# Graphs - Coloring, partition and structure

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# Representation of discrete structures









A graph is a pair (V, E) where:

- V is a set of "points" called vertices.
- *E* is a set of "binary relations" (segments) between pairs of vertices called edges.



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One can notice that the resulting graph is planar, <u>i.e.</u> represented in the plane without intersection of edges.

# Why coloring graphs? (II)

- Avoid interference in wireless networks.
- Modelization of physical models (e.g. antiferromagnetics Potts models).
- Modelization of agents behavior in economy.
- Partitionning the graph into sets sharing some common behavior (clustering).





# Planar graphs



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### **Proof:**

Euler formula: Every planar graph satisfies:

$$V-E+F=2.$$

- We have  $F \leq 2E/3$ .
- Using Euler formula, we obtain:  $E \leq 3V 6$ .
- As ∑<sub>x∈S</sub> degree(x) = 2E < 6V</li>
  ⇒ There is a vertex of degree at most 5.





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Every planar graph can be properly colored with 4 colors.

- All the known proofs of this result are computer assisted.
- Why do we need a few number of colors? One reason could be: no clique (e.g. set of vertices pairwise incident) of size at least 5.

# General lower and upper bounds on the number of colors?



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Number of colors  $\geq$  size of a maximum clique.

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Let G be a graph with no triangle, can we color G with a constant  $(10^{1000})$  number of colors? NO !



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- Perfect graphs (Chudnovsky et al. '03).
- Maximal triangle-free graphs with no subdivision a given graph *H* (B., Thomassé '12).
- Graphs with no cycle with a fixed number of chords (Aboulker, B. '15).

• ...

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- Communication complexity: Yannakakis conjecture ('89). Partial results in (B., Lagoutte, Thomassé '14).
- Existence of special patterns in graphs: Erdős-Hajnal conjecture.

Partial results in (B., Lagoutte, Thomassé, '15).


















## A more dynamic model?





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### A few results:

- For planar graphs, any 8-coloring can be transformed into any other in a polynomial number of steps. (B., Perarnau '15). Best lower bound: 7.
- Any (tw(G) + 1)-coloring can be transformed into any other within a quadratic number of steps (Bonamy, B. '13). Tight.

### Motivations (in the physics comminity)

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- Obtain lower bounds on the mixing time of the Markov chain where
  - Elements are colorings.
  - There is a positive probability transition between two colorings if one can transform into the other by recoloring a single vertex.

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### The physicists want to:

- Find the mixing time of Markov chains on Glauber dynamics. We need to recolor only one vertex at a time.
- Generate all the possible states of a Glauber dynamics. We have no constraint on the method.



Let *a*, *b* be two colors.



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**Remark:** If a component is reduced to a single vertex, then the Kempe change consists in recoloring one vertex.  $\Rightarrow$  Kempe changes generalize single vertex recolorings.

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**Theorem** (Bonamy, B., Feghali, Johnson '15)

All the k-colorings of a connected k-regular graph with  $k \ge 4$  are Kempe equivalent.



Consequence in physics: Close the study of the Wang-Swendsen-Koteký algorithm for Glauber dynamics on triangular lattices.



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**Definition** (independent set)

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A proper coloring is a partition of the vertices into independent sets.



Clique partitions have many applications:

- In the theoretical world: a point from which we can start.
- In machine learning.
- Communities in social network.
- Big data.

### Coalition games

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- A superadditive valuation function v : 2<sup>n</sup> → N. (the money generated by the coalition S if agents of S decide to work on their own project)

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- A set *I* of *n* agents.
- A superadditive valuation function v : 2<sup>n</sup> → N. (the money generated by the coalition S if agents of S decide to work on their own project)

### Goal

Distribute money to the agents in such a way, for every coalition S, the money distributed to agents of S is at least v(S).  $\Rightarrow$  No coalition wishes to leave the grand coalition.

### **Definition** (core)

The core of the coalition game is the set of payoff vectors  ${\bf x}$  satisfying the following constraints:

 $\sum_{i \in I} x_i = v(I)$  The money we can distribute

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- Which conditions ensure that the core is not empty?
- Relax the definition of core.
- $\Rightarrow$  New bounds on some relaxations of the core (B., Li, Vetta).



# Planar triangulations $^{\rm 1}$



<sup>&</sup>lt;sup>1</sup>Thanks to Vincent Despré for his slides on this section.












 $\rightsquigarrow$  Associate to each internal vertex three incident edges and deduce a 3-orientation.



























































# Bijection






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Question: what about higher genus?

## Other topics related to my work

- VC-dimension.
- Spectrum auctions.
- Flow-cuts problems.
- Voronoi diagram and Delaunay triangulations.

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Thanks for your attention