

# EITQ

Counting Problems,  
Matchgate Quantum Computing

Renaud Vilmart

# Homework!

see <https://rvilmart.github.io/ArteQ.html> by the end of the week.

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- ▶ Efficiency of planar matchgate simulation

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  - ▶ Perfect matchings

# Graph Minor

Recall: graph  $G = (V, E)$  with  $E \subseteq V \times V$

## Definition

Graph Minor  $H$  minor of  $G$  if obtained by:

- ▶ deleting vertices
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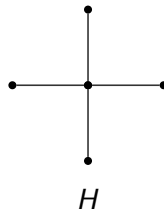
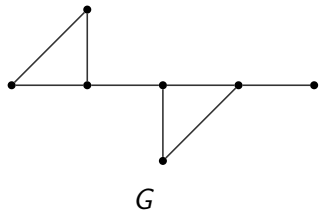
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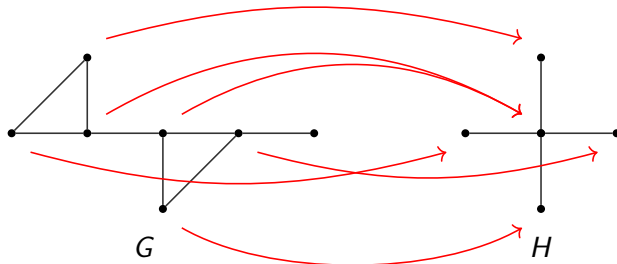
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### Definition (Planar Graph)

A graph that can be embedded on the plane, without crossings of edges.

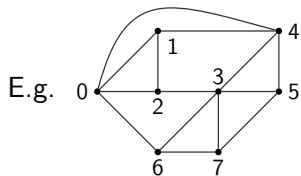


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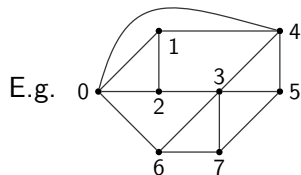
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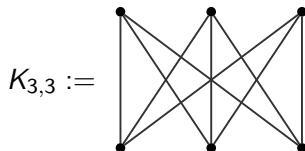
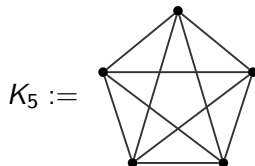
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Two very important non-planar graphs:



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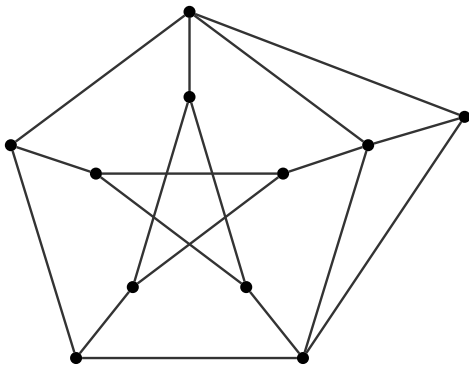
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  - ▶ Planarity is **P**.



## Example: Planarity?

Is the following graph planar?

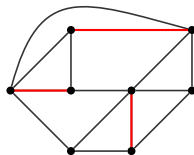


# Matchings and Perfect Matchings

## Definition

With  $G = (V, E)$  a graph:

- ▶ Matching:  $M \subseteq E$ , s.t.  $\forall e_i, e_j \in M, i \neq j \implies e_i \cap e_j = \emptyset$ .

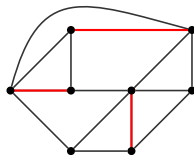


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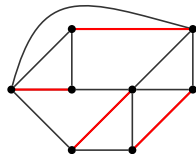
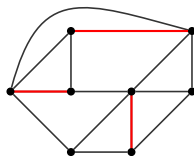


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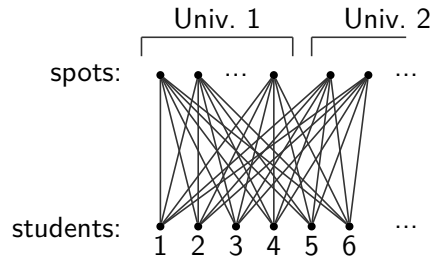
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- ▶ Perfect Matching: A matching  $M$  that contains all vertices, i.e.  $\forall v \in V, \exists e \in M, v \in e$ .

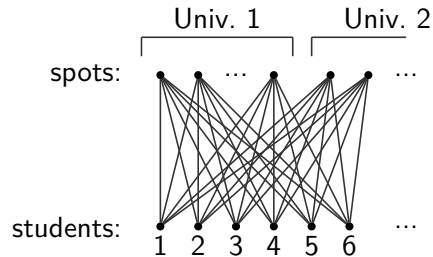


## Example: Parcoursup



**Aparté:**

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### Aparté:

Particular case of a bipartite graph.

Suppose  $|students| < |spots|$ . A maximum cardinality matching covers all students iff  $\forall W \subseteq students, |W| \leq |N(W)|$ .

Proof of above gives an algorithm.

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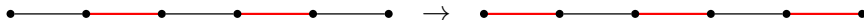
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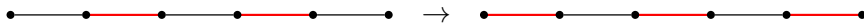
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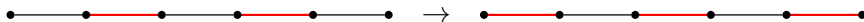
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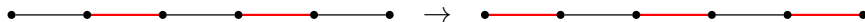
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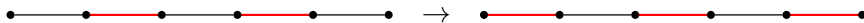
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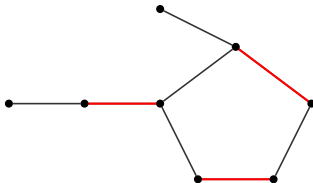
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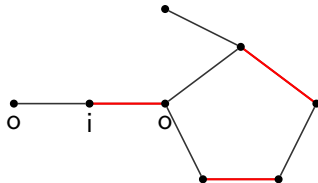
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Problem with naive depth-first search:



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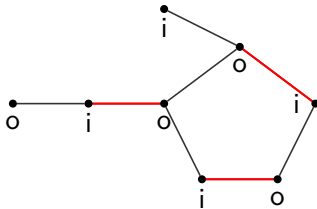
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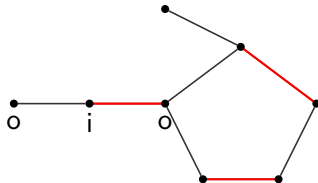
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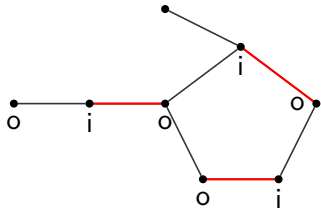
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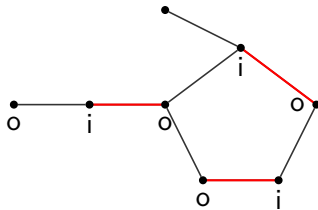
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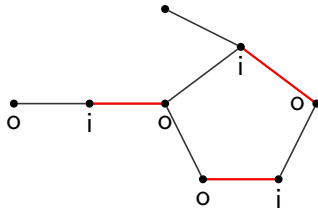
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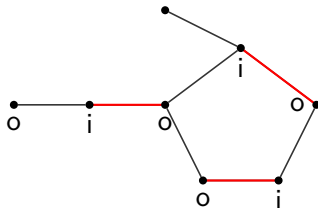
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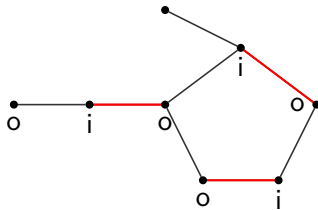


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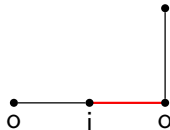


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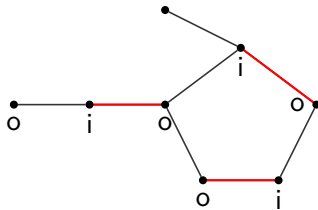


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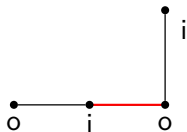


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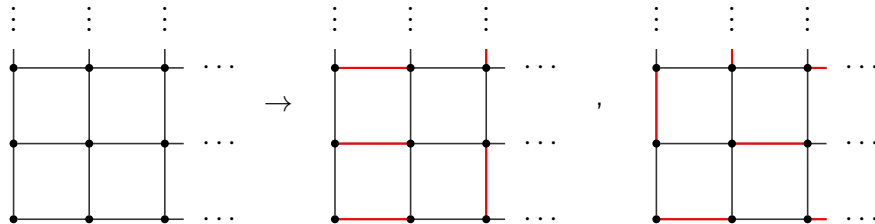
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- Molecules laid out on a lattice. How many ways to “dimerise” them?

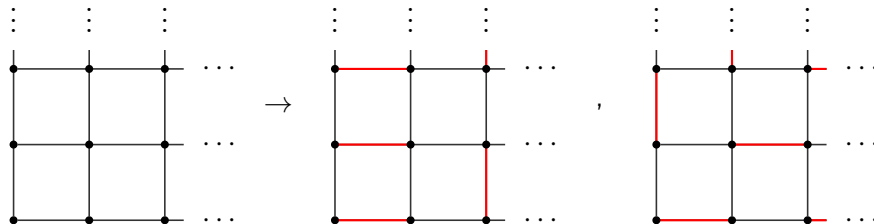




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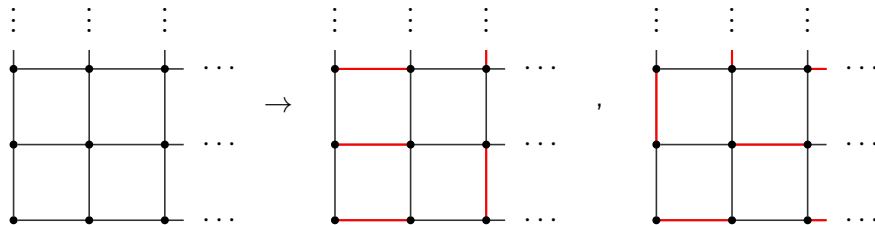


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- ▶  $\equiv$  counting perfect matchings in the lattice.
- ▶ Requires studying complexity of counting problems

## A Natural Way to Count Perfect Matchings

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With weights on edges ( $w : E \rightarrow R$ ):

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$\#PM_R$ : counting perfect matchings with weights in  $R$ .

## Complexity of Counting Problems

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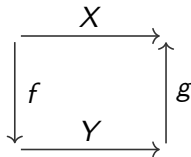
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- ▶ **FP** problems: function problems solvable by a polynomial-time deterministic Turing machine
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- ▶ **#P-complete**: **#P** problems such that for all other **#P** problems  $f$ , there is a polynomial-time counting reduction ( $\leq_{\#}$ ) from  $f$  to that problem

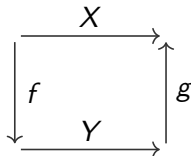
## Polynomial-Time Counting Reduction

Given two problems  $X$  and  $Y$ , we say that  $X$  reduces to  $Y$  ( $X \leq_{\#} Y$ ) if there exist polynomial-time computable functions  $f$  and  $g$  such that the following diagram commutes:



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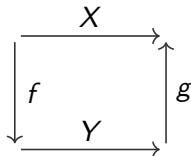
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**#3-SAT is #P-complete:** the Cook-Levin construction preserves the number of solutions (i.e.  $g = id$ )

## Proving #PM is #P-complete

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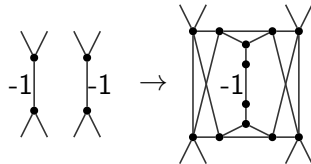
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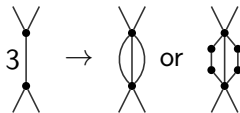
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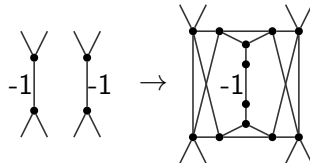
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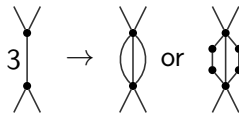
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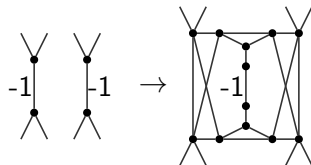


More details in the TD sheet.

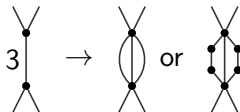
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More details in the TD sheet.

While  $PM \in \mathbf{P}$ ,  $\#PM \in \mathbf{\#P-complete!}$  (other example:  $\#2SAT$ )

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- ▶ (Planar) matchgates: family of quantum circuits efficiently simulable

## Tensors in Matchgates

Everything with 2-dimensional indices:

$$(\odot_r)_j^i = r^i \delta_j^i = \begin{cases} 1 & \text{if } i = j = 0 \\ r & \text{if } i = j = 1 \\ 0 & \text{if } i \neq j \end{cases}$$

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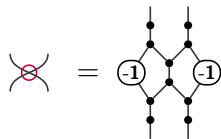
$$\text{X} = \text{Diagram} : |i, j\rangle \mapsto (-1)^{ij} |j, i\rangle \quad \text{i.e.} \quad \left( \text{X} \right)_{c,d}^{a,b} = (-1)^{ab} \delta_d^a \delta_c^b$$

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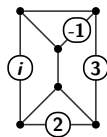
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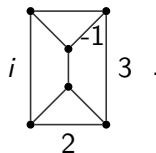
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computes the number of perfect matchings in



## Matchgate Computations

Let  $A = \begin{pmatrix} a_{00} & a_{01} \\ a_{10} & a_{11} \end{pmatrix}$ ,  $B = \begin{pmatrix} b_{00} & b_{01} \\ b_{10} & b_{11} \end{pmatrix}$

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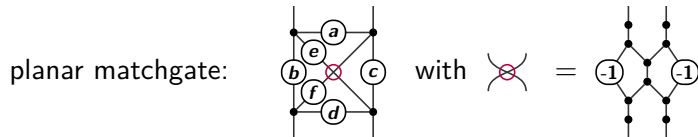
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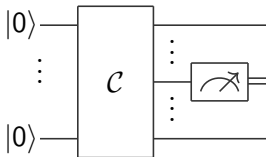
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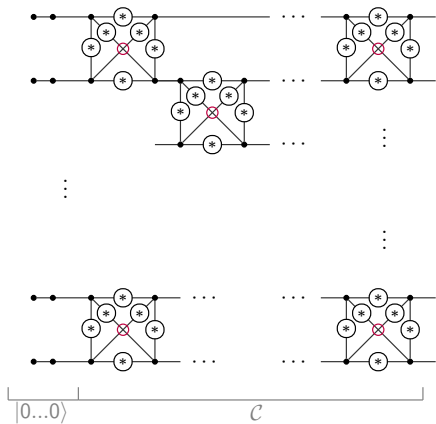
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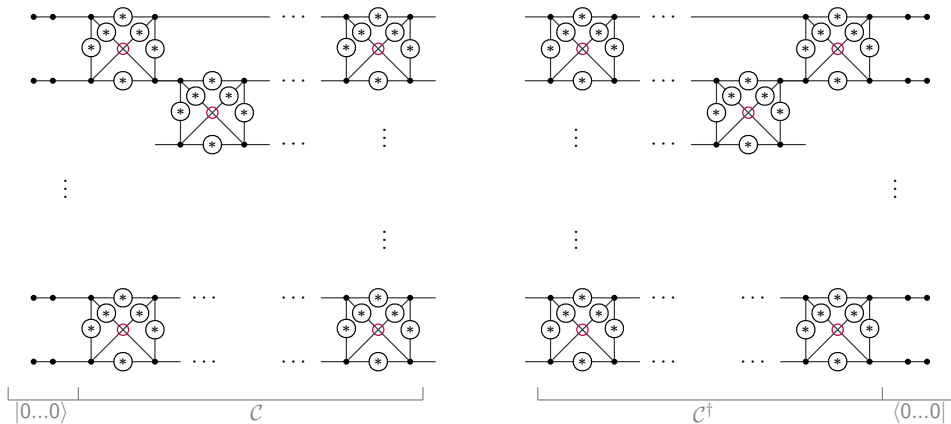
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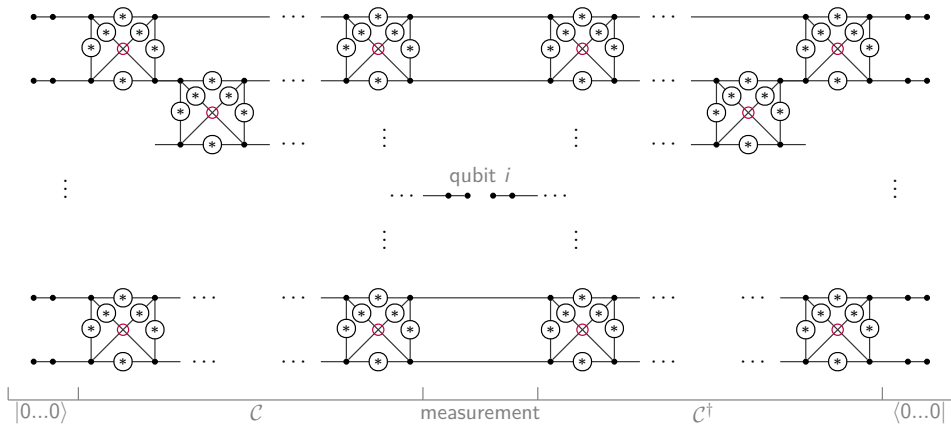
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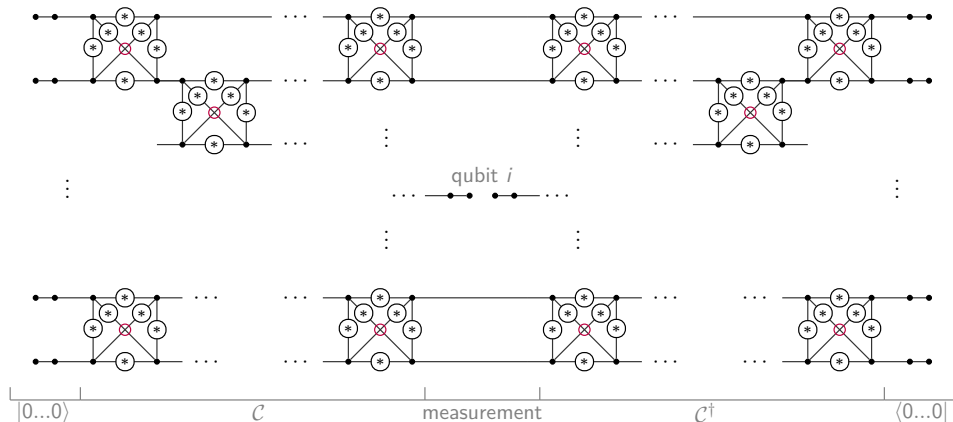
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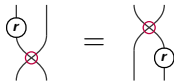
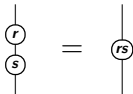
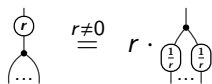
# Simulating Matchgates with Tensors



Interpretation in  $\mathcal{M}_{1 \times 1}(\mathbb{C}) \cong \mathbb{C}$ : a scalar, the probability we are looking for!  
 Alternatively: graph with complex edge weights.

# Simulating Planar Matchgates via Rewriting

- Weights can be moved around



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$$\begin{array}{c} \textcircled{r} \\ | \\ \bullet \\ | \\ \dots \end{array} \stackrel{r \neq 0}{=} r \cdot \begin{array}{c} | \\ \bullet \\ | \quad | \\ \textcircled{\frac{1}{r}} \quad \textcircled{\frac{1}{r}} \\ | \quad | \\ \dots \quad \dots \end{array}$$

$$\begin{array}{c} \textcircled{r} \\ | \\ \textcircled{s} \\ | \\ \dots \end{array} = \begin{array}{c} | \\ \bullet \\ | \\ \textcircled{rs} \\ | \\ \dots \end{array}$$

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- ▶ Fermionic swaps  $\times$  are dealt with like swaps

$$\begin{array}{c} \times \\ | \\ \dots \end{array} = \begin{array}{c} | \\ \textcircled{-1} \\ | \\ \dots \end{array}$$

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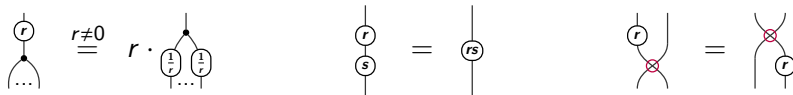
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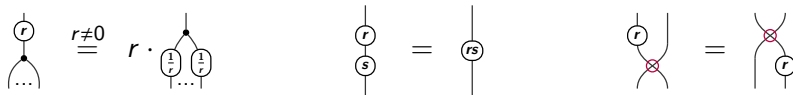



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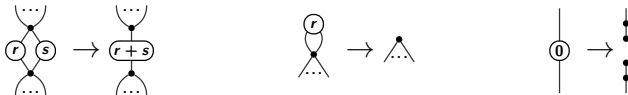
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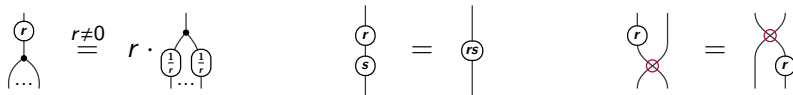



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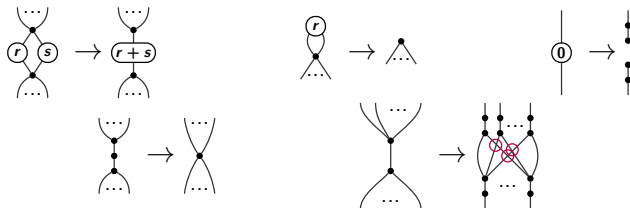
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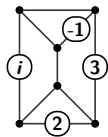
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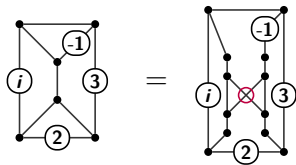
- ▶ Few rewrites



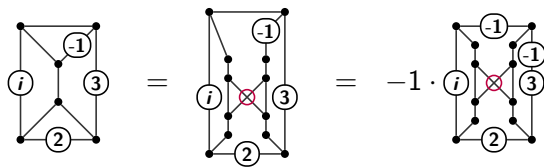
## Example



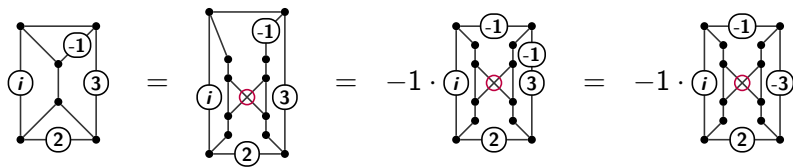
## Example



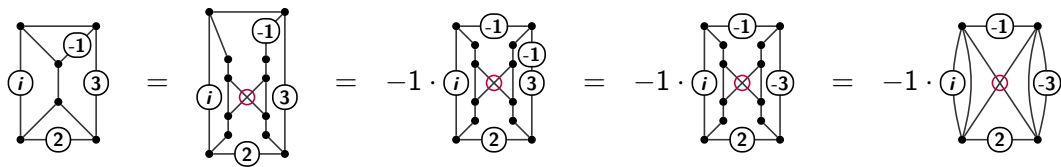
## Example



## Example

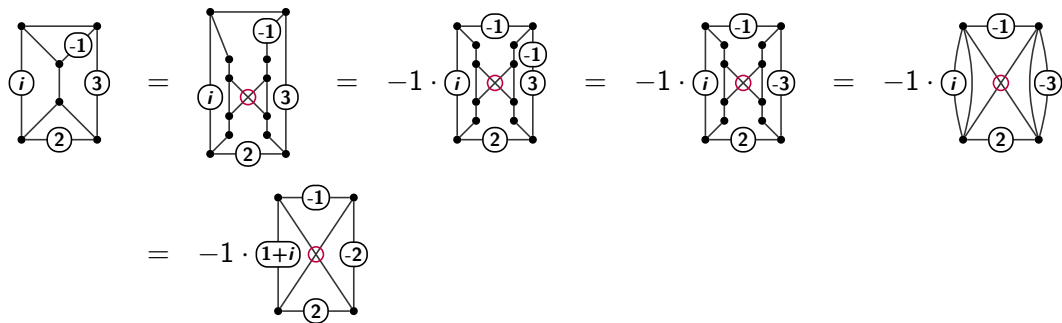


## Example

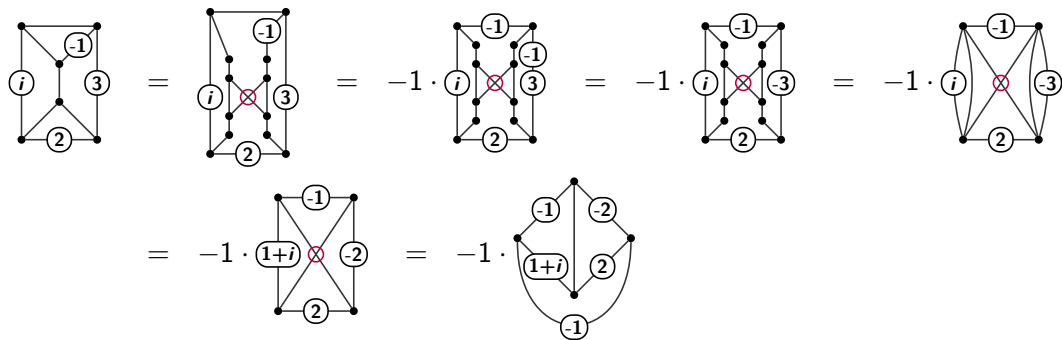




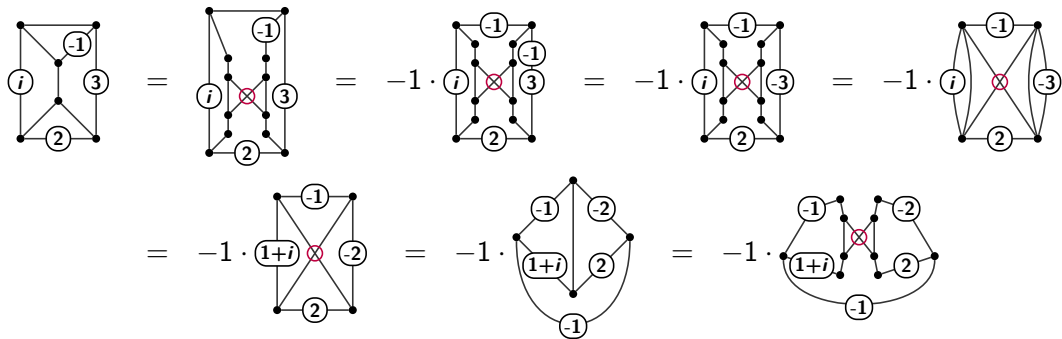
## Example



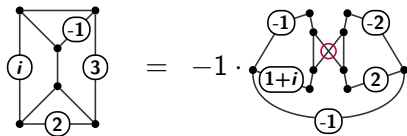
## Example



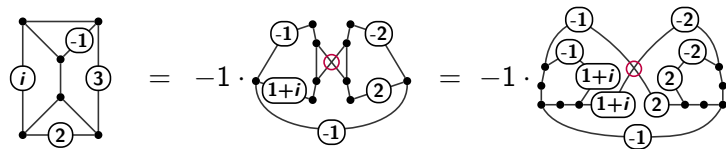
## Example



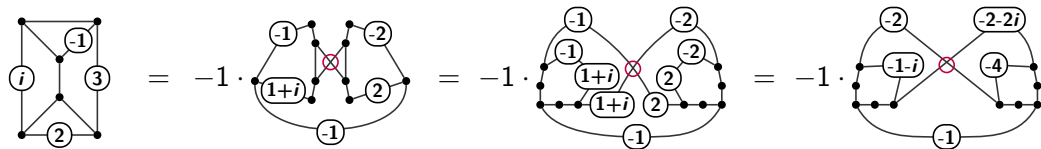
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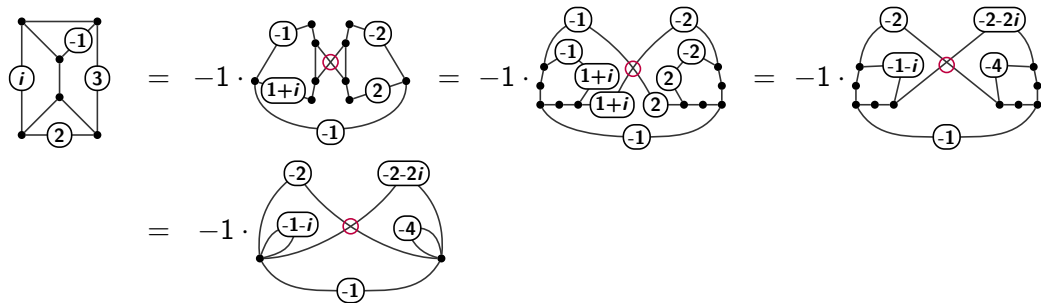
# Example



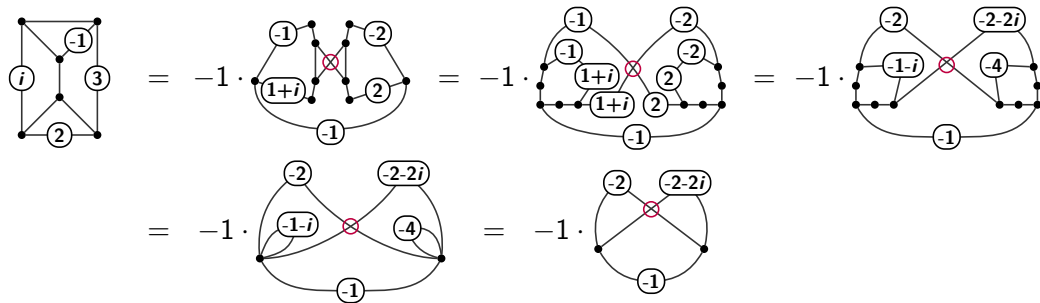
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## Example

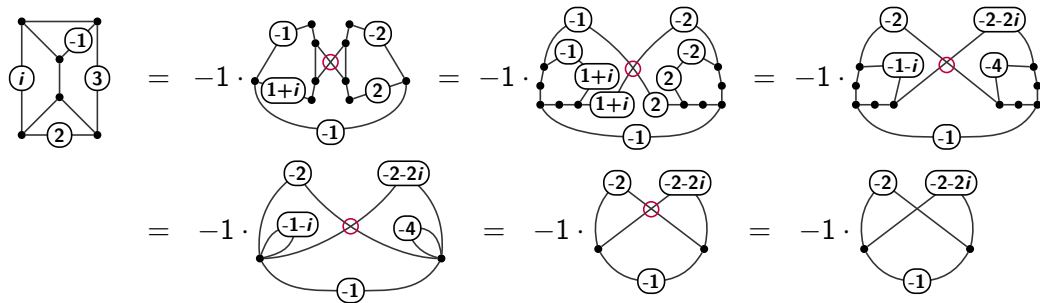


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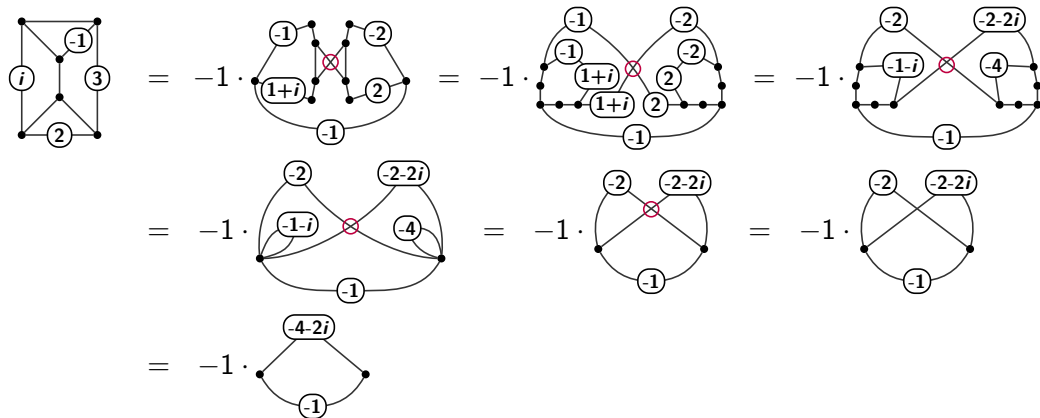




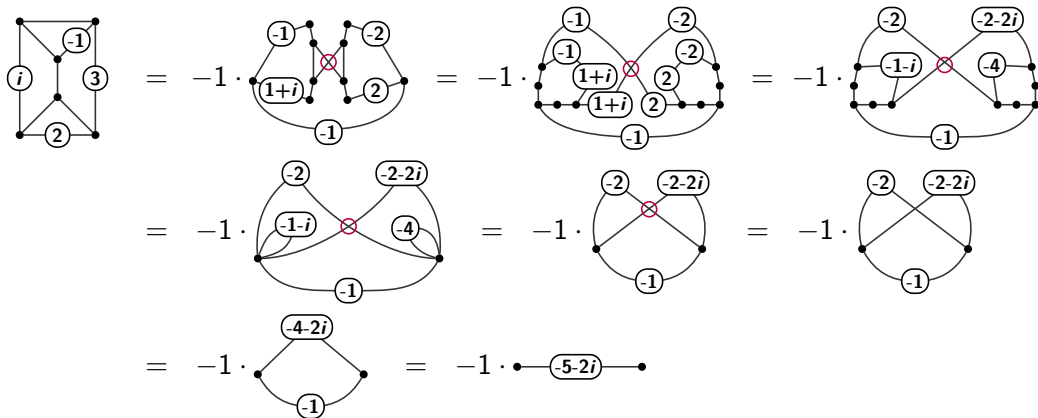
# Example



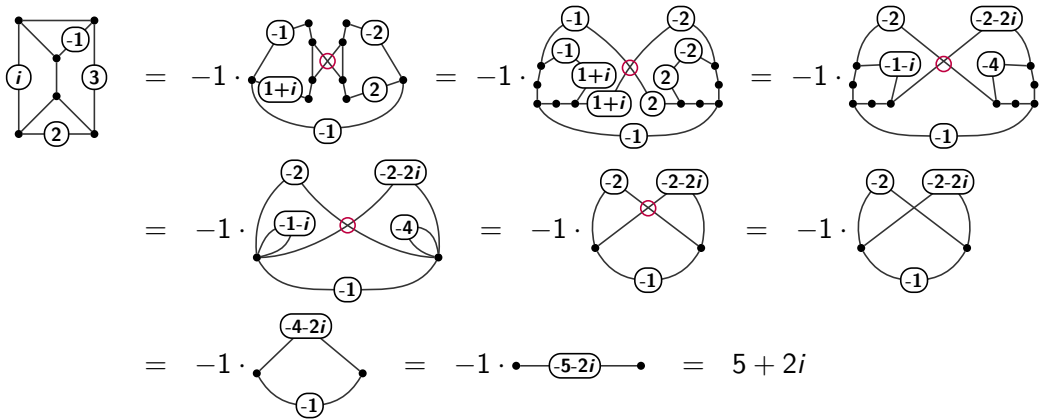
# Example



## Example



## Example



## Recap

- ▶ Deciding existence of solution to SAT problem: **NP-complete**

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- ▶ Deciding planarity: **P**