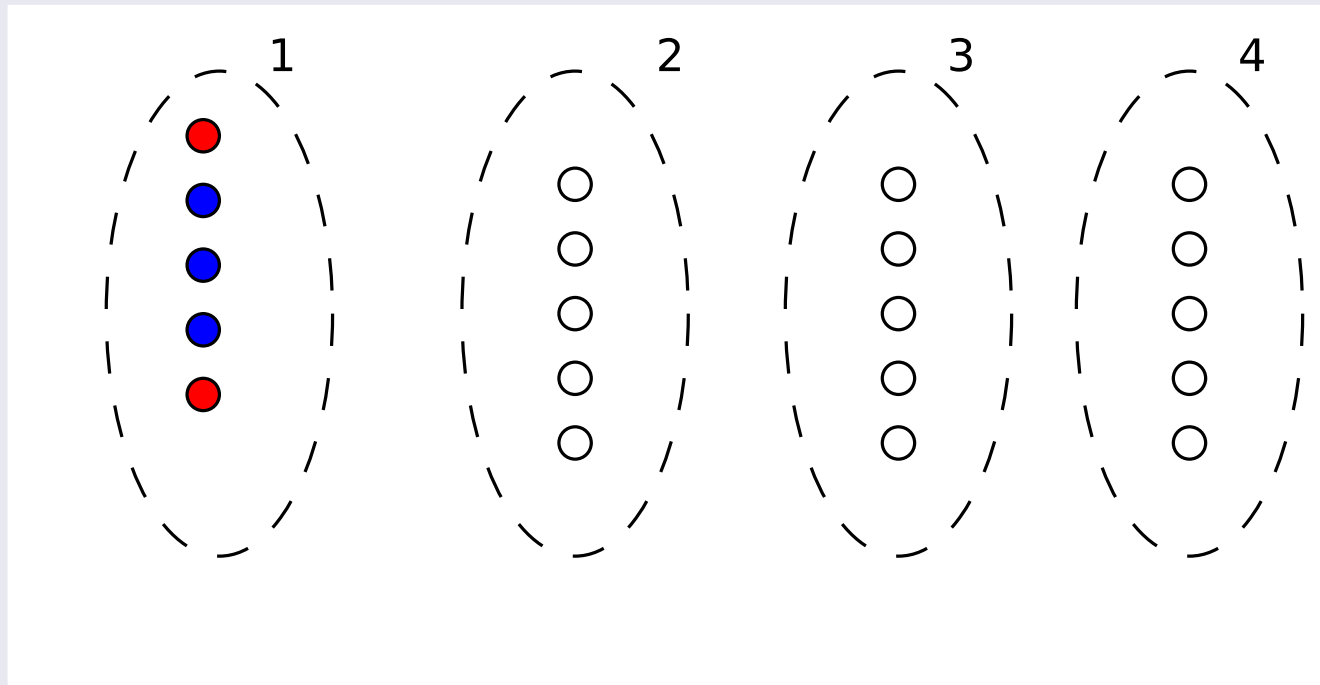
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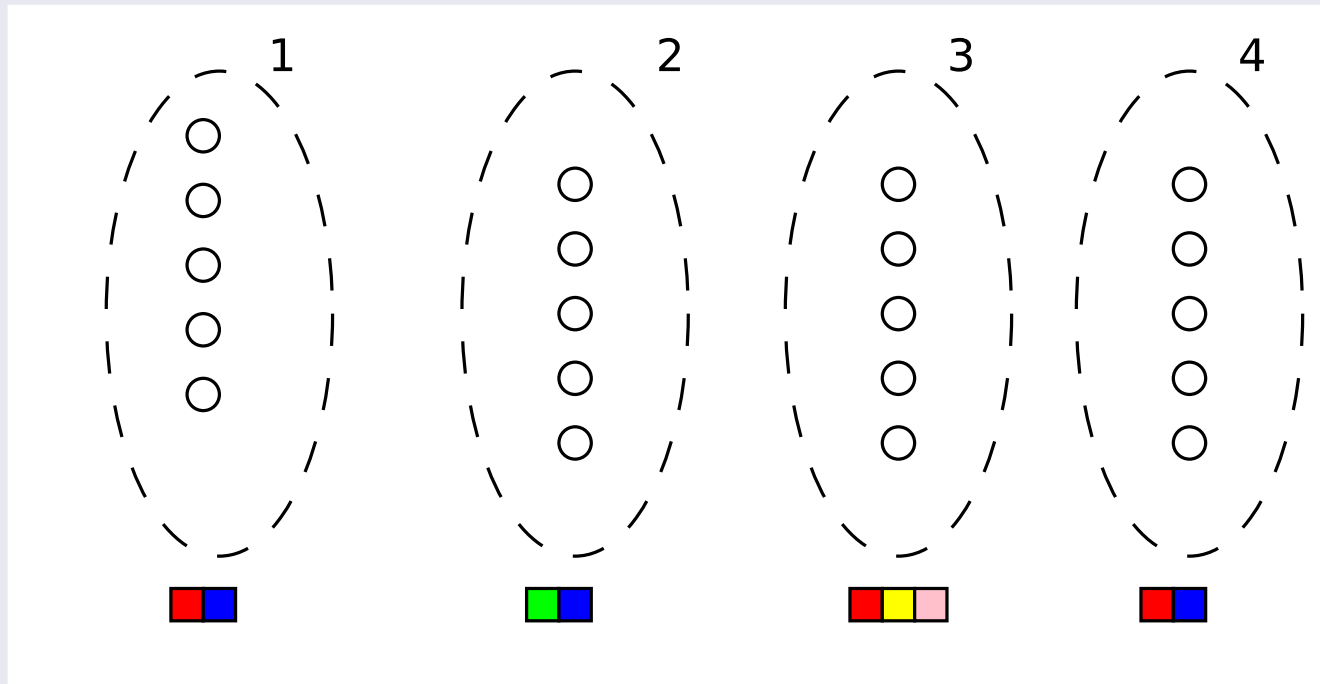
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 - Observe: not important which/how many vertices received color **red**.
 - All future neighbors are common.

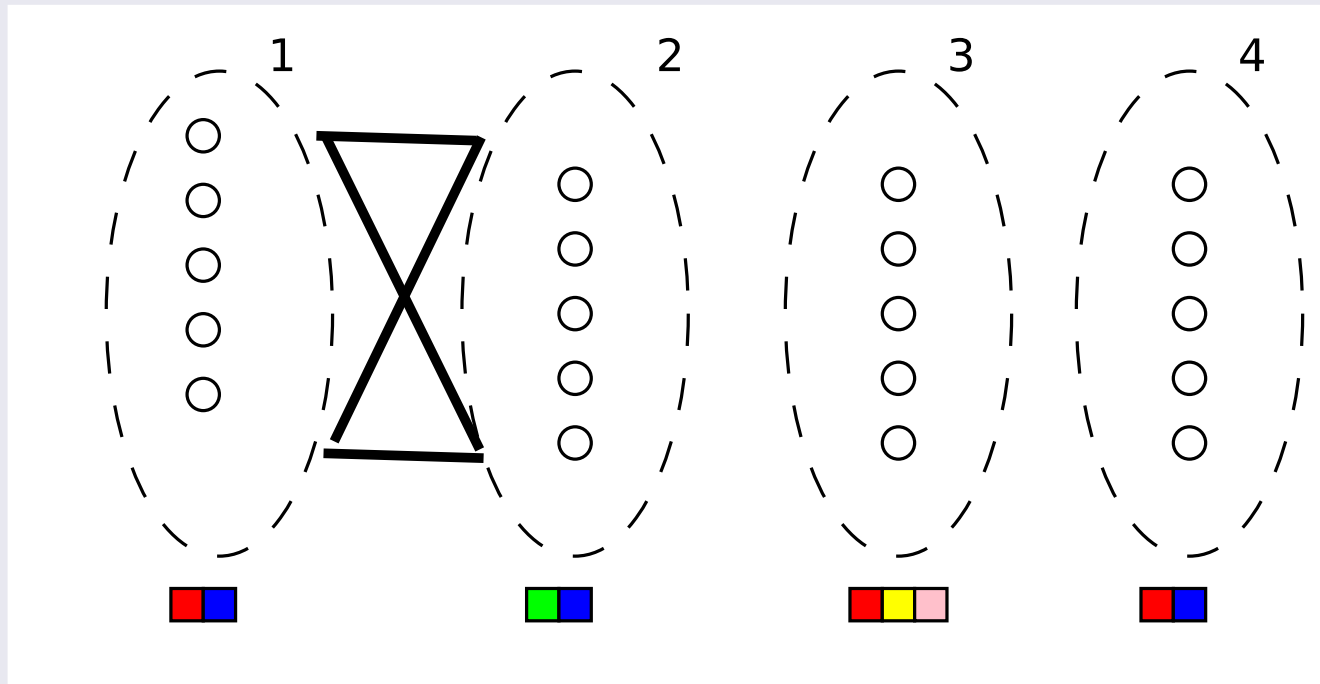
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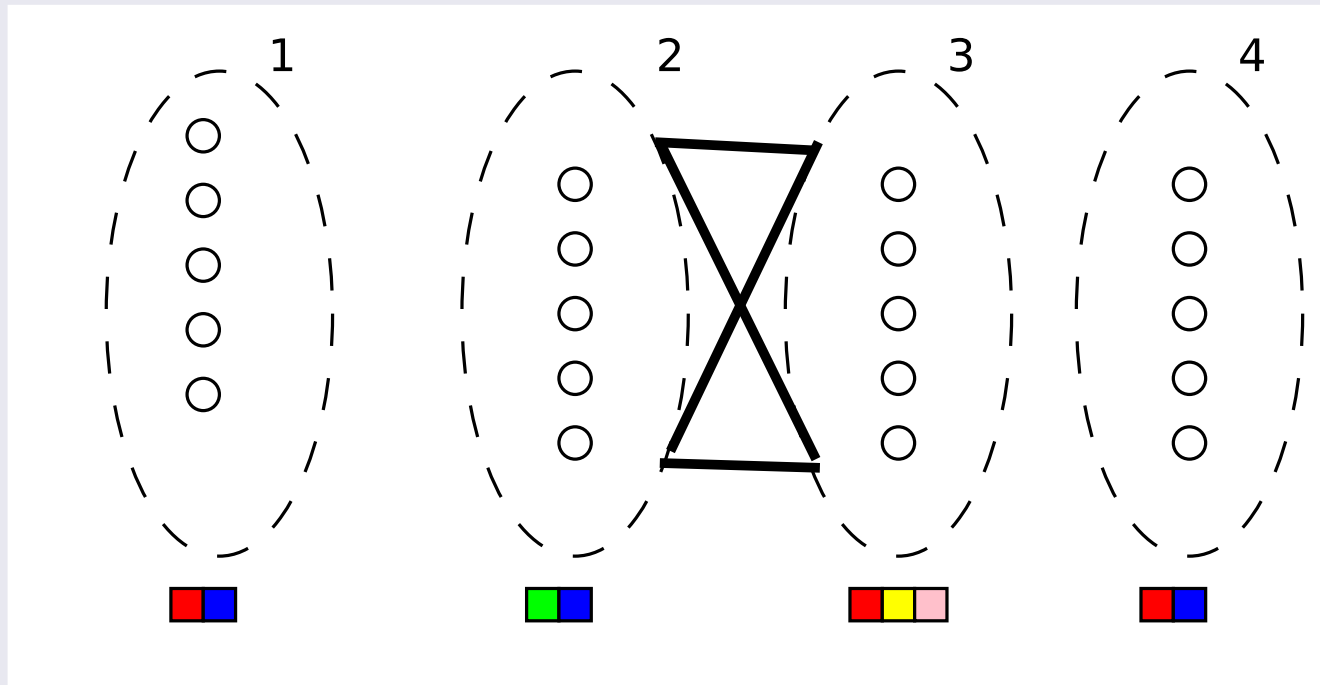
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 - Otherwise discard this partial solution

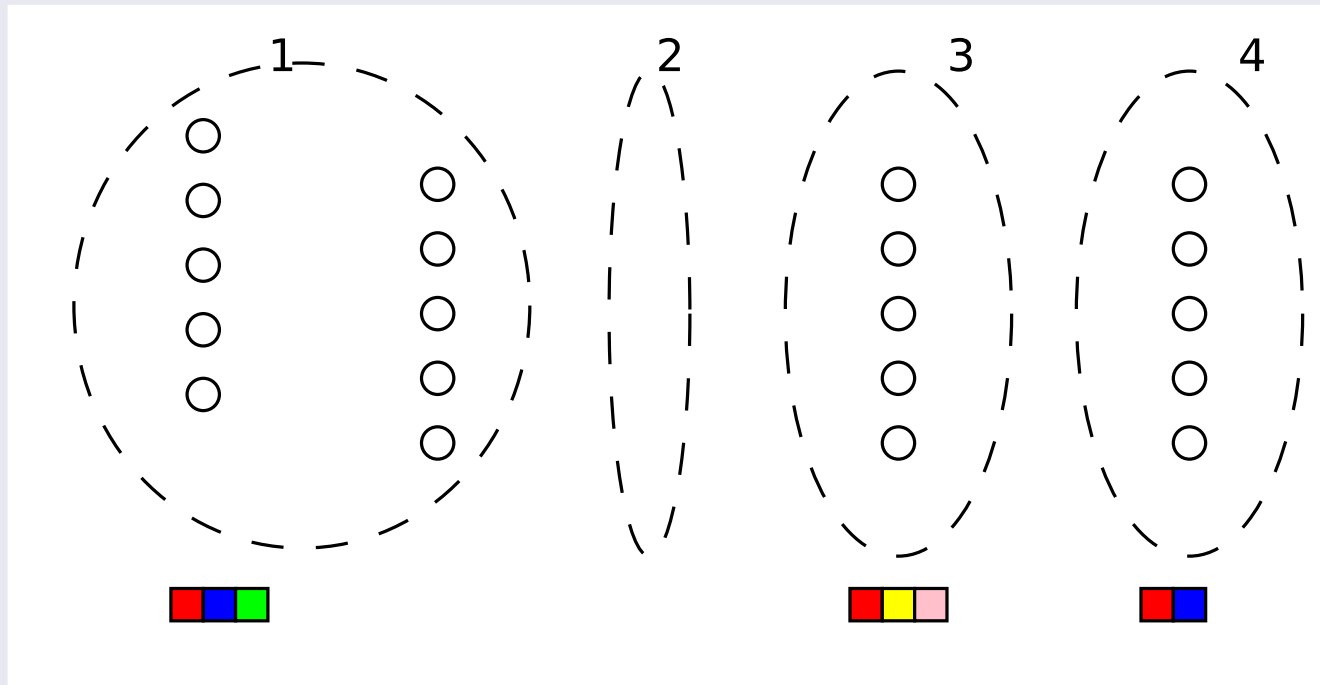
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 - For Rename/Union operations we take unions of sets of colors.

Clique-width: basic algorithm

We recall a basic DP algorithm:

- For every label we remember the **set** of colors used in this label set.
- In the algorithm we sketched the DP has size:
 - 2^k for each label $\rightarrow 2^{k \cdot w}$ in total.
- The $4^{k \cdot w}$ running time claimed comes from a naive implementation of Union operations.
- With modern Fast Subset Convolution technology this can be improved to $2^{k \cdot w}$.

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Can we make the DP smaller than $2^{k \cdot w}$?

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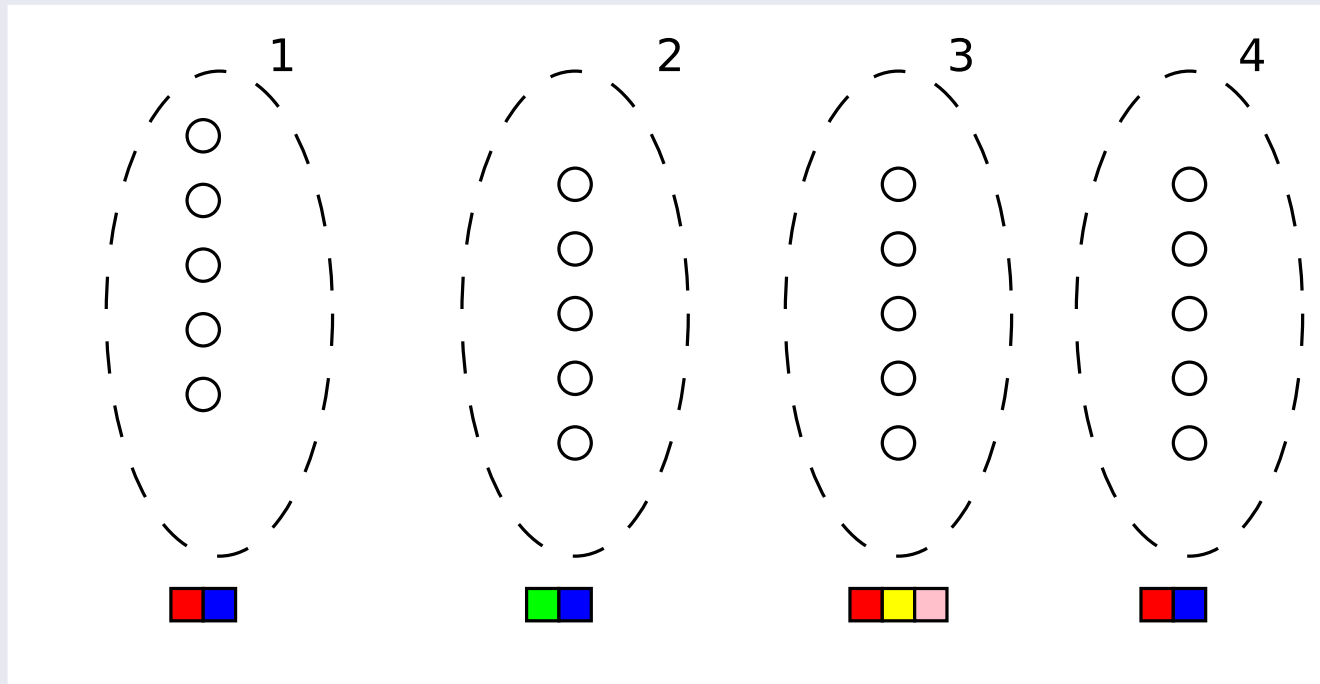
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(**Note:** The k^{2^w} algorithm is much more involved...)

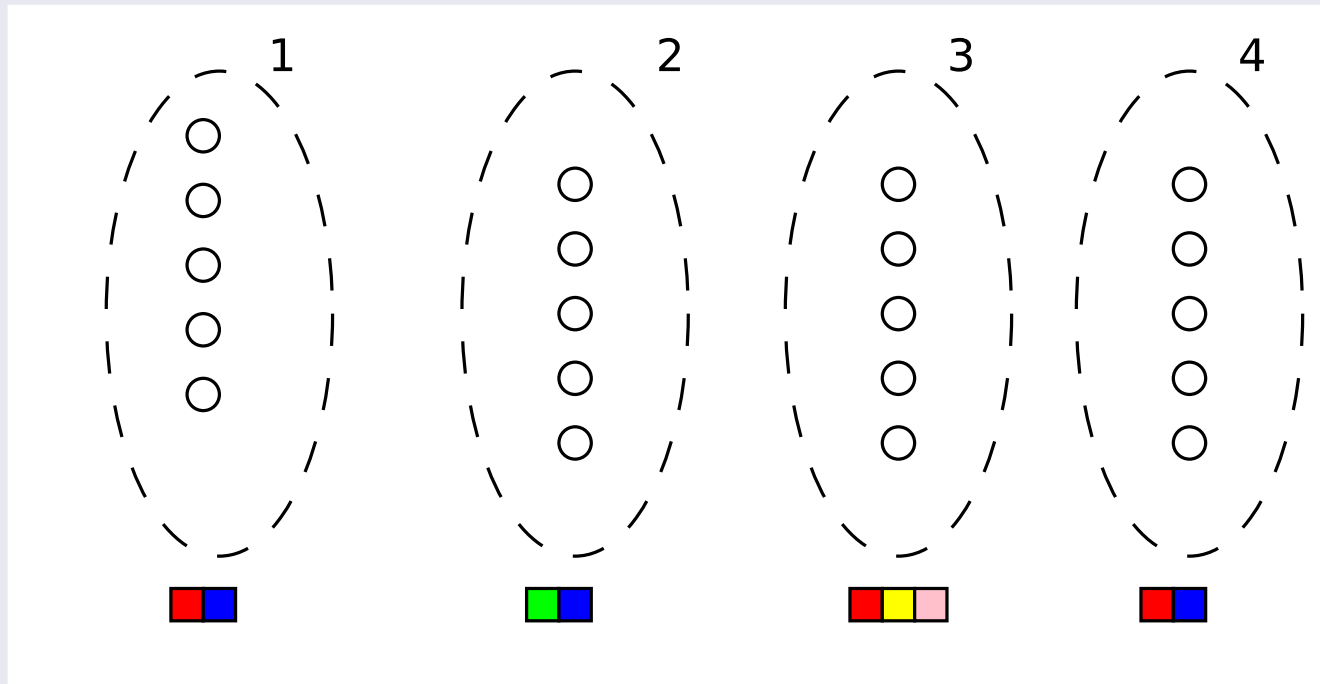
DP algorithm: a closer look



Basic Argument:

- For each label we store a set of colors.
- There are k colors \rightarrow there are 2^k possible sets.

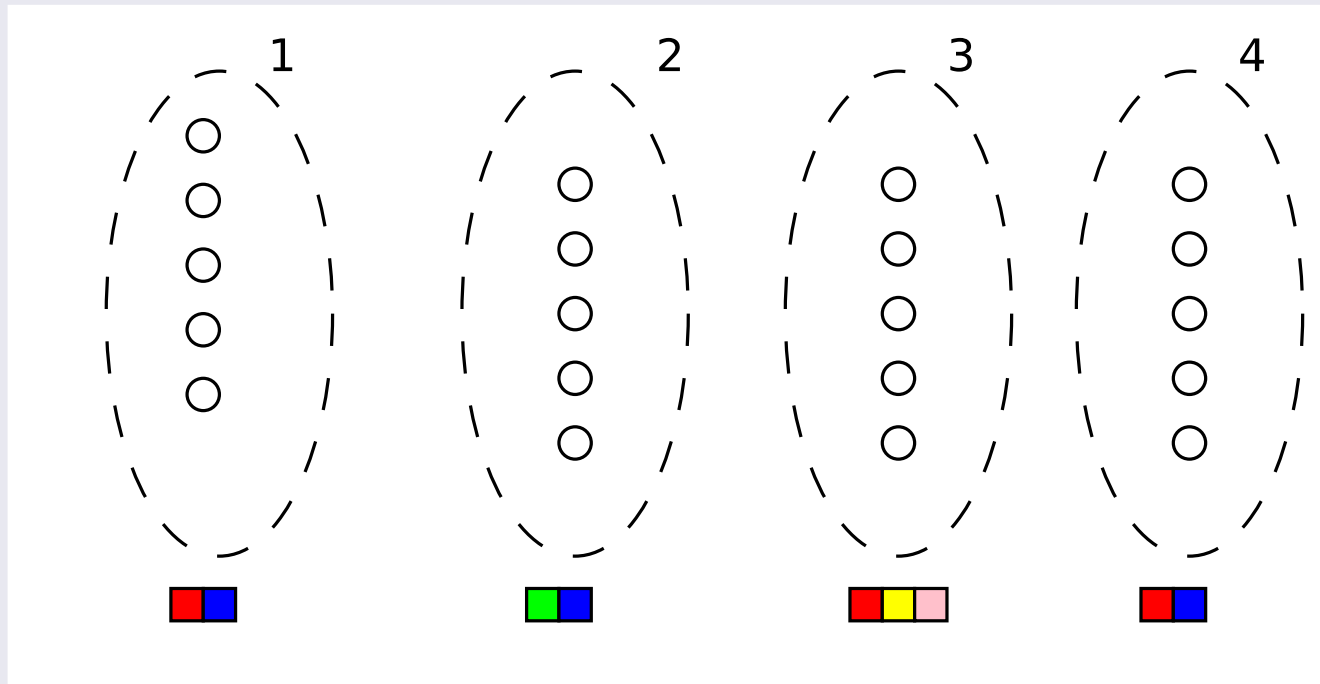
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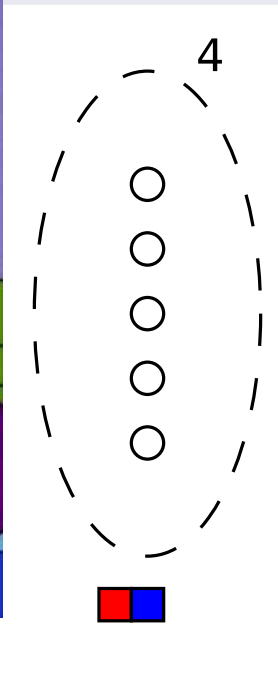
- For each label we store a set of colors.
- There are k colors \rightarrow there are 2^k possible sets.
- **BUT!** How could a label set be colored with \emptyset ?
- Ignoring the empty set we improve the DP table to $(2^k - 1)^w$

DP algorithm: an even closer look



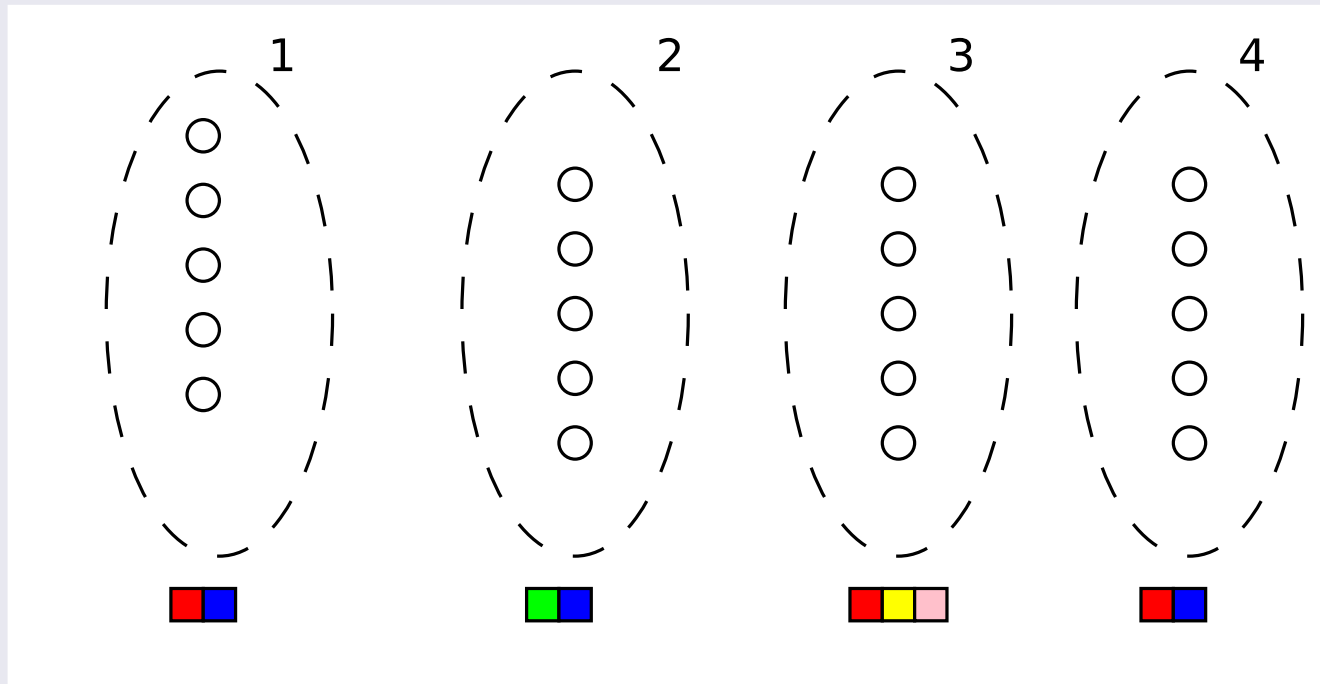
- Could a label set be using **ALL** k colors?

DP algorithm: an even closer look



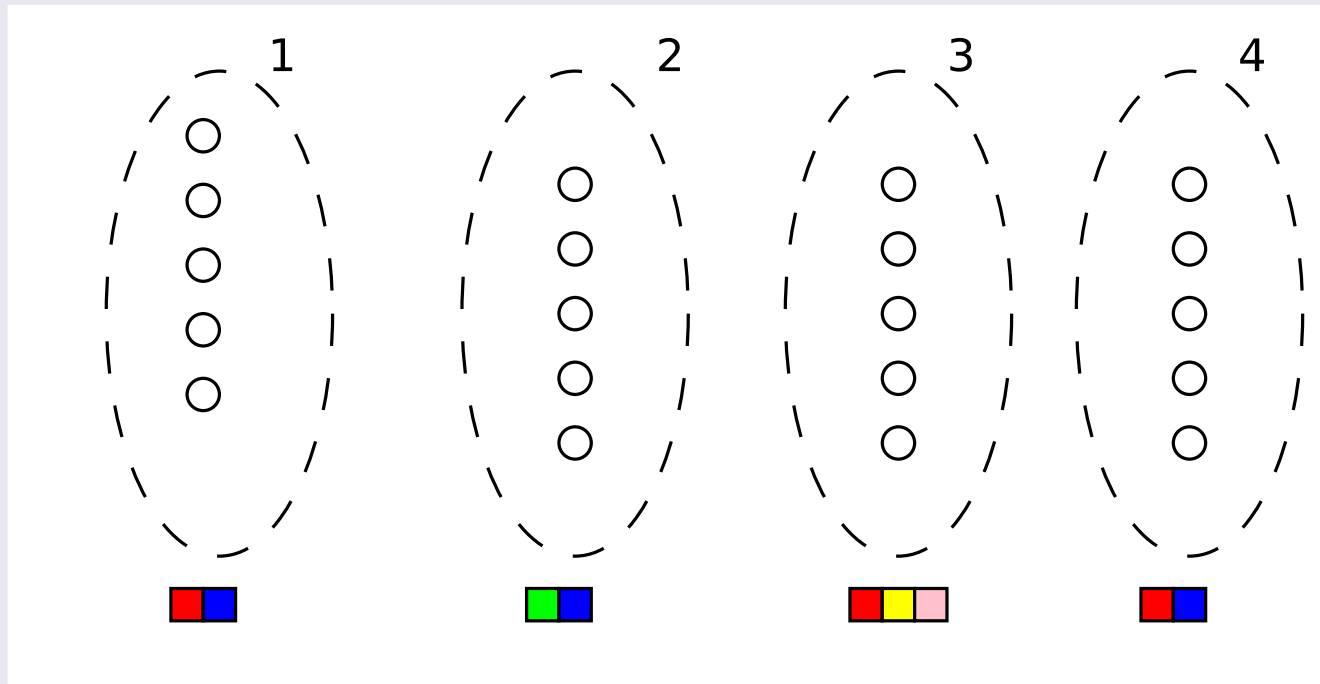
- Could a label set be using **ALL** k colors?
Yes!

DP algorithm: an even closer look



- Could a label set be using **ALL** k colors?
- Yes, but, then we cannot apply join operations to this label.
 - Separate labels into **live** and **junk**.
 - For live labels $2^k - 2$ feasible sets.
 - For junk labels, who cares?? (no more edges!)

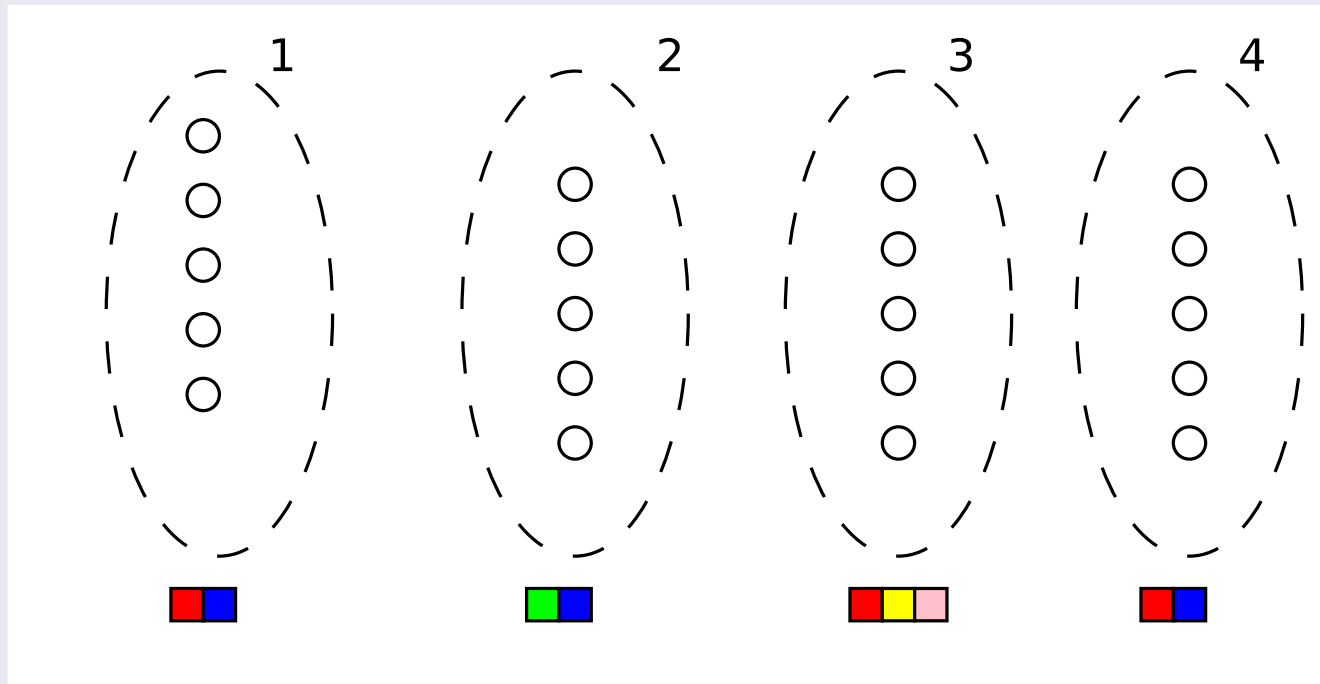
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- Could a label set be using **ALL** k colors?

Bottom line: DP size can be brought down to $(2^k - 2)^w$.

DP algorithm: an even closer look



- Could a label set be using **ALL** k colors?

Bottom line: DP size can be brought down to $(2^k - 2)^w$.

Main result: Under SETH, $(2^k - 2)^w$ is the correct complexity!

The Reduction

Outline

Result: Under SETH, $\forall k, \epsilon$ there is no $(2^k - 2 - \epsilon)^w$ Coloring algorithm.

- Starting Point: q -CSP-B not solvable in $(B - \epsilon)^n$
 - A convenient starting point!
- The main reduction
 - List Coloring
 - Weak Edges – Implications
 - The general structure

SETH more carefully

Goal: A reduction that works as follows

SAT LB	Coloring on clique-width LB
$\bar{A}(2 - \epsilon)^n$	$\rightarrow \bar{A} (2 - \epsilon)^w$
n variables	$w =$

SETH more carefully

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SAT LB	Coloring on clique-width LB
$\bar{A}(2 - \epsilon)^n$	$\rightarrow \bar{A} (4 - \epsilon)^w$
n variables	$w = n/2$

SETH more carefully

Goal: A reduction that works as follows

SAT LB	Coloring on clique-width LB
$\bar{A}(2 - \epsilon)^n$	$\rightarrow \bar{A} (8 - \epsilon)^w$
n variables	$w = n/3$

SETH more carefully

Goal: A reduction that works as follows

SAT LB	Coloring on clique-width LB
$\bar{A}(2 - \epsilon)^n$	$\rightarrow \bar{A} (6 - \epsilon)^w$
n variables	$w = ??$

SETH more carefully

Goal: A reduction that works as follows

SAT LB	Coloring on clique-width LB
$\bar{A}(2 - \epsilon)^n$	$\rightarrow \bar{A} (6 - \epsilon)^w$
n variables	$w = n / \log 6$ Not an int!

- Reductions aiming for a LB of the form c^w , where c is a power of 2 are easy
 - Map $\log c$ SAT variables to each unit of width.
- If c is not a power of 2 things become messier:

SETH more carefully

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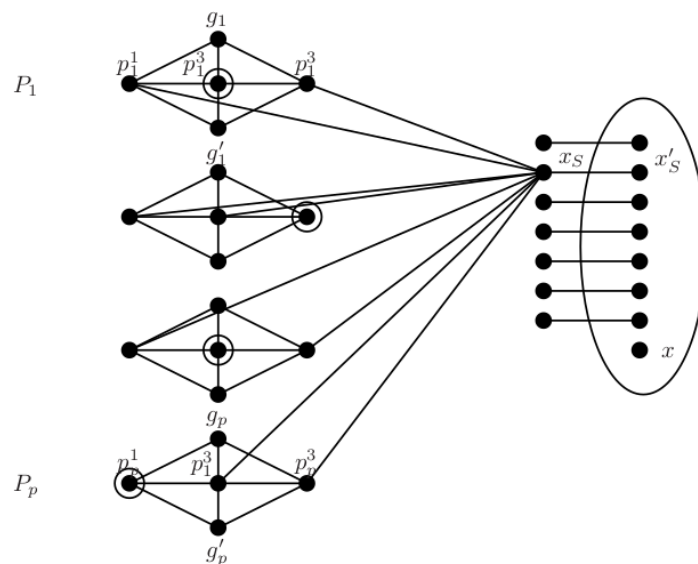


Figure 2: Reduction to DOMINATING SET: group gadget \hat{R} . The set S is shown by the circled vertices

SETH more carefully

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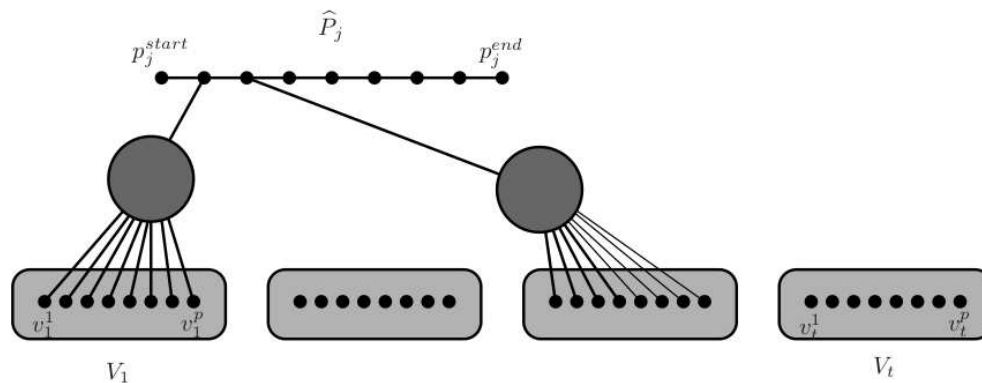


Figure 5: Reduction to q -COLORING. The t groups of vertices V_1, \dots, V_t represent the t groups of variables F_1, \dots, F_t (each of size $\lceil \log q^p \rceil$). Each vertex of the clause path \hat{P}_j is connected to one group V_i via a connector.

SETH more carefully

Goal: A reduction that works as follows

SAT LB	Coloring on clique-width LB
$\exists (2 - \epsilon)^n$	$\rightarrow \exists$
n variables	$w = n / \log 6$ Not an int!

- Reductions aiming for a LB of the form c^w , where c is a power of 2 are easy
 - Map $\log c$ SAT variables to each unit of width.
- If c is not a power of 2 things become messier:
- Solution: Map $p \log c$ variables to p units of width, for p sufficiently large.
 - Usually done as sub-part of the reduction.
 - May complicate the problem unnecessarily...

SETH more carefully

- SETH informal: SAT cannot be solved in $(2 - \epsilon)^n$.
- SETH more careful: for all $\epsilon > 0$ there exists q such that q -SAT cannot be solved in $(2 - \epsilon)^n$.

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- SETH informal: SAT cannot be solved in $(2 - \epsilon)^n$.
- SETH more careful: for all $\epsilon > 0$ there exists q such that q -SAT cannot be solved in $(2 - \epsilon)^n$.
- If we accept the more careful form of SETH we can obtain a convenient starting point for any lower bound

If SETH is true, then for all $B \geq 2, \epsilon > 0$ there exists q such that q -CSP- B cannot be solved in $(B - \epsilon)^n$

SETH more carefully

- SETH informal: SAT cannot be solved in $(2 - \epsilon)^n$.
- SETH more careful: for all $\epsilon > 0$ there exists q such that q -SAT cannot be solved in $(2 - \epsilon)^n$.
- If we accept the more careful form of SETH we can obtain a convenient starting point for any lower bound

If SETH is true, then for all $B \geq 2, \epsilon > 0$ there exists q such that q -CSP- B cannot be solved in $(B - \epsilon)^n$

- Translation: we get a problem that needs time 6^n , or 14^n , or 30^n , or ...
- **Ready to be used for all your reduction needs!**



Main Reduction – Step 1

Strategy: Reduce q -CSP-6 to 3-Coloring on clique-width.

- If $w = n + O(1)$, then we get $(6 - \epsilon)^w = (2^k - 2 - \epsilon)^w$ lower bound, DONE!

- Step 1: Define an arbitrary mapping from the alphabet of the CSP $1, \dots, 6$ to sets of colors.

1	R
2	G
3	B
4	RG
5	RB
6	GB

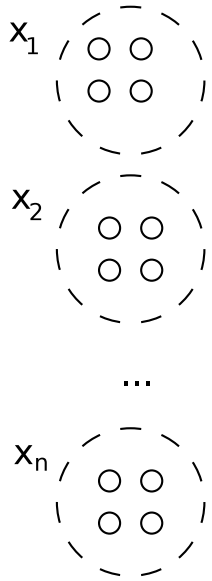
- **Intuition:** We define a label class for each variable. This label class uses exactly the colors given by the mapping of its satisfying value.

Main Reduction – Step 2

We assume the existence of the following gadgets:

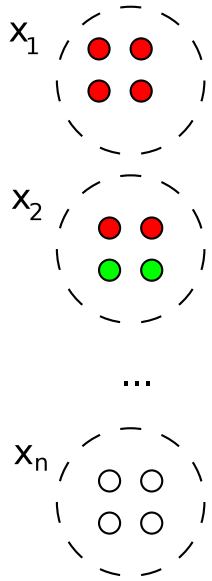
- List Coloring: We can assign each vertex a list of feasible colors
- Implications: If source has a certain color, this forces a color on the sink

Main Reduction – Step 2



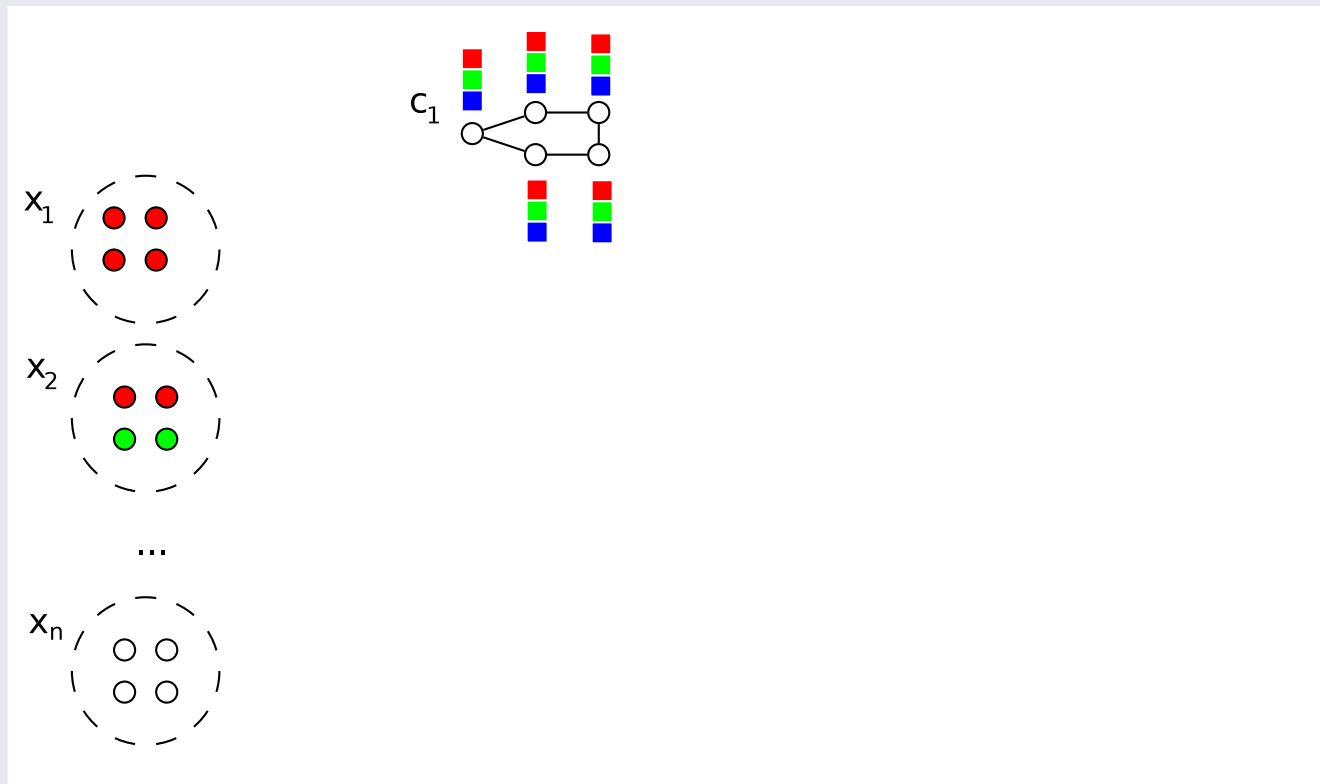
- We maintain n label sets (one for each variable).

Main Reduction – Step 2



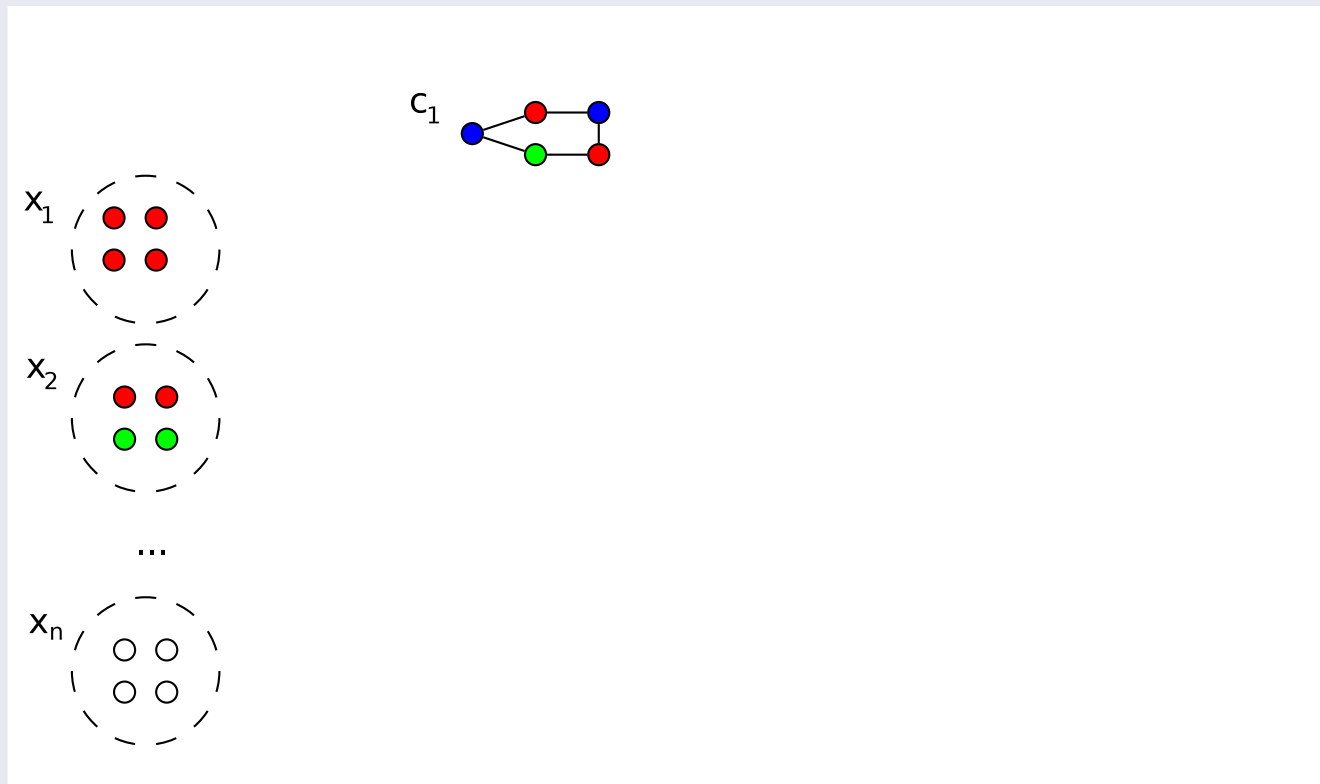
- We maintain n label sets (one for each variable).
- Invariant: Colors used \leftrightarrow value
- Here: $x_1 = 1, x_2 = 4$

Main Reduction – Step 2



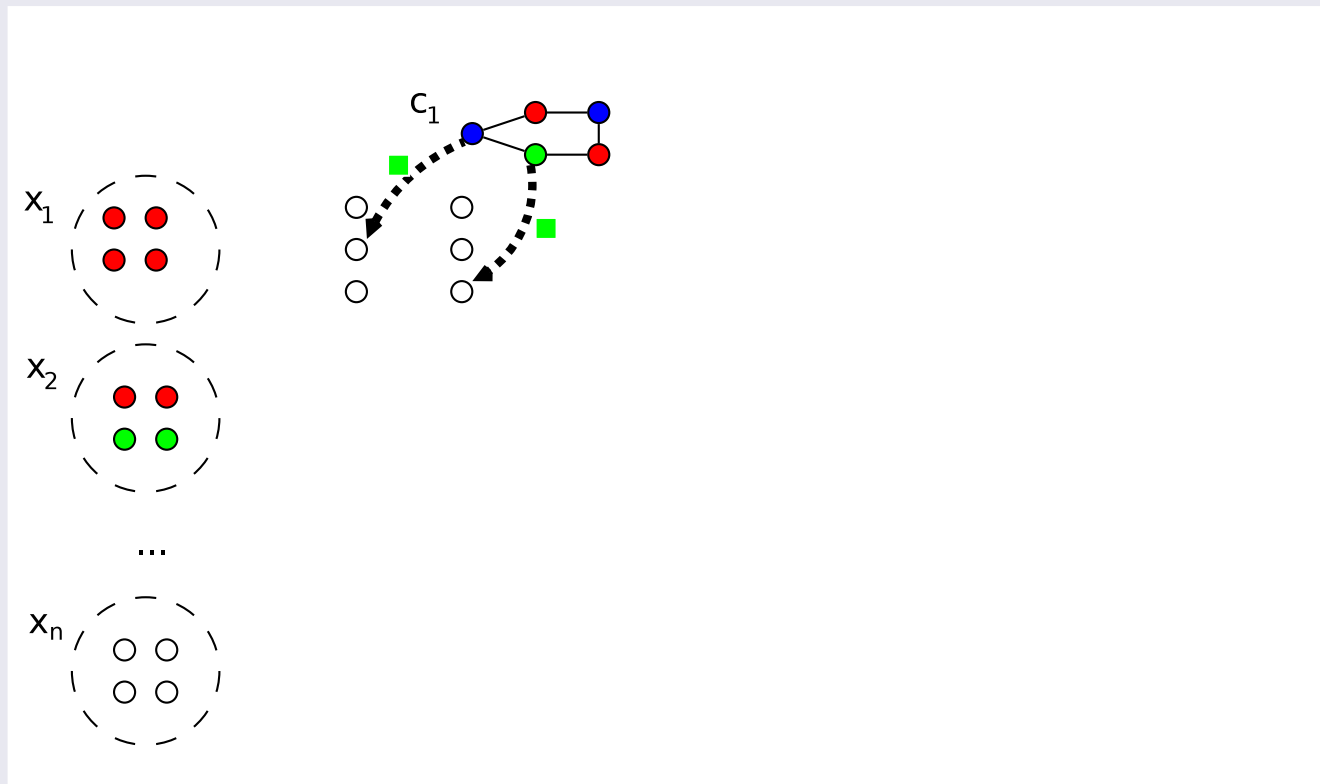
- We maintain n label sets (one for each variable).
- Invariant: Colors used \leftrightarrow value
- For each constraint: odd cycle with 3 color list
- \rightarrow Each vertex represents a satisfying assignment
- \rightarrow Green vertex \leftrightarrow selected assignment

Main Reduction – Step 2



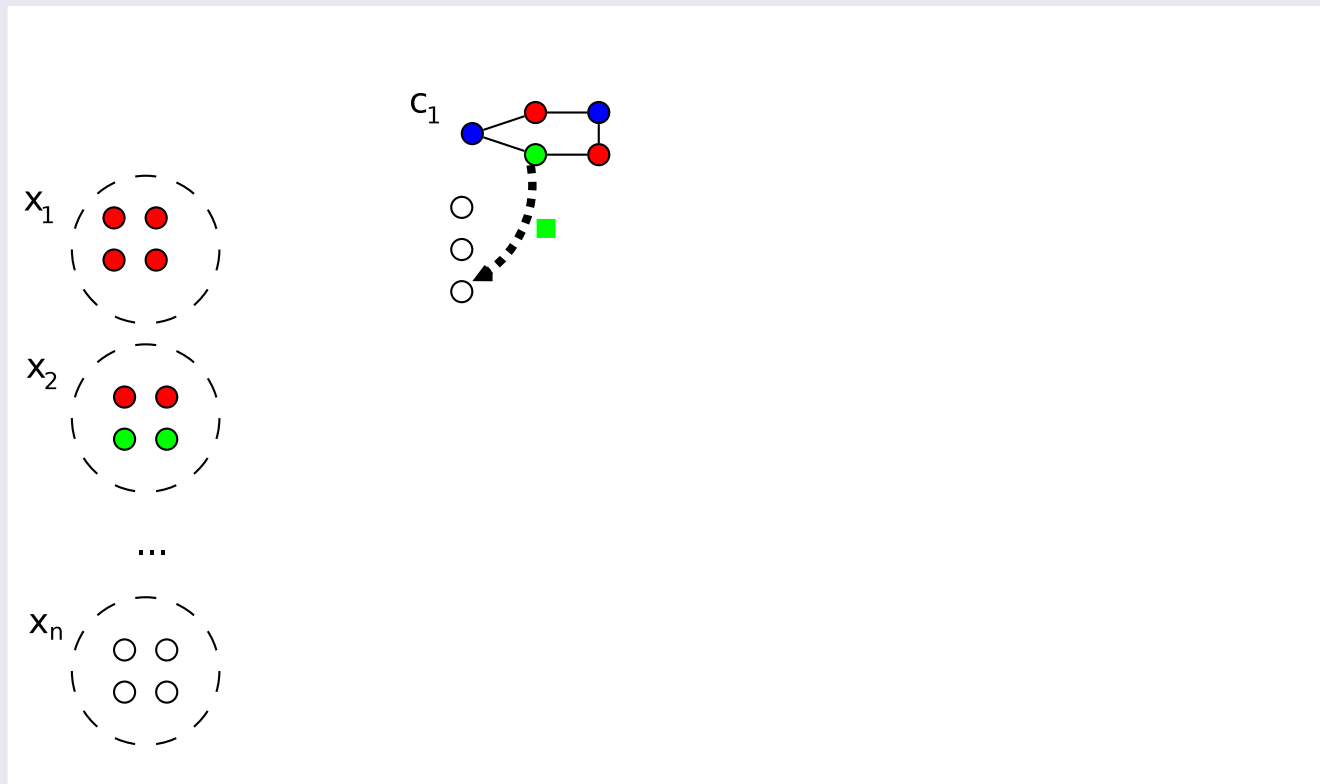
- We maintain n label sets (one for each variable).
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Main Reduction – Step 2



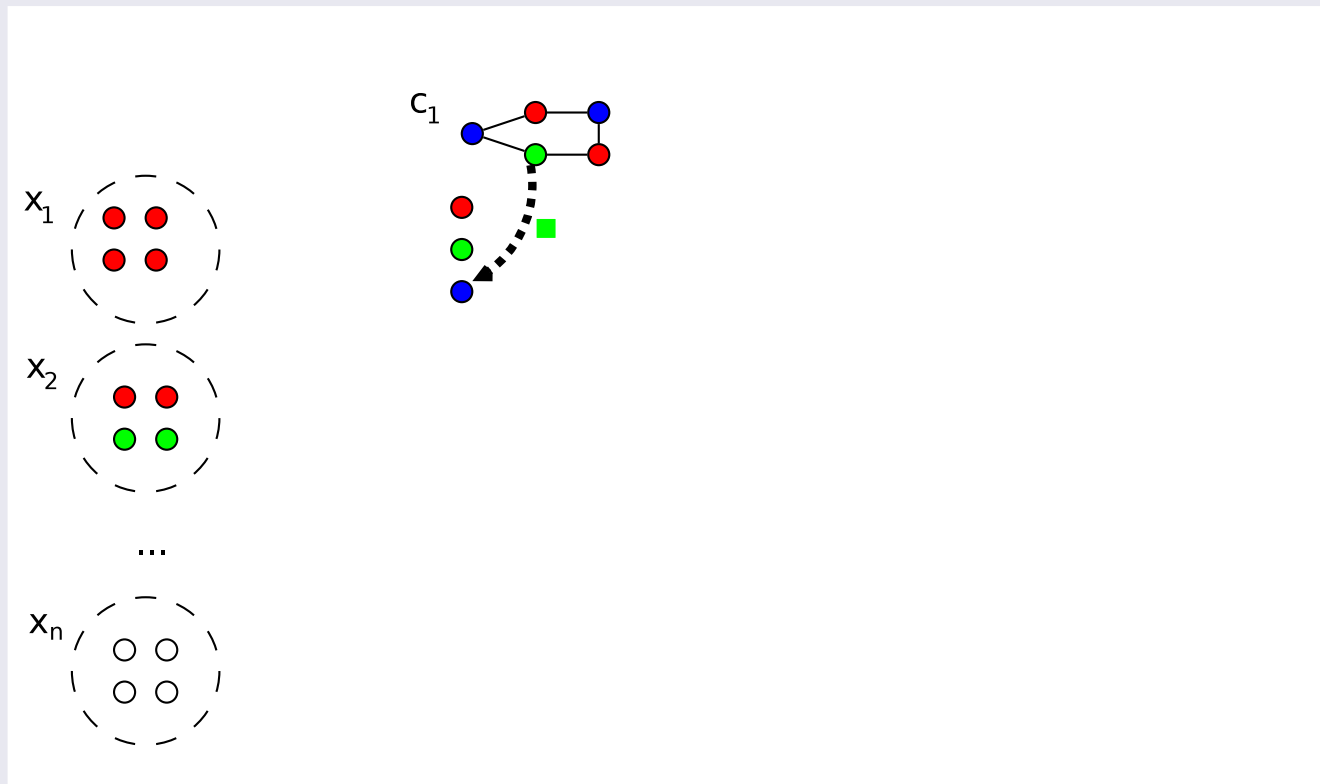
- We maintain n label sets (one for each variable).
- Invariant: Colors used \leftrightarrow value
- \rightarrow Green vertex \leftrightarrow selected assignment
- Add Green-activated implications

Main Reduction – Step 2



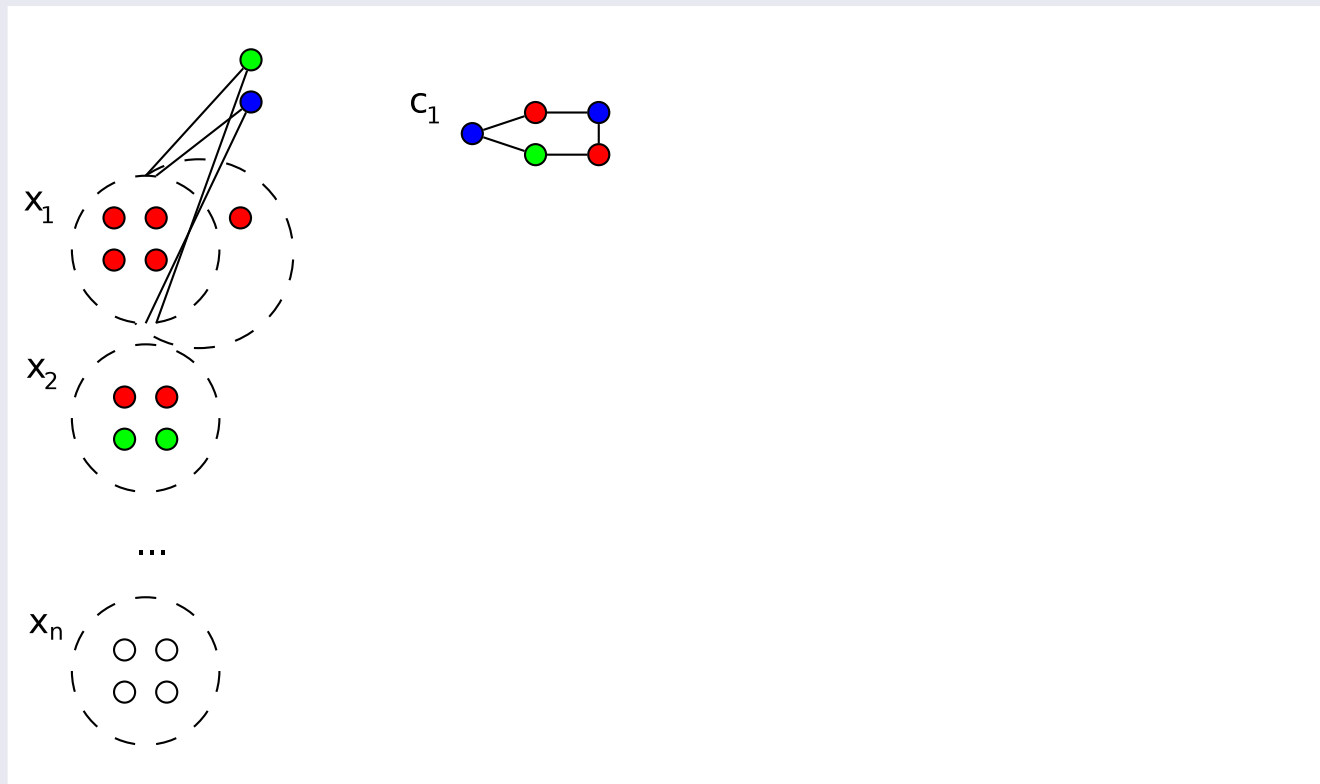
- We maintain n label sets (one for each variable).
- Invariant: Colors used \leftrightarrow value
- \rightarrow Green vertex \leftrightarrow selected assignment
- Add Green-activated implications
- Non-selected assignment \rightarrow implications irrelevant

Main Reduction – Step 2



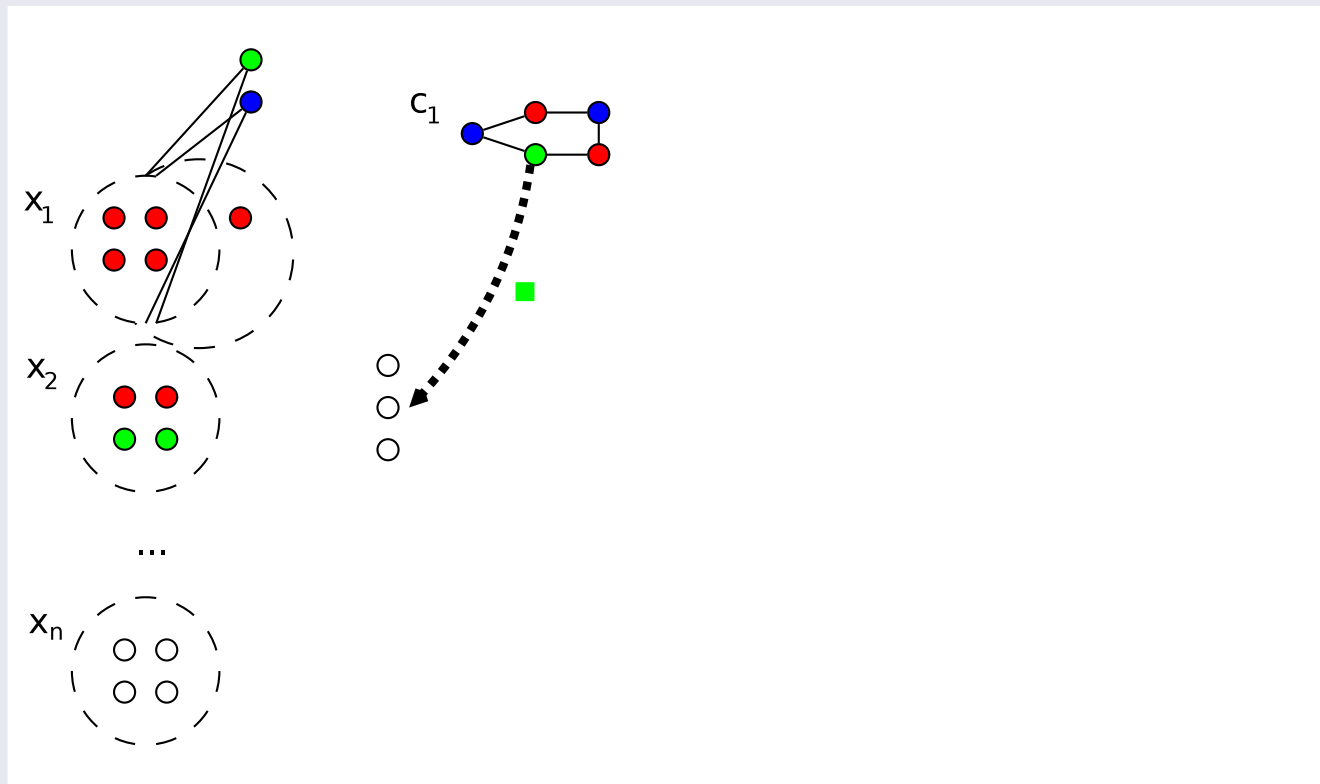
- We maintain n label sets (one for each variable).
- Invariant: Colors used \leftrightarrow value
- \rightarrow Green vertex \leftrightarrow selected assignment
- Add Green-activated implications
- Selected assignment \rightarrow Colors forced

Main Reduction – Step 2



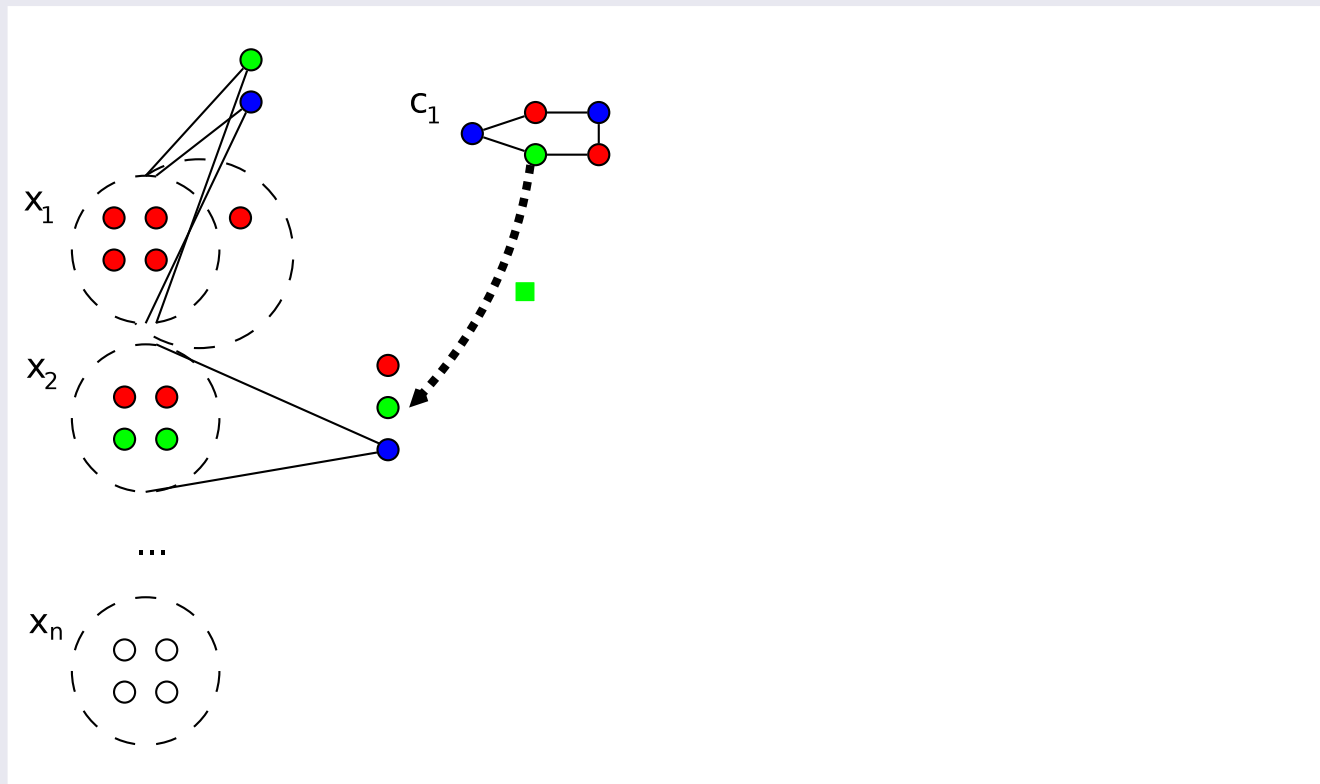
- We maintain n label sets (one for each variable).
- Invariant: Colors used \leftrightarrow value
- \rightarrow Green vertex \leftrightarrow selected assignment
- Add edges from vertices **not supposed** to have a color in x_1 to x_1 .
- Move these vertices to JUNK, others to x_1

Main Reduction – Step 2



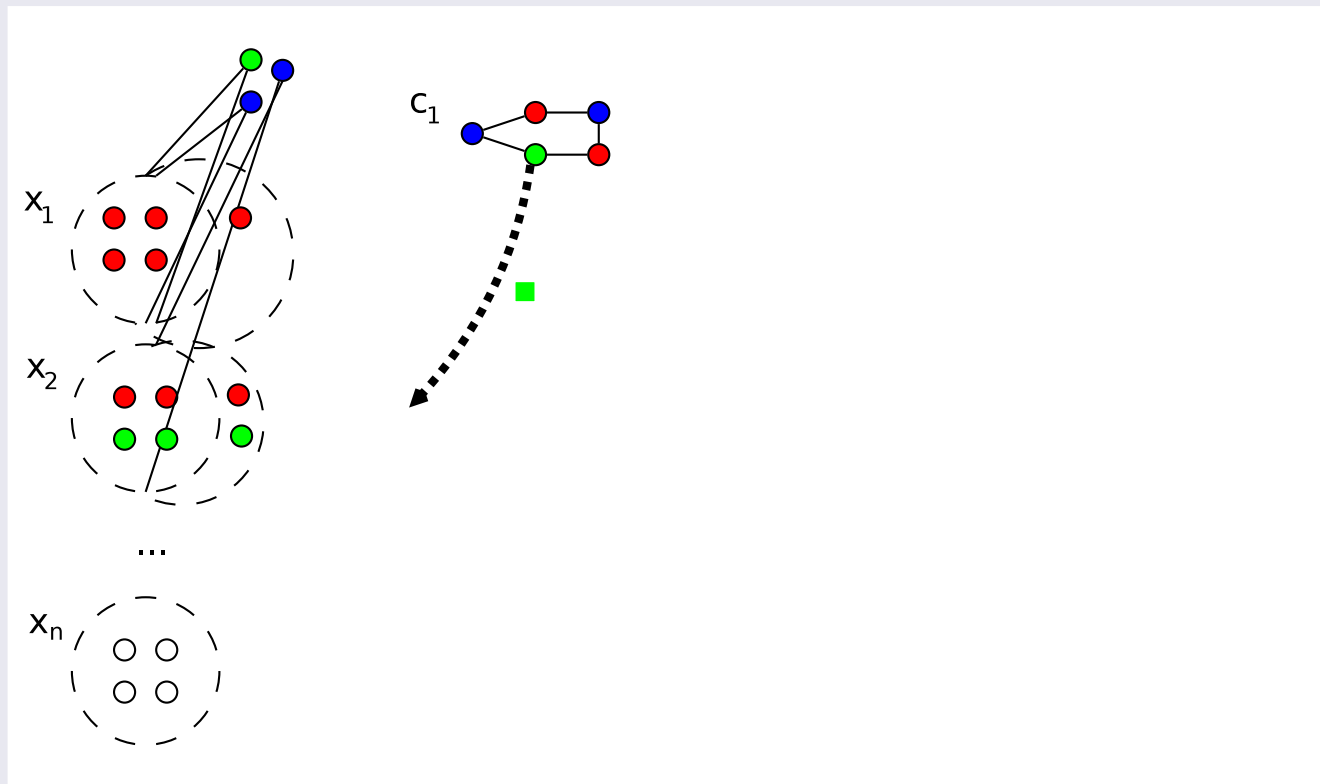
- We maintain n label sets (one for each variable).
- Invariant: Colors used \leftrightarrow value
- \rightarrow Green vertex \leftrightarrow selected assignment
- Do the same for other variables of c_1

Main Reduction – Step 2



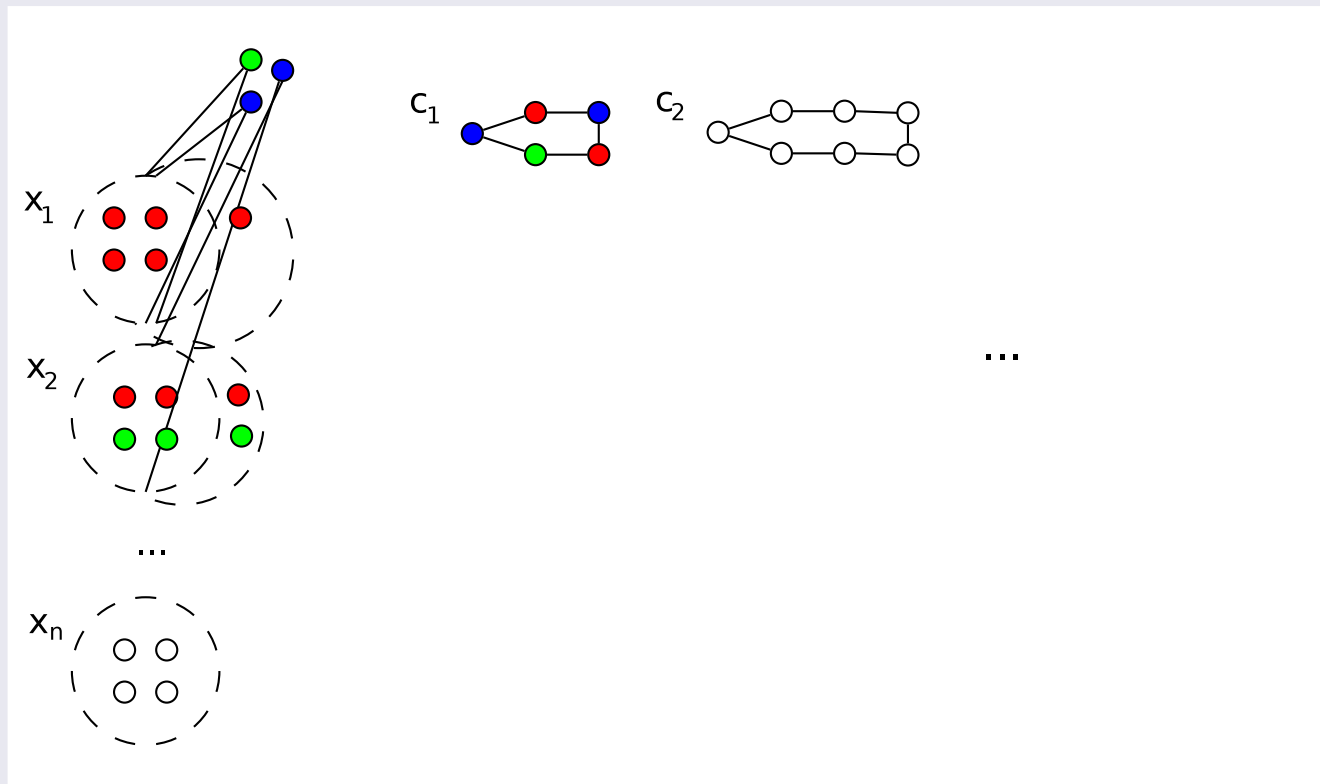
- We maintain n label sets (one for each variable).
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- \rightarrow Green vertex \leftrightarrow selected assignment
- Do the same for other variables of c_1

Main Reduction – Step 2



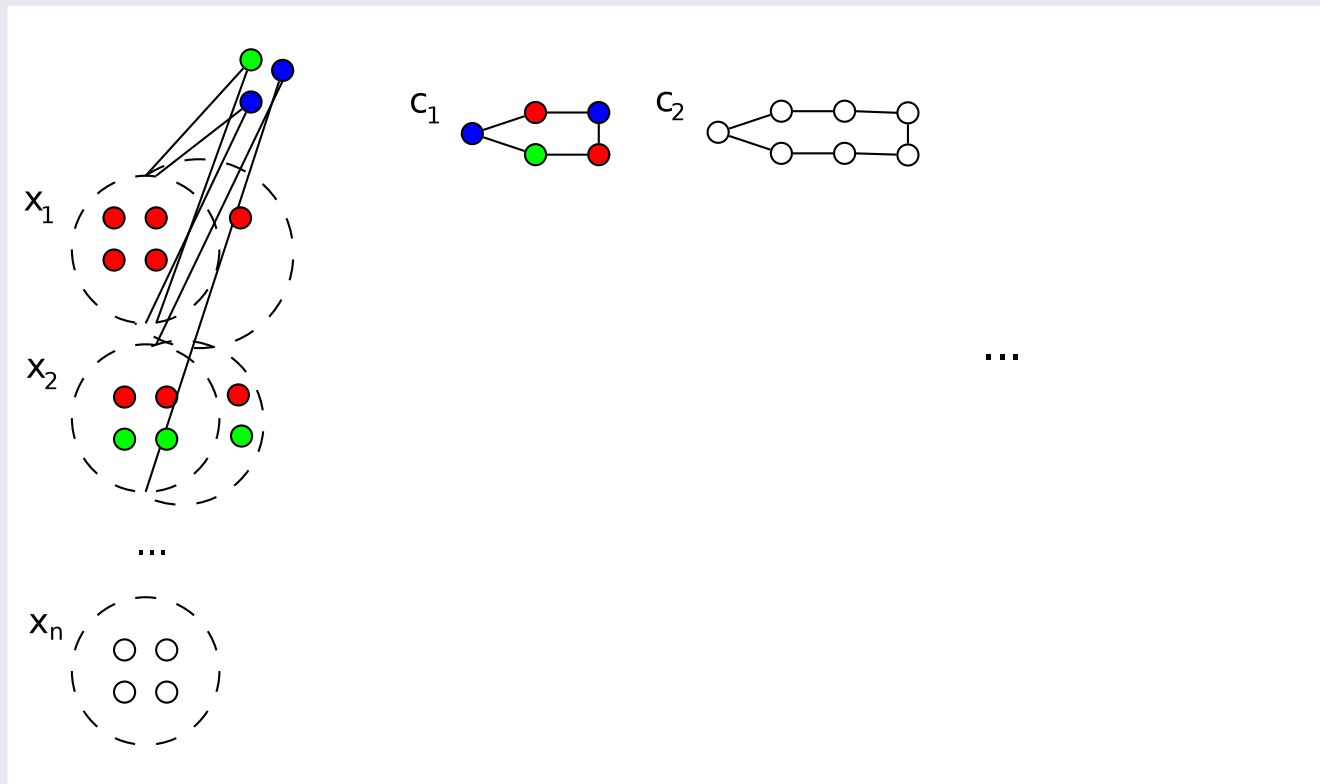
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Main Reduction – Step 2



- We maintain n label sets (one for each variable).
- Invariant: Colors used \leftrightarrow value
- \rightarrow Green vertex \leftrightarrow selected assignment
- Do the same for other constraints

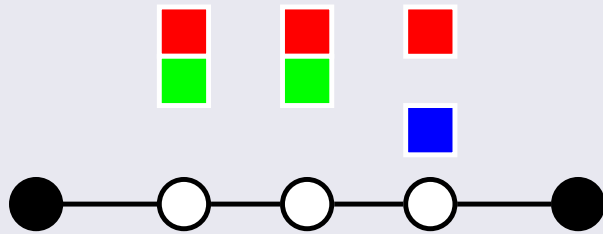
Main Reduction – Step 2



- We maintain n label sets (one for each variable).
- Invariant: Colors used \leftrightarrow value
- \rightarrow Green vertex \leftrightarrow selected assignment
- Do the same for other constraints
- Repeating the sequence of constraints kn times ensures consistency!

Main Reduction – Gadgets

- List Coloring
 - Implemented by adding a complete k -partite graph to G , connecting each vertex with appropriate parts.
 - Tricky part: maintain clique-width.
- Weak Edges
 - Edges that only rule out one pair of colors (c_1, c_2) .
 - Example: No (Red Blue)
- Implications
 - Implemented with weak edges.



Conclusions

Summary:

- Under SETH, $(2^k - 2)^w$ is the **correct** complexity of Coloring on clique-width, for any constant k .
- Similarly “fine tight” bounds for modular treewidth.

Open Problems:

- Why/how/when does complexity go from $2^{k \cdot w}$ to k^{2^w} ???

Conclusions

Summary:

- Under SETH, $(2^k - 2)^w$ is the **correct** complexity of Coloring on clique-width, for any constant k .
- Similarly “fine tight” bounds for modular treewidth.

Open Problems:

- Why/how/when does complexity go from $2^{k \cdot w}$ to k^{2^w} ???
- Approximation?
 - Consistent with current knowledge: 2^{tw} 2-approximation for Coloring?
 - Can we distinguish 3 from 7-colorable graphs in 2^{tw} ?

Conclusions

Summary:

- Under SETH, $(2^k - 2)^w$ is the **correct** complexity of Coloring on clique-width, for any $k \geq 2$.
- Similarly “fine tight”

Open Problems:

- Why/how/when do
- Approximation?
 - Consistent with Coloring?
 - Can we distinguish



Thank you!