

Ideas from **exact and approximative**  
**classic and recent**  
Combinatorial Optimization:  
Matchings, Edge-colorings and the **TSP**

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## 1. Basics

## 2. Edge-colorings Tashkinov (2000) for me: dec. 2017

## 3. Algorithms

Method of variables, class RP

Exact Matchings (Yuster, 2012 ), for me: June 2018

Edmonds' algorithm

## 4. Undirected shortest paths

Conservativeness, T-joins, Algorithms

## 5. Polyhedra, weights, Linear Programming

Approximation: **additive error of 1** for edge-coloring and exact matching

Randomized algorithms, LP lower bound

Exercises : series 1-5

# Part B : TSP

## 1. Classical

$s=t$ , General metric

## 2. Two-edge-connected spanning subgraph

ear theorems `graph TSP' ,  $s=t$  (S., Vygen) 2014

Submodular functions, matroids

matroid intersection and approx. of submod max

## 3. General $s,t$ path TSP

Zenklusen's  $3/2$  approx algorithm (April 2018)

# 1. Basics

# Matching

$G=(V,E)$  graph.

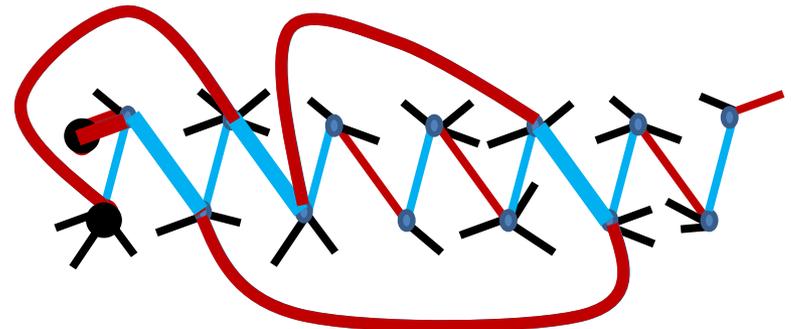
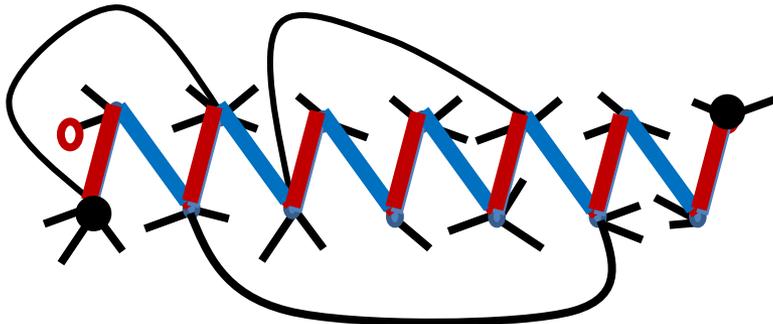
*matching* : a set  $M \subseteq E$  of vertex-disjoint edges.

*perfect matching* : In addition  $M$  partitions  $V$ .

INPUT :  $G=(V,E)$  graph.

TASK : Find a matching of maximum size

Do the red edges form a maximum matching ?



# Augmenting Paths

*augmenting path* with respect to matching  $M$  : path alternating between  $M$  and  $E \setminus M$  with the 2 endpoints uncovered by  $M$ .

Proposition (Berge) :  $G$  graph,  $M$  matching in  $G$ .  
 $M$  is a maximum matching in  $G$  iff there is no augmenting path

Matching polytope: =  $\text{conv} ( \chi^M : M \text{ matching} )$

$$\chi_M(e) = \begin{cases} 1 & \text{if } e \in M \\ 0 & \text{if } e \notin M \end{cases}$$

Perfect matching polytope: =  $\text{conv} ( \chi^M : M \text{ perfect matching} )$

# Interpretation with random sampling

$x = \sum_{M \in \mathcal{M}} \lambda_M \chi_M$ , ( $\lambda_M \geq 0$ ,  $\sum_{M \in \mathcal{M}} \lambda_M = 1$ ),  $\mathcal{M}$  a set of p.m.

$\mathcal{M}$  can be viewed as a p.m. valued random variable

$$\begin{aligned} \Pr(\mathcal{M} = M) &= \lambda_M \\ \text{Then for } e \in E: \quad \Pr(e \in \mathcal{M}) &= x(e) \\ E[\mathcal{M}] &= x \end{aligned}$$

Particular distributions (max entropy, or comb. restrictions)

**Our use is notational, mainly:  $E[\mathcal{F} + \mathcal{J}] = E[\mathcal{F}] + E[\mathcal{J}]$**

# Matching and vertex cover

*matching* :  $M$  set of vertex-disjoint edges

Max  $|M|$  :  $\upsilon$

*vertex cover* :  $T$  set of vertices so that  $G-T$  has no edges

Min  $|T|$  :  $\tau$

$$\upsilon \leq \tau$$

# Min max

Theorem (Kőnig) : If  $G=(V,E)$  is bipartite, then  $\nu(G)=\tau(G)$

Exercise 1.2

**Proof:**  $\leq$  is the proven 'easy part';  $\geq$  is to be proved:

If for some  $v \in V$  :  $\nu(G - v) = \nu(G) - 1$  , by induction :

$$\nu(G) = \nu(G - v) + 1 = \tau(G - v) + 1 \geq \tau(G) .$$

If  $uv \in E$  then **either  $u$  or  $v$  satisfy** this condition !

Exercise 1.1

**Q.E.D.**

## 2. Edge-coloring

**Def** :  $G=(V,E)$ . *edge-coloring* : each color is a matching

*Edge-chromatic number = chromatic index =  $\chi'$  := min n. of colors*

# Bipartite edge-coloring

**Theorem (Kőnig)** : If  $G=(V,E)$  is bipartite, then  $\chi'(G)=\Delta(G)$

Exercise 2.2

**Proof:** Now  $\geq$  is now the 'easy part';  $\leq$  is to be proved:

If  $uv \in E$  is not yet colored then **u , v both miss some color !**

If it is the same color or can be recolored so : DONE

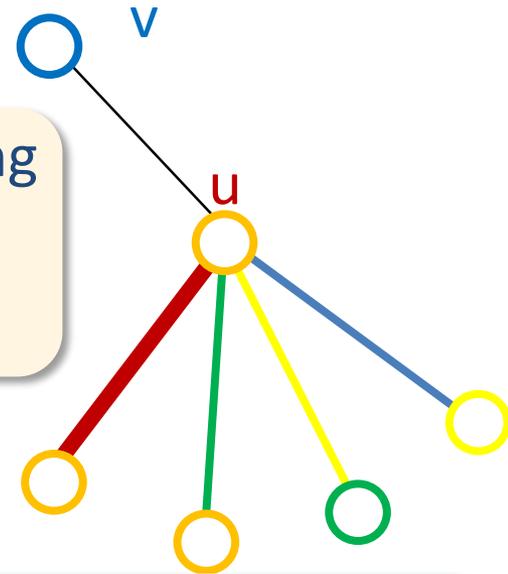
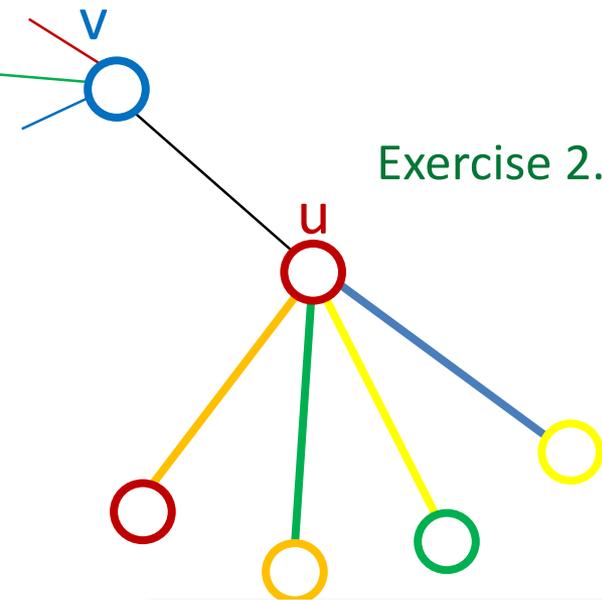
If not, they are joined by an even path:



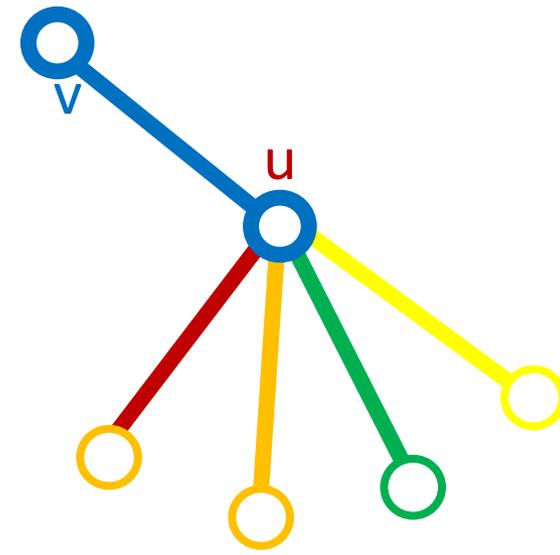
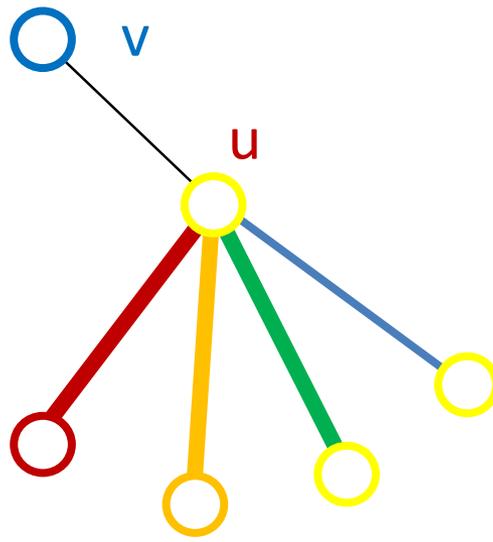
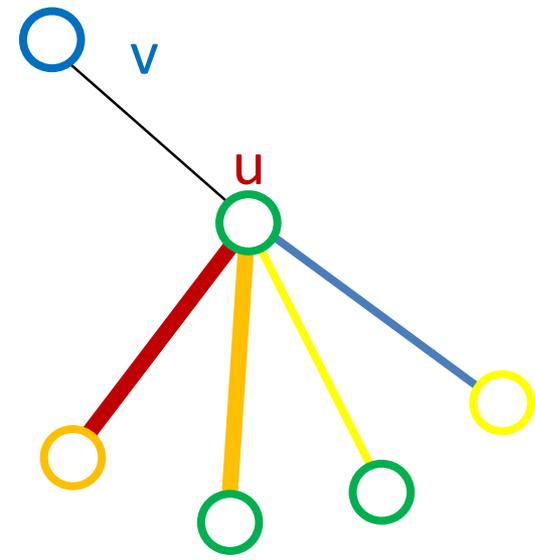
# Tashkinov tree 1

Exercise 2.3

BFS tree  $F$  from  $\{u, v, uv\}$  using only edges whose color has already been missed before



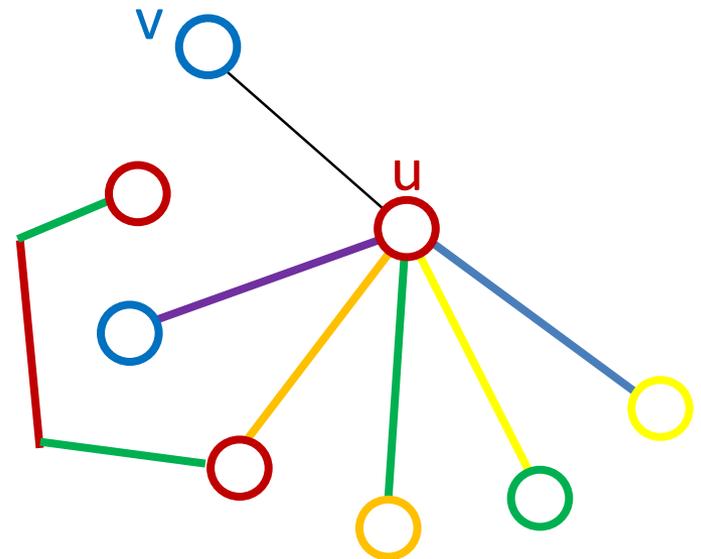
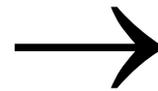
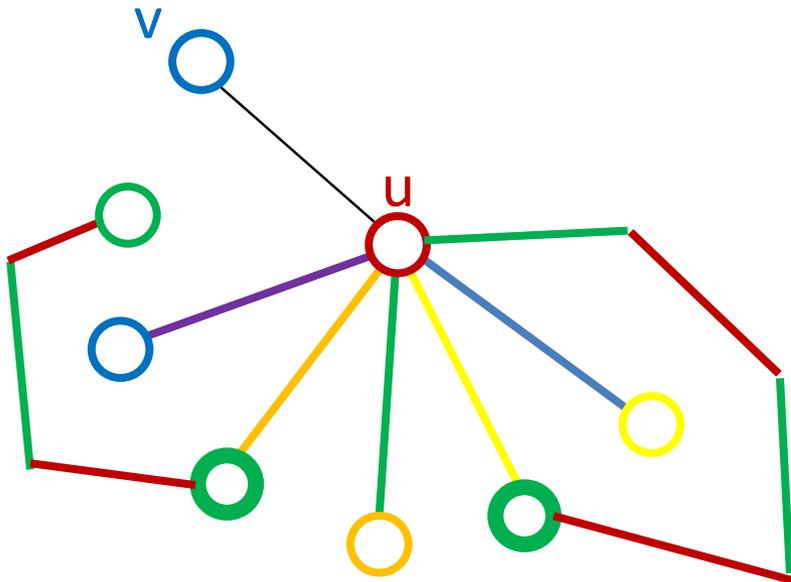
a. There is a common missing color in  $u$  and  $N(u)$  on  $F$   
 $\Rightarrow uv$  can be colored



# Tashkinov tree 2

b. There are two neighbors of  $u$  in  $F$  missing the same color  
 $\Rightarrow uv$  can be colored

swap a red-green component



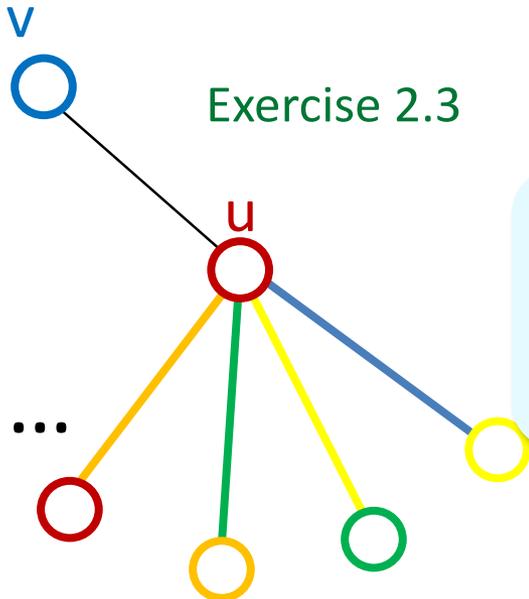
*Reduced to Case a.*

# Vizing's theorem

**Theorem:** If  $G=(V,E)$  is simple, then  $\chi(G) \leq \Delta(G) + 1$

Exercise 2.4

**Proof:** Color as much as you can with  $\Delta(G) + 1$  colors.  
Then : **every vertex has always a missing color !**



either a. or b. :

- There is a common missing color in  $u$  and  $N(u)$  on  $F$
- There are two neighbors of  $u$  in  $F$  missing the same color

either  $\Rightarrow uv$  can be colored

# Tashkinov's theorem

Generalizing the above proof :

**Theorem:** If such a BFS tree has two vertices missing the same color, then all colored edges + edge  $uv$  can be colored .

**Corollaries:** Better and better edge-coloring

# 3. Algorithms

Method of variables, class RP

Exact Matchings

Edmonds'algorithm

# The method of variables (Tutte, Lovász, Geelen,...)

$G = (A, B, E)$  bipartite,  $|A|=|B|$ .  $M := (x_{ij} \text{ if } ij \in E, \text{ else } 0)_{n \times n}$  :

**Proposition** :  $\det(M)$  is a nonzero polynomial  $\Leftrightarrow \exists$  perfect matching

**Proof** : All terms of  $M$  are different, so there is no cancellation.

$n!$  Terms, but determinants can be computed in polynomial time :  
**randomized algorithm: substitute values and then compute !**

**Questions** : If then the det is nonzero can we conclude ?

If it is zero ?

What to do for nonbipartite graphs ?

# The method of variables

The probability of error, precisely

**Lemma:** (Schwartz, Zippel) Let  $q$  be a nonzero polynomial of  $n$  variables  $x_1, \dots, x_n$ , and let it be of degree  $d$ ;  $S \subseteq \mathbb{N}$  is finite,  $s := |S|$ . Moreover, let  $X_1, \dots, X_n$  be random variables taken independently and uniformly from  $S$ .  
Then  $\Pr(q(X_1, \dots, X_n) = 0) \leq d/s$ .

**Proof:** For  $n=1$  obvious. Let  $p \in \mathbb{Q}[x_1, \dots, x_{n-1}]$  the coefficient of the highest power  $\mu$  of  $x_n$ , and let  $\pi$  be the degree of  $p$ .

$$\begin{aligned} \Pr(q(X_1, \dots, X_n) = 0) &\leq \Pr(p(X_1, \dots, X_{n-1}) = 0) + \Pr(q(X_1, \dots, X_n) = 0 \mid p(X_1, \dots, X_{n-1}) \neq 0) \\ &\leq \pi/s + \mu/s \leq d/s \end{aligned}$$

# The method of variables

## A Randomized Algorithm

### Oracle Algorithm :

An oracle tells the substitution values of a polynomial in  $\text{pol}(\text{deg})$  time.

1. Let  $S = \{1, \dots, 2n\}$ .
2. Make independent uniform choices in  $S$  for each variable.
3. Compute the polynomial (oracle call) for the chosen values.
  - If  $\neq 0$  : the polynomial is nonzero ( $\exists$  perfect matching)
  - If  $= 0$  ? **We decide: no perfect matching:  $\Pr(\text{error}) \leq \frac{1}{2}$**

**Why not bigger  $S$  ? Better to choose  $|S| = \text{const} \times \text{deg}$  and repeat !**

**Proposition :** After  $O(\log 1/\varepsilon)$  repetitions  $\Pr(\text{error}) \leq \varepsilon$

# The complexity class $P \subseteq RP \subseteq NP$

$\Sigma$  alphabet

$$L \subseteq \Sigma^*$$

$$L \in NP \Leftrightarrow \exists R_L : \Sigma^* \times \Sigma^* \rightarrow \{0,1\}$$

$$x \notin L : R(x,y) = 0 \quad \forall y \in \Sigma^*$$

$$x \in L : \exists y \in \Sigma^* : R(x,y) = 1$$

Imagine :  $x$  = a graph,  $y$  the certificate (eg a substitution with  $\neq 0$  polynomial value )

$$L \in RP \Leftrightarrow \begin{array}{c} \text{--- " --- } x \rightarrow y_x \\ \text{--- " ---} \end{array}$$

$$x \in L : \{y \in \Sigma^* : R(x,y) = 1\} \geq \frac{|Y_x|}{2}$$

The same def as NP but there are many certificates : **constant proportion**

# Randomized algorithms for matching generalizations

**RP** thought of  $\cong$  **P**

$G = (A, B, E)$  **bipartite**,  $n = |A| = |B|$ .  $M := (x_{ij} \text{ if } ij \in E, \text{ else } 0)_{n \times n}$

$G = (V, E)$ ,  $n = |V|$  skew symm  $M := (x_{ij} = -x_{ji} \text{ if } ij \in E, \text{ else } 0)_{n \times n}$

**'Tutte matrix'** : square of the 'Pfaffian'. **Good for testing !**

**Path matchings** (Cunningham, Geelen)

**Exact matching:** Given  $R \subseteq E$ ,  $k \in \mathbb{N}$ , a max matching  $M$ ,  $|M \cap R| = k$ .

$\exists$  Exact matching  $\Leftrightarrow$  multiplying  $x_{ij}$  for  $ij \in R$  by  $y$  in the Tutte matrix, the coeff of  $y^k$  is not the 0 pol:  $\forall$  substitution this pol can be evaluated with  $n+1 \times n+1$  lin equ;  $\in$  RP (Lovász 1979) and not known to be in P !

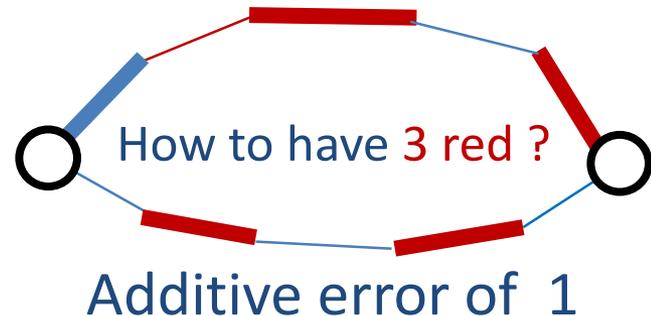
# Approximation for exact matchings

**Theorem :** (Yuster 2012)  $G=(V,E)$  graph,  $R \subseteq E$ ,  $k \in \mathbb{N}$ , then Exactly one of the following possibilities holds :

- (i) Each maximum matching of  $G$  meets  $R$  in  $< k$  edges.
- (ii) Each maximum matching of  $G$  meets  $R$  in  $> k$  edges.
- (iii) There exists a matching **of size at least  $\nu(G) - 1$**  that meets  $R$  in  $= k$  edges

**Remark:** (i), (ii) certified, checked in polytime (weighted match.)

**Proof:** If neither (i) nor (ii) holds,  
Then  $M_1$  : **R-min** max matching  
 $M_2$  : **R-max** max matching



# Tutte-Berge theorem

**Theorem :** Let  $G=(V,E)$  be a graph. Then the minimum, over all matchings  $M$  of the number of uncovered vertices of  $V =$

$$\max \{ q(X) - |X| : X \subseteq V \}$$

**Def :**  $q(X)$  is the n. of comps of  $G-X$  having an odd number of vertices

**Proof :**  $\geq$  : easy.

$\leq$  : We can adapt the proof of König's theorem: [Exercise 1.4](#)

- If  $v(G - v) = v(G) - 1$ , induction is easy.

- If  $v(G - u) = v(G - v) = v(G)$ , apply [Exercises 1.1, 1.3, 1.5 extended](#).

**Hint :** Observe that the new vertex is uncovered by a (actually two) maximum matching of the contracted graph. Can it be in  $X$  ? See [Exercise 1.5](#).

**Q.E.D.**

# Edmonds' algorithm

1. Grow an (inclusionwise max) alternating forest  $F$  rooted in uncovered vertices

2. If two even vertices are adjacent

a.) between 2 different components : augment

b.) in the same component :

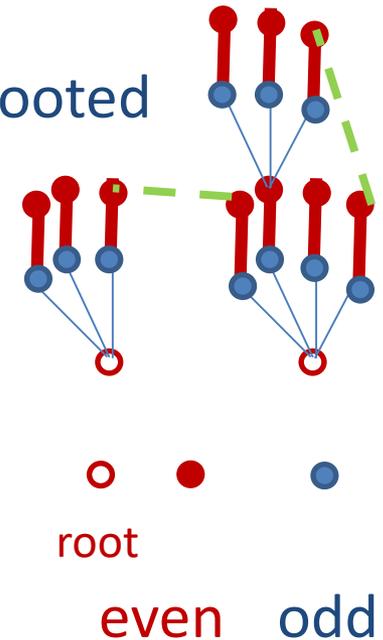
Adapt Exercise 1.3 to this case.

Heureka you shrink ! (Edmonds)

In both cases **GOTO 1** (possibly using the actual forest).

3. If there is no edge between the **even** vertices **STOP**

$X :=$  odd vertices



**Theorem :**  $X$  is a Tutte-set and  $F$  is a maximum matching

# Summary of algorithms for matchings

## Unweighted :

- Algorithms for bipartite graphs: paths in digraphs;
- Method of variables
- Edmonds' algorithm;
- Structural algorithms (for matchings by Lovász, S.:T-joins, b-match)

## Weighted : Mainly two possibilities

- **Primal-Dual framework with max cardinality subroutine**
- Ellipsoid method