



De la géométrie algorithmique

au calcul géométrique

l'exemple

de la triangulation de Delaunay

Les grands classiques

Géométrie algorithmique

Problème géométrique

Analyse des performances

Borne inférieure

Borne supérieure

Complexité asymptotique

Analyse dans le cas le pire

Analyse en moyenne



Borne inférieure pour
la triangulation de Delaunay

$$\Omega(f(n))$$

Il n'existe pas d'algorithme

résolvant toutes
les instances du problème

avec moins de $f(n)$ opérations

Borne inférieure pour le tri

Borne inférieure pour le tri

Trier \iff trouver une permutation

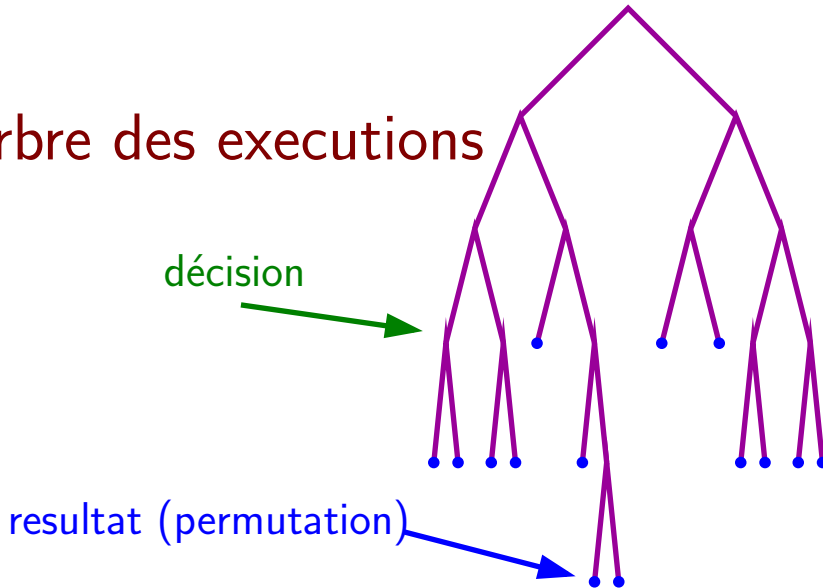
Borne inférieure pour le tri

Trier \iff trouver une permutation

Ordre $\neq \implies$ exécution \neq

Borne inférieure pour le tri

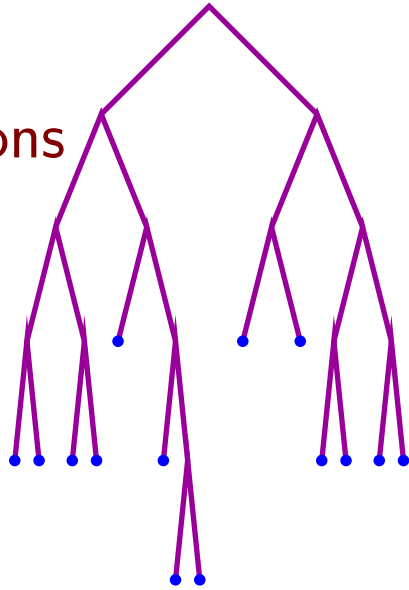
Arbre des executions



Borne inférieure pour le tri

Arbre des executions

Arbre binaire
 $n!$ feuilles



hauteur $\geq \log_2 n! \simeq n \log n$

Borne inférieure pour le tri

$$\Omega(n \log n)$$

Borne inférieure pour Delaunay

Delaunay sert à trier

Borne inférieure pour Delaunay

Delaunay sert à trier

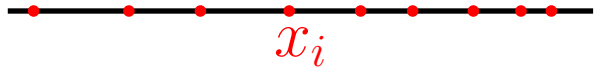
Prendre un problème de tri

Supposer que l'on sait faire Delaunay

Utiliser Delaunay pour trier

Borne inférieure pour Delaunay

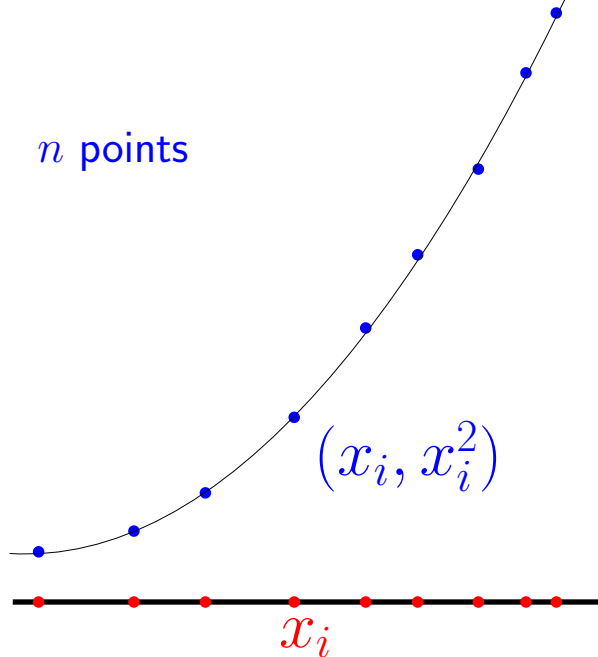
x_1, x_2, \dots, x_n à trier



Borne inférieure pour Delaunay

x_1, x_2, \dots, x_n à trier

$(x_1, x_1^2), \dots, (x_n, x_n^2)$ n points



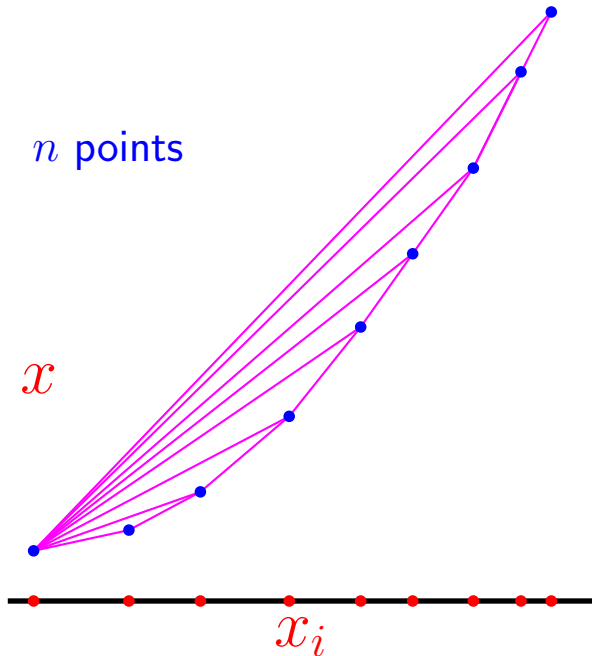
Borne inférieure pour Delaunay

x_1, x_2, \dots, x_n à trier

$(x_1, x_1^2), \dots, (x_n, x_n^2)$ n points

Delaunay

→ ordre en x



Borne inférieure pour Delaunay

x_1, x_2, \dots, x_n à trier

$(x_1, x_1^2), \dots, (x_n, x_n^2)$

n points

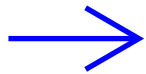


$O(n)$

Delaunay



$f(n)$



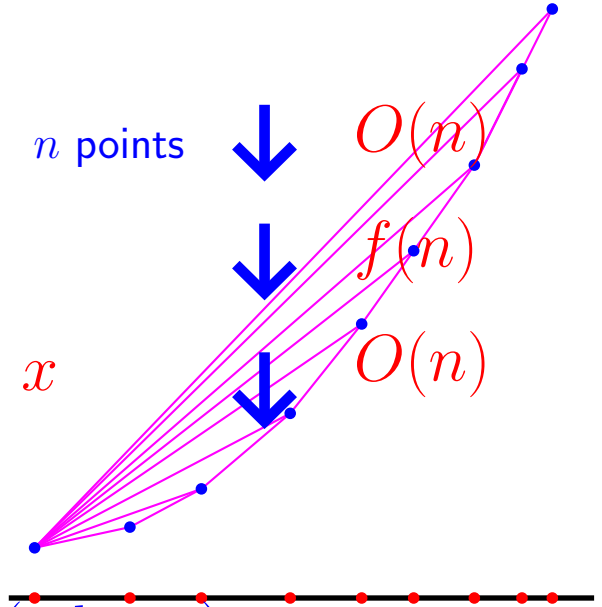
ordre en x



$O(n)$

$O(n) + f(n) \in O(n \log n)$

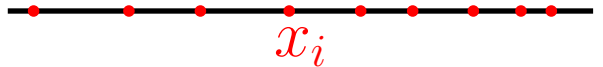
x_i



Borne inférieure pour Delaunay

x_1, x_2, \dots, x_n à trier

$$\Omega(n \log n)$$





Algorithmes optimaux pour
la triangulation de Delaunay

Produire des algorithmes optimaux

Complexité asymptotique
Dans le cas le pire

Division-fusion

Algorithme de balayage



Algorithmes optimaux pour
la triangulation de Delaunay

Balayage

Balayage

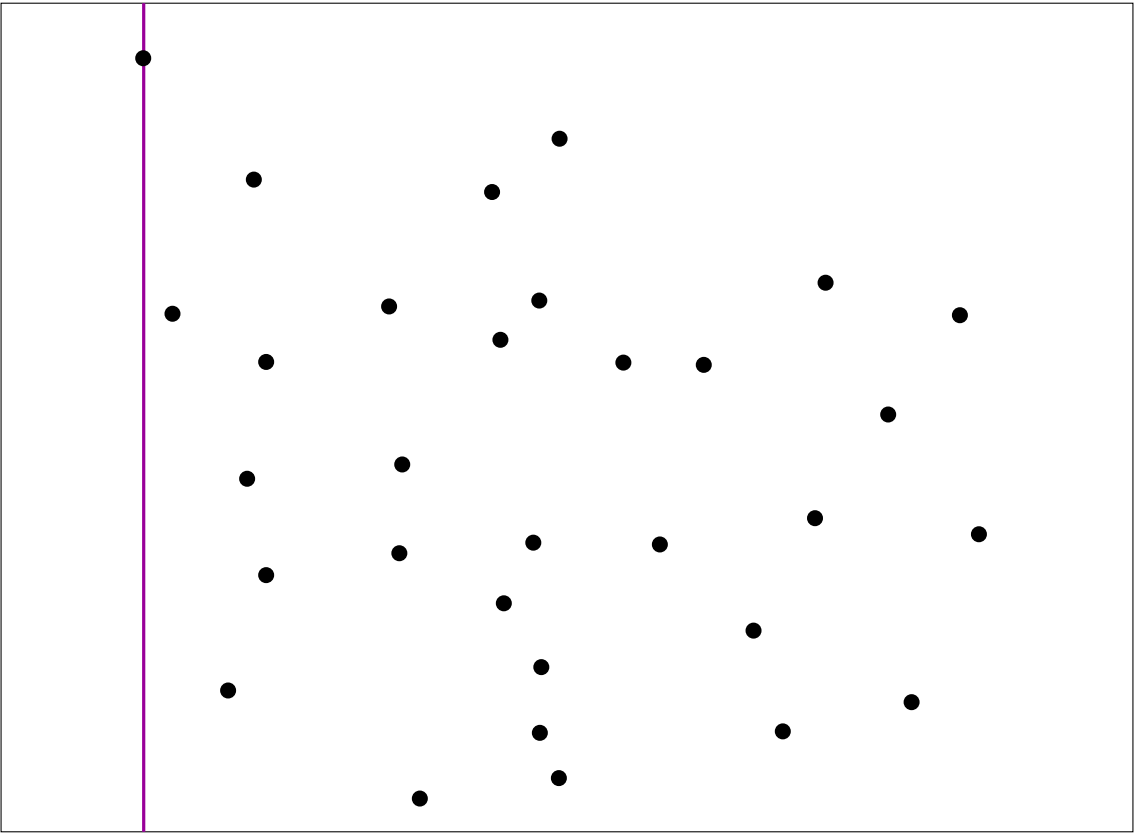
Couper le problème 2D par un objet 1D

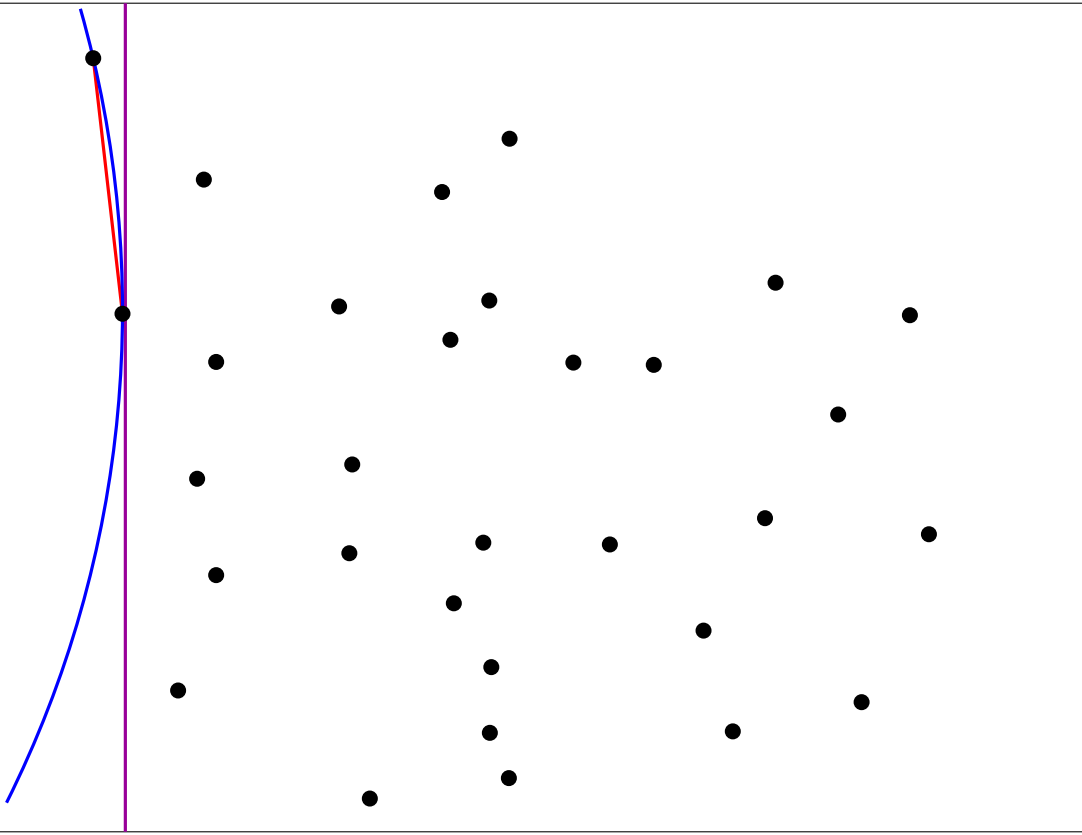
Déplacer l'objet

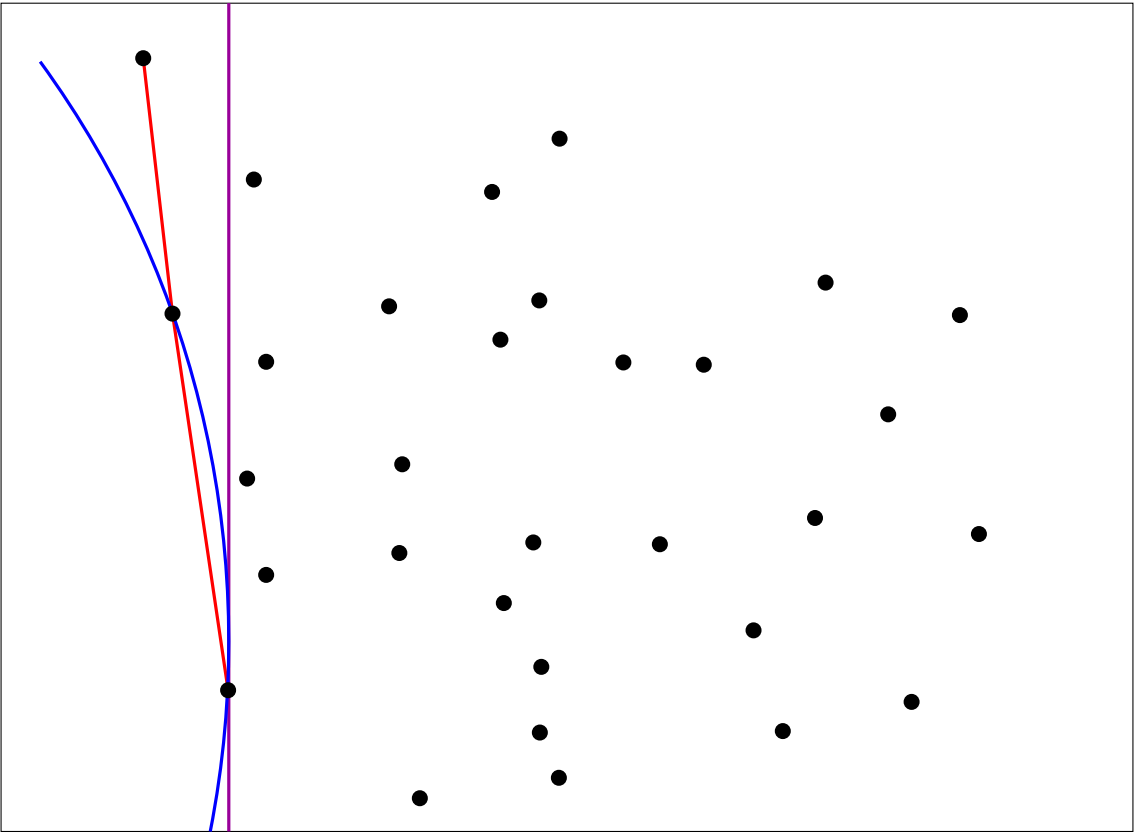
Voronoi [Fortune]

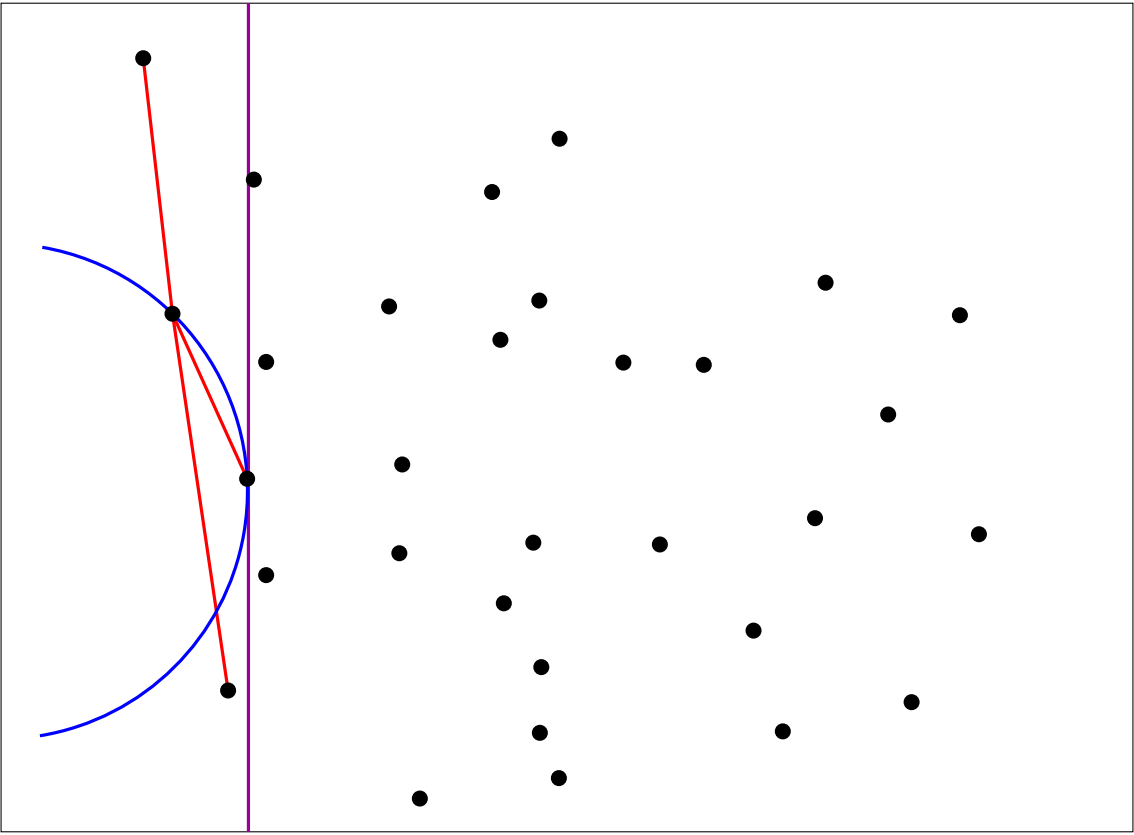
Présentation duale sur Delaunay

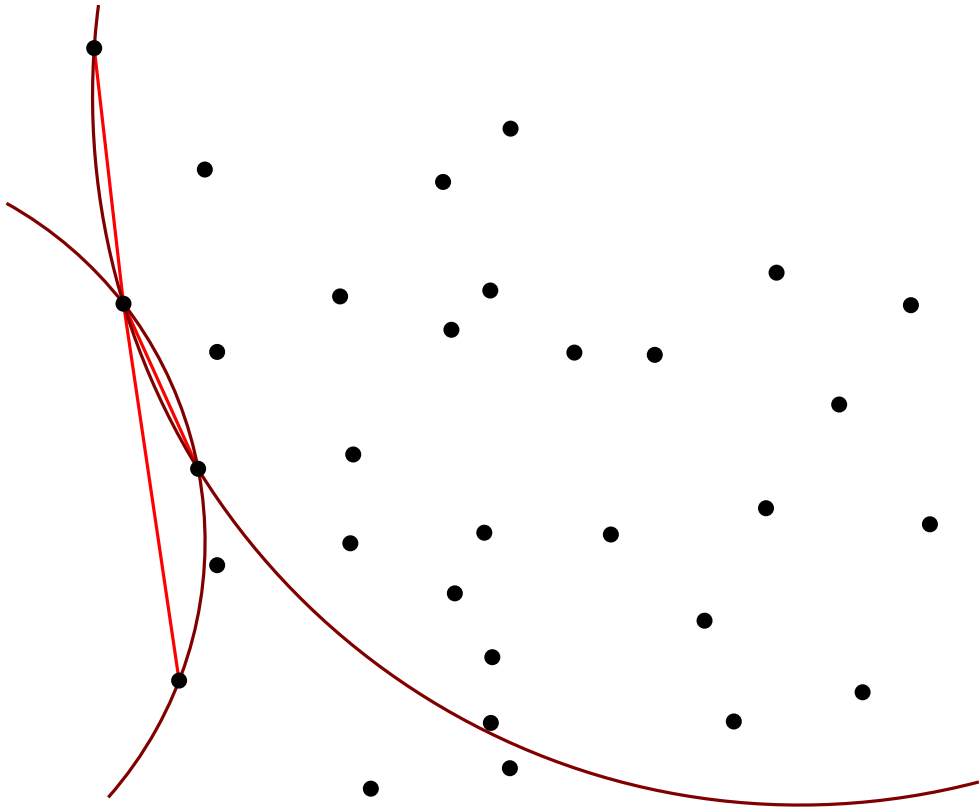




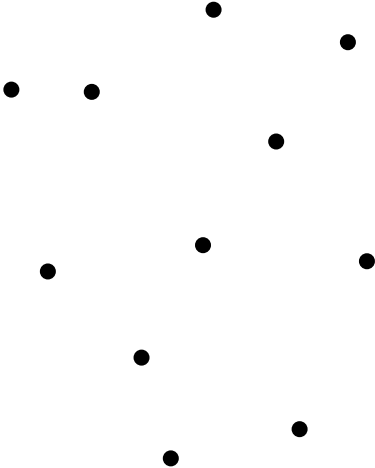
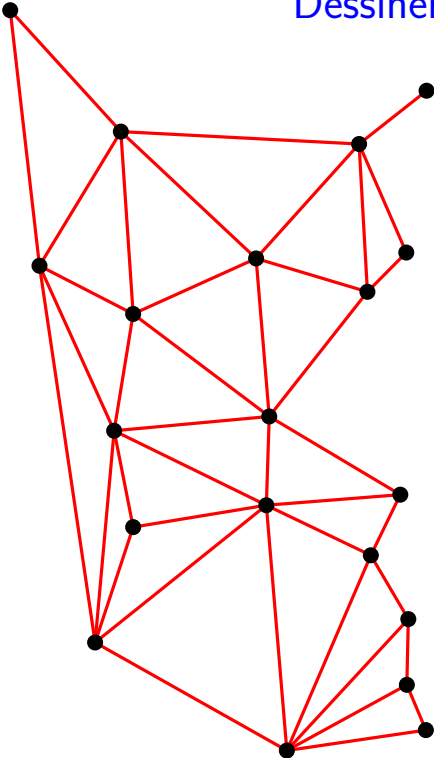


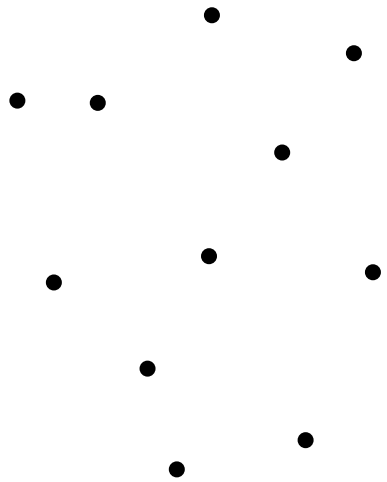
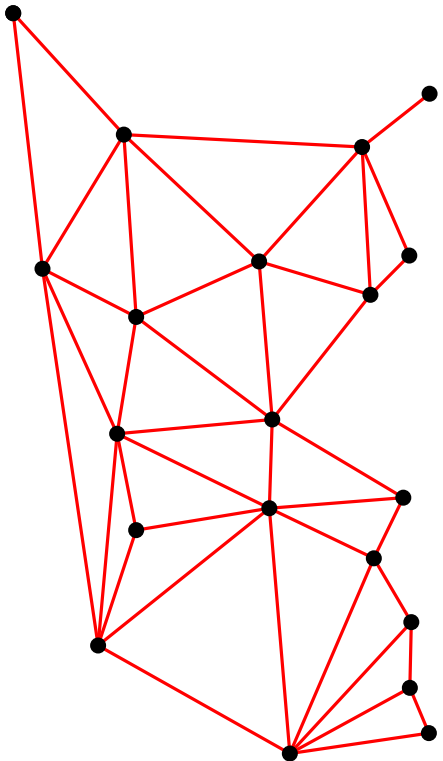




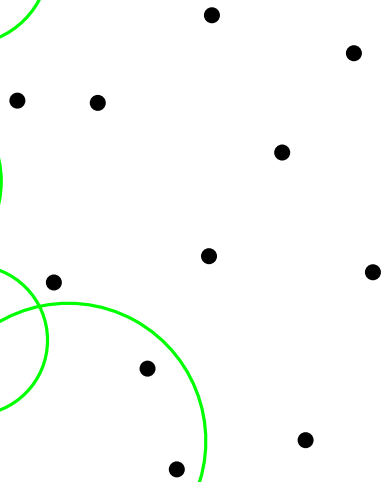
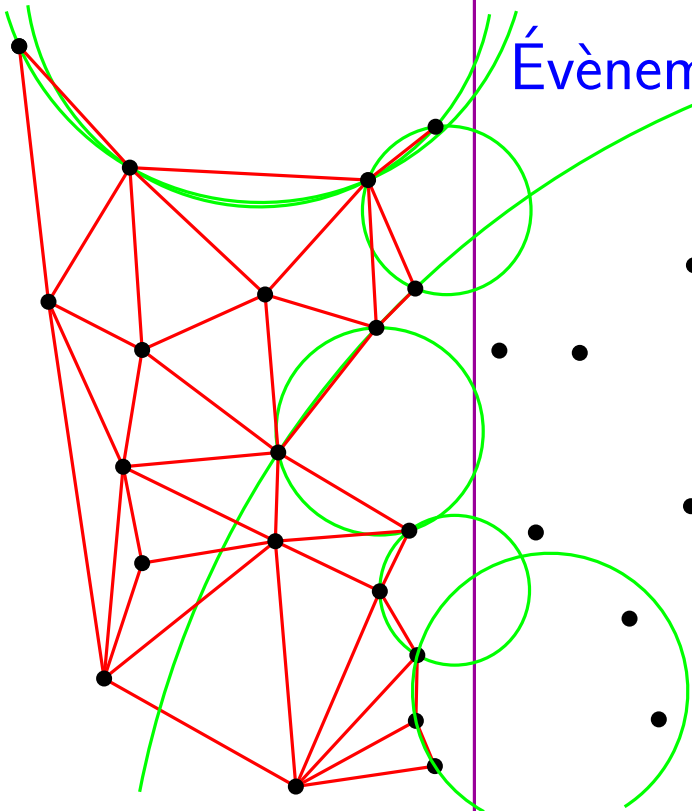


Dessiner une arête quand elle est sûre

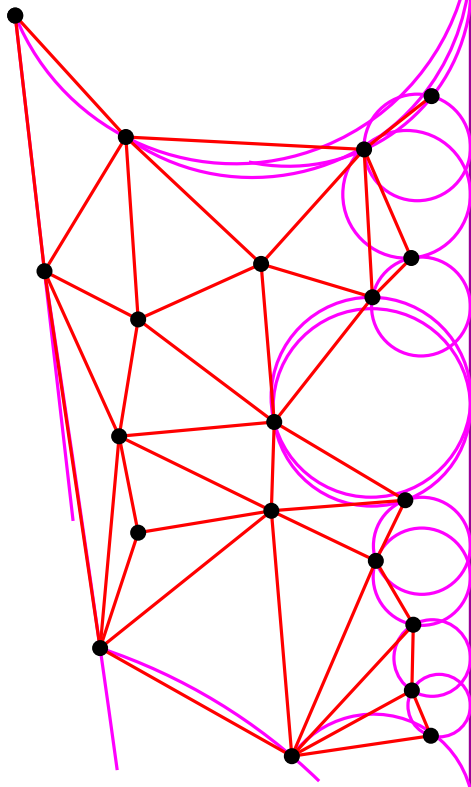




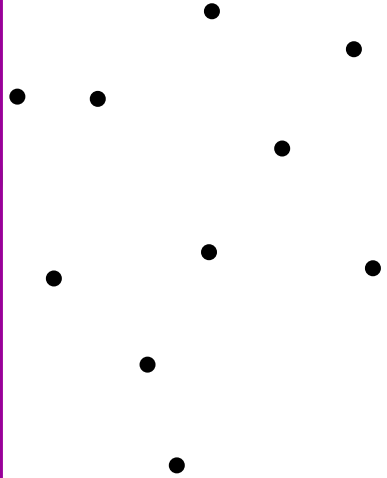
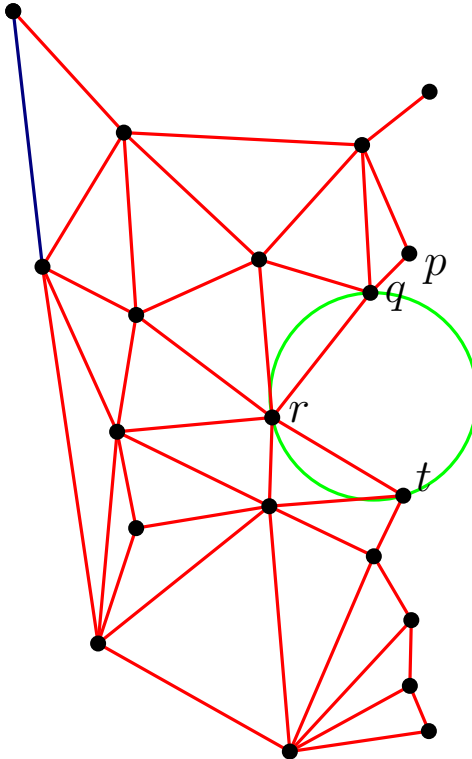
Évènements cercle

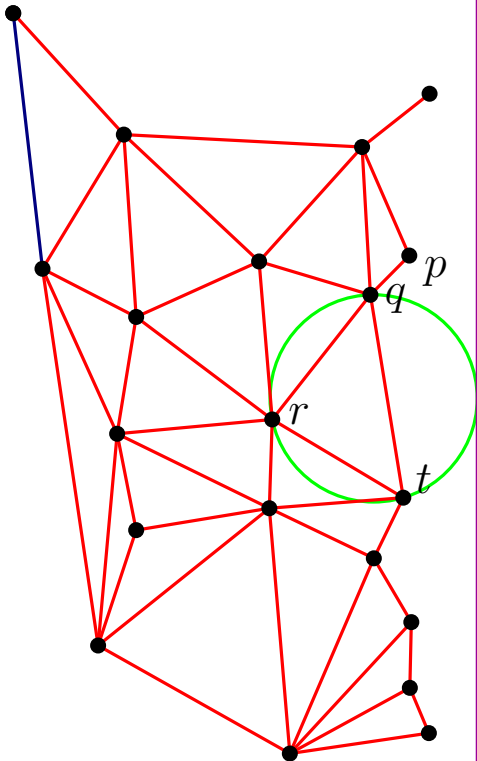


Front de balayage

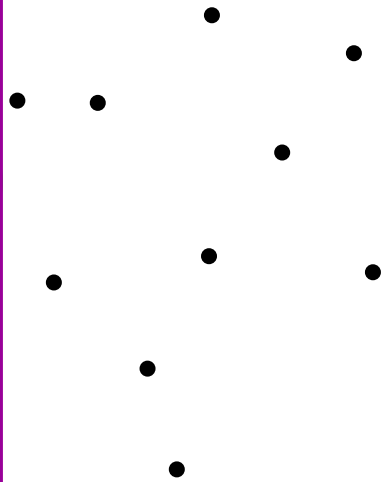


Évènement cercle

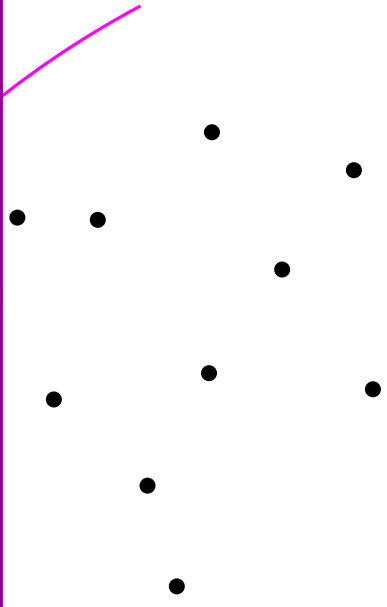
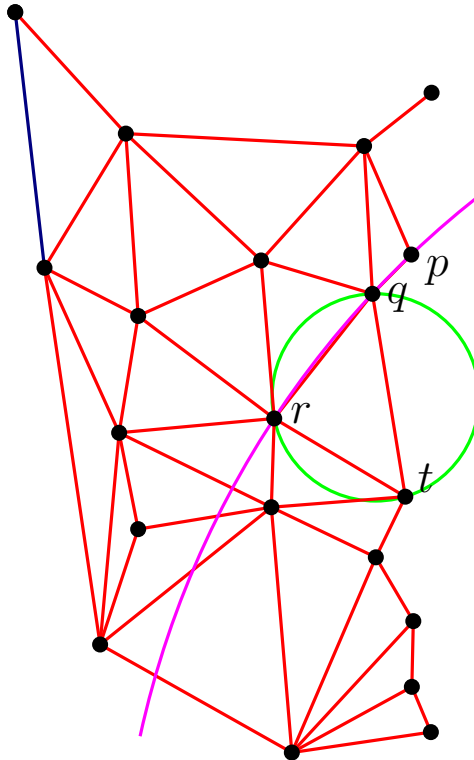




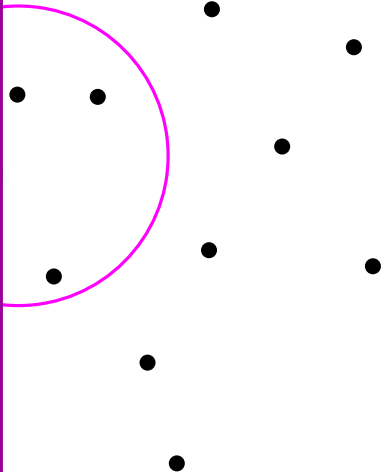
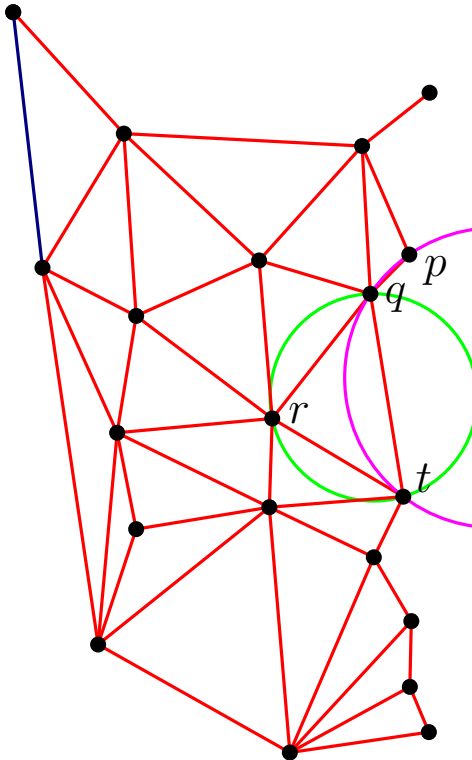
Évènement cercle

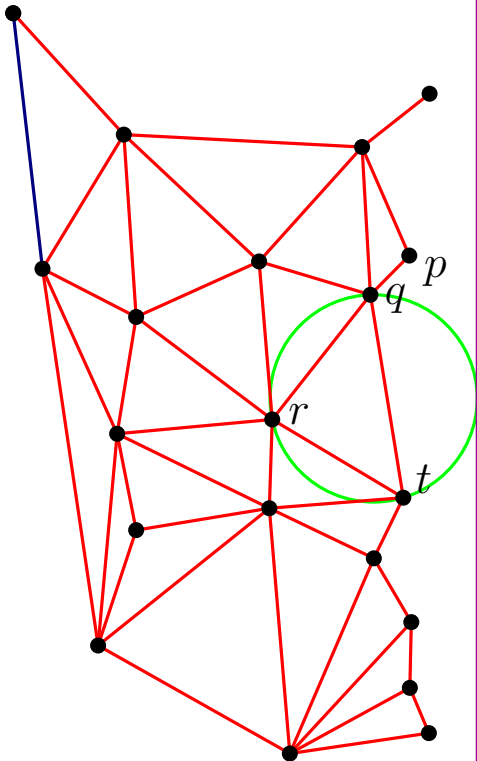


Évènement cercle



Évènement cercle





Évènement cercle

Triangulation

+ 1 triangle

+1 arête

Évènements

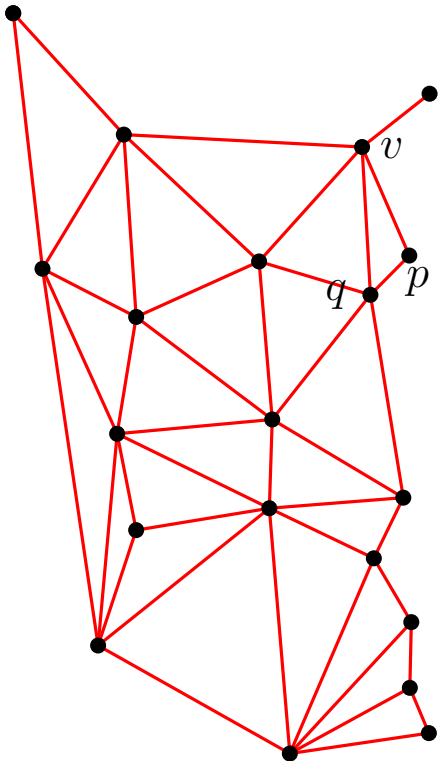
- 1 cercle

-2 cercles ?

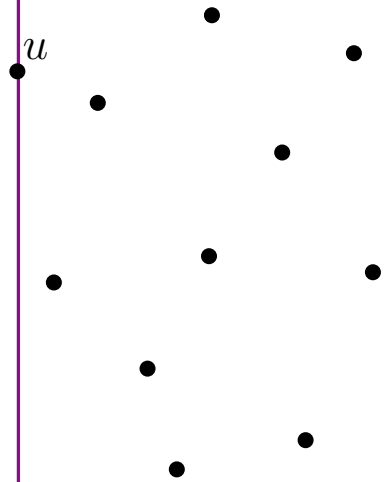
+2 cercles ?

Front

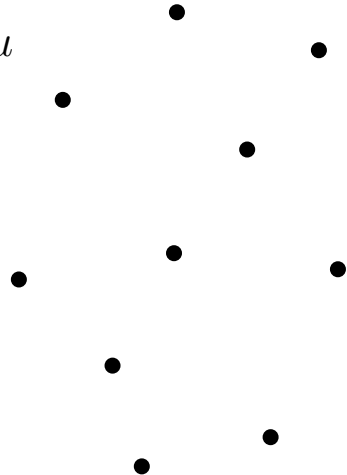
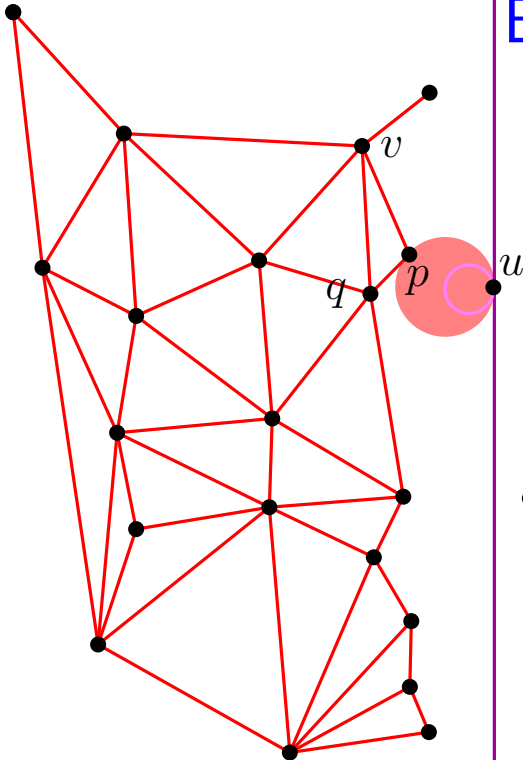
2 arêtes \rightarrow 1 arête



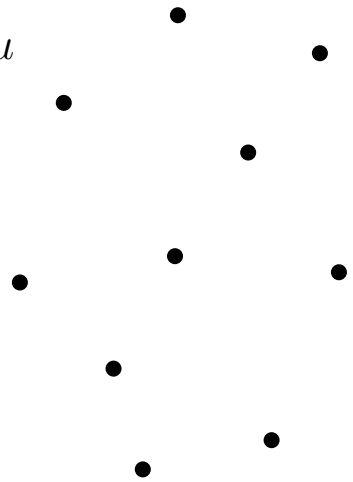
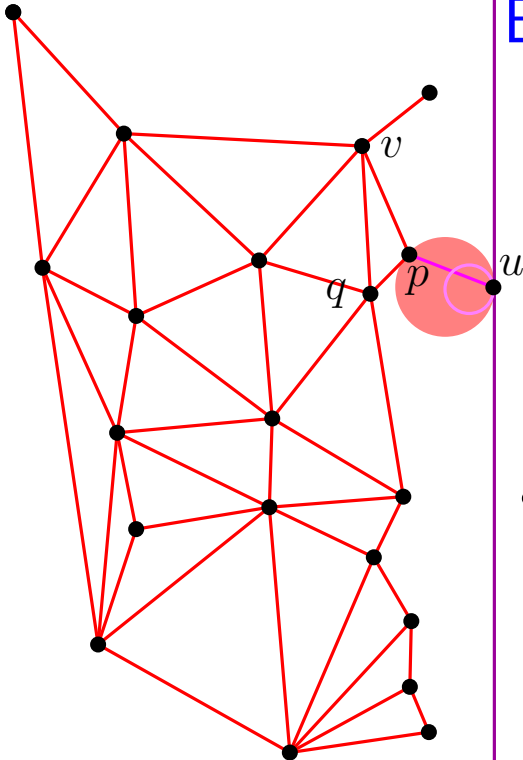
Évènement point



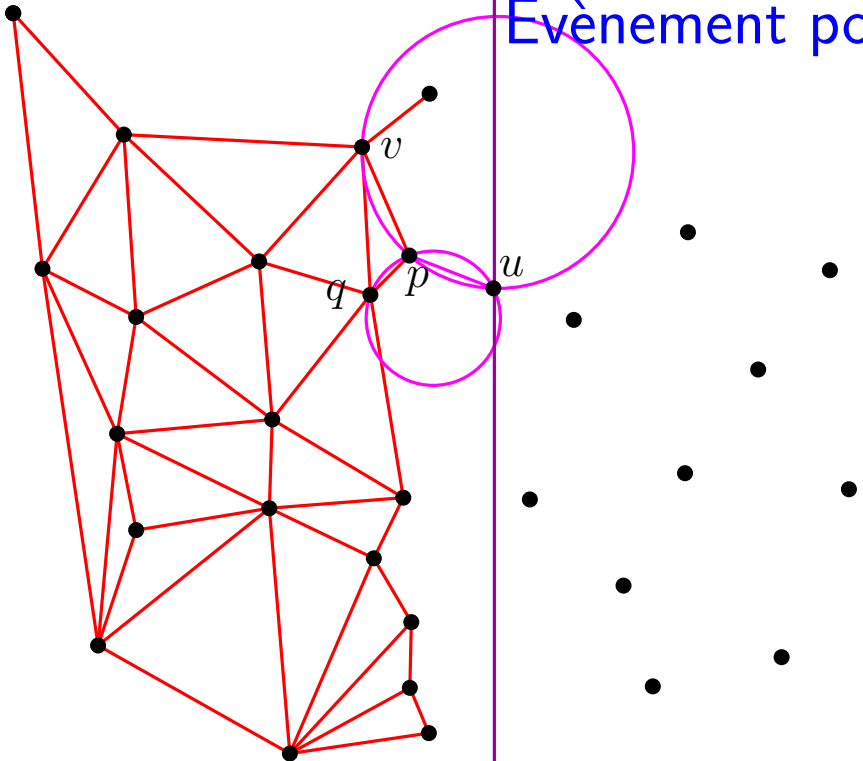
Évènement point

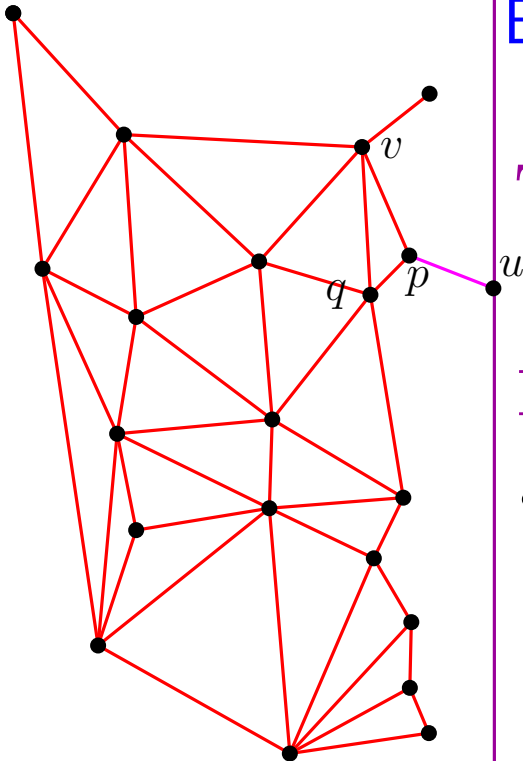


Évènement point



Évènement point





Évènement point

Triangulation

- + 1 sommet
- + 1 arête

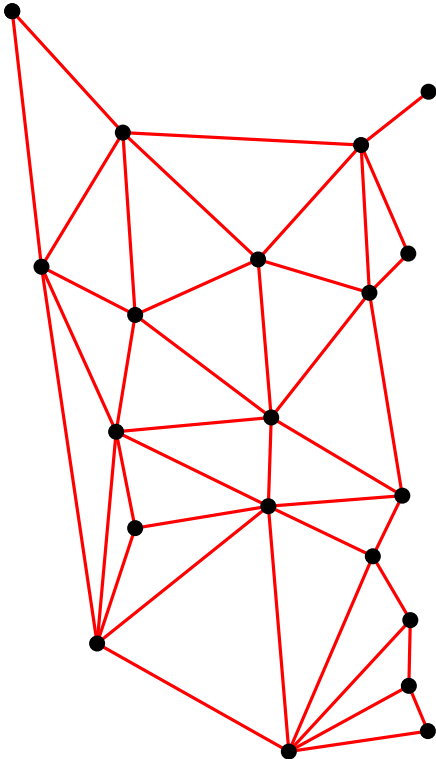
Évènements

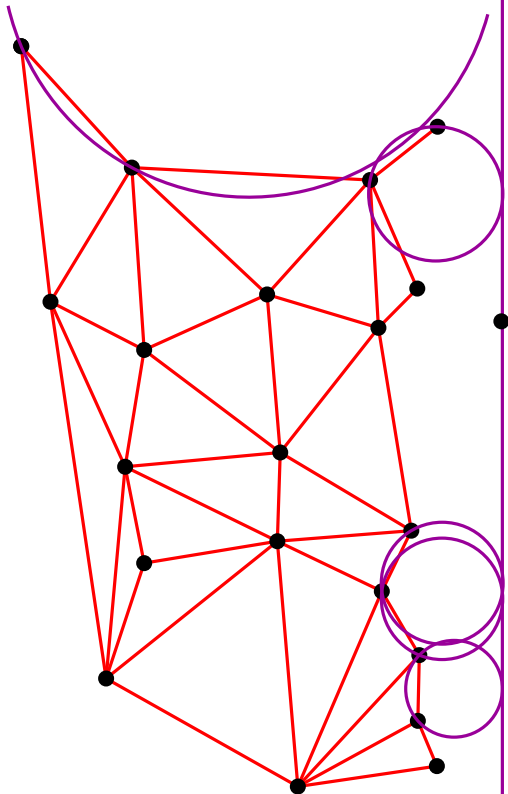
- - 1 point
- - 1 cercle ?
- + 2 cercles ?

Front

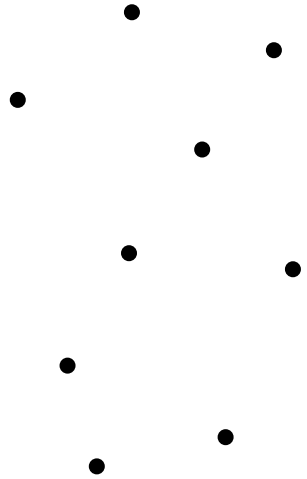
- + 2 arêtes

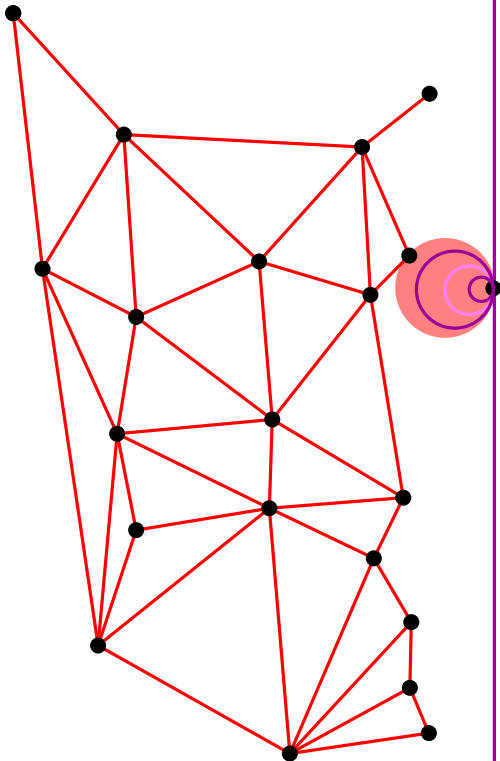
Front de balayage



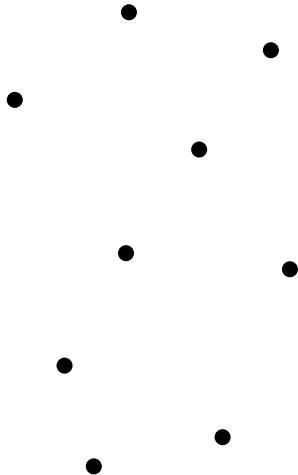


Front de balayage

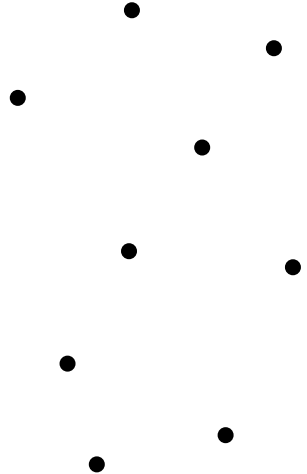
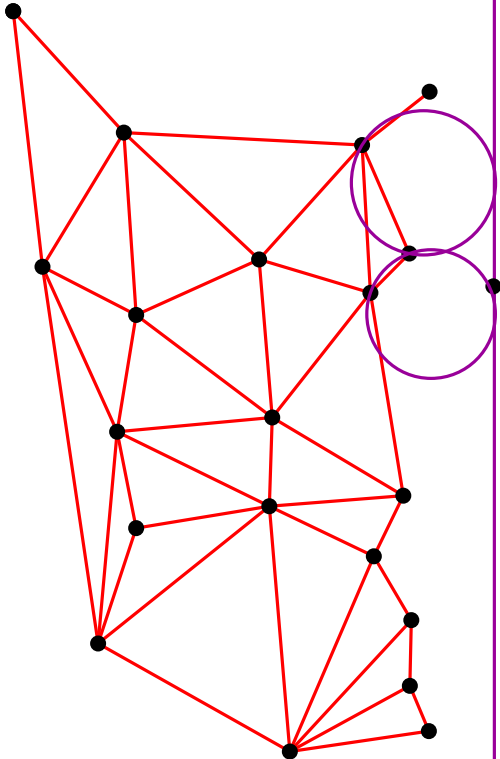




Front de balayage
Localisation



Front de balayage



Algorithme de balayage

Complexité

Triangulation

$O(n)$ (taille)

Front

$O(n)$ (taille)

$O(\log n)$ insertion, suppression, requête

Évènements

$O(n)$ (taille)

$O(\log n)$ insertion, suppression, requête

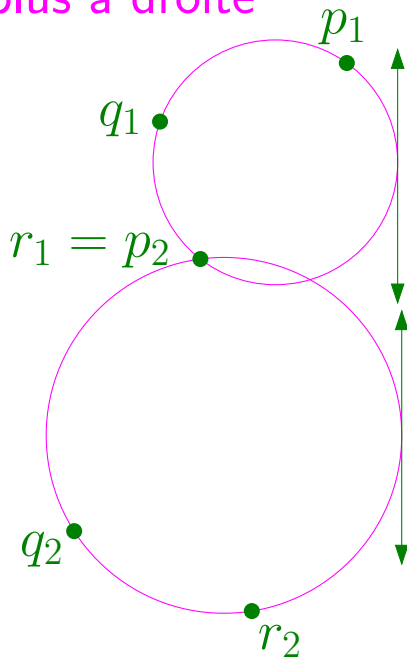
$O(n \log n)$

Prédicats

Prédicat : cercle le plus à droite

6 points

polynôme de degré 24

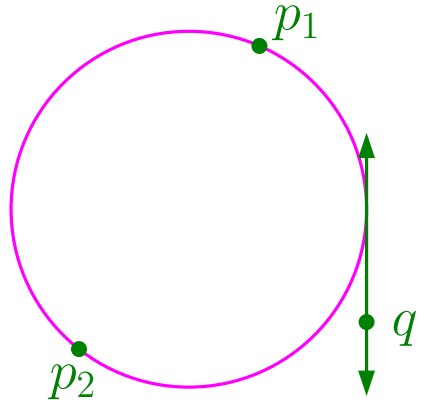


Prédicats

Prédicat : q dessus/dessous ?

3 points

polynôme de degré ??

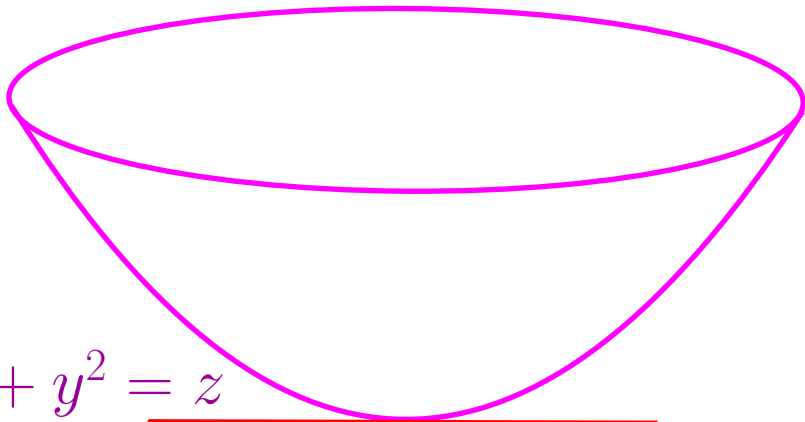




Algorithmes optimaux pour
la triangulation de Delaunay

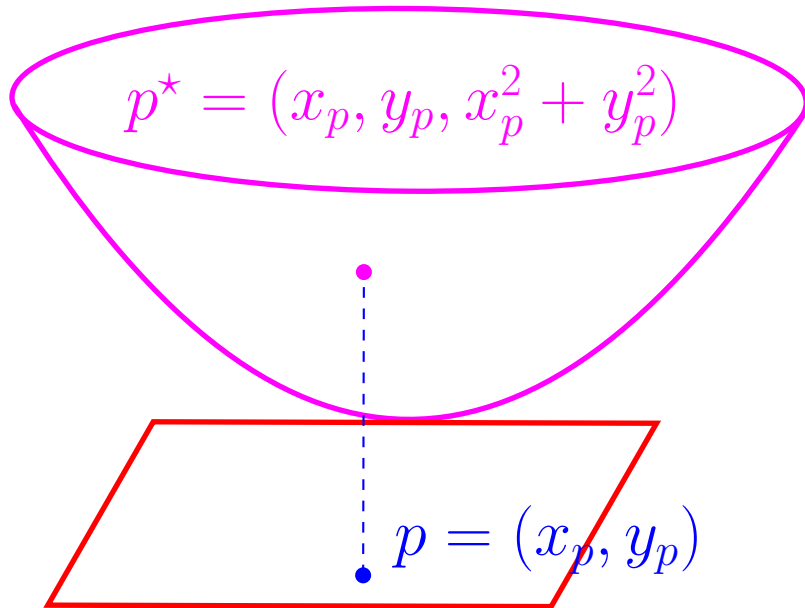
Dualité

Rappel

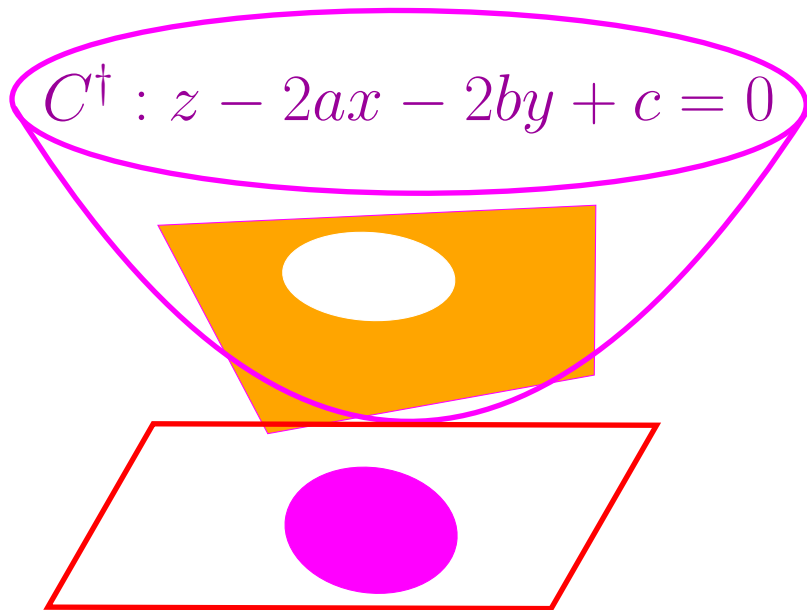


$$\Pi : x^2 + y^2 = z$$

Rappel

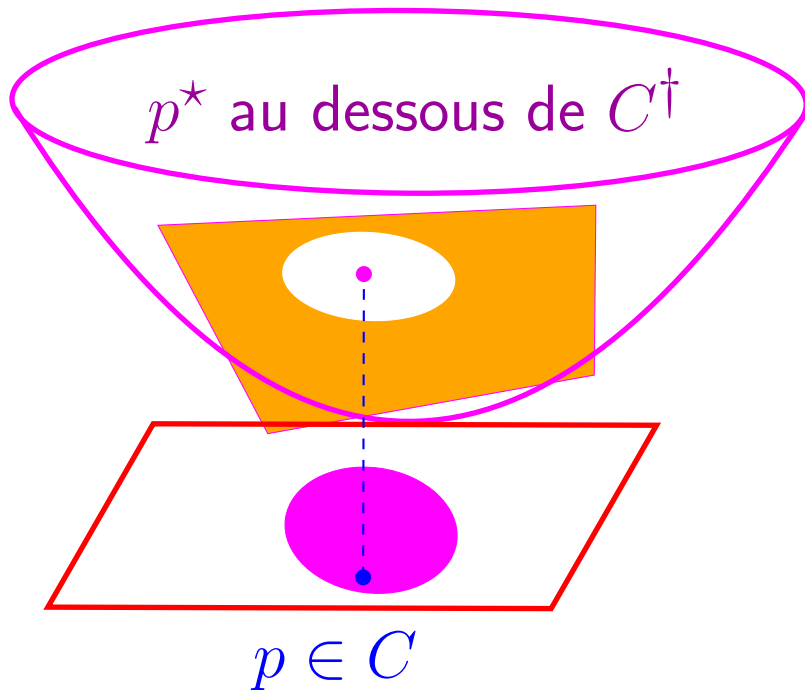


Rappel

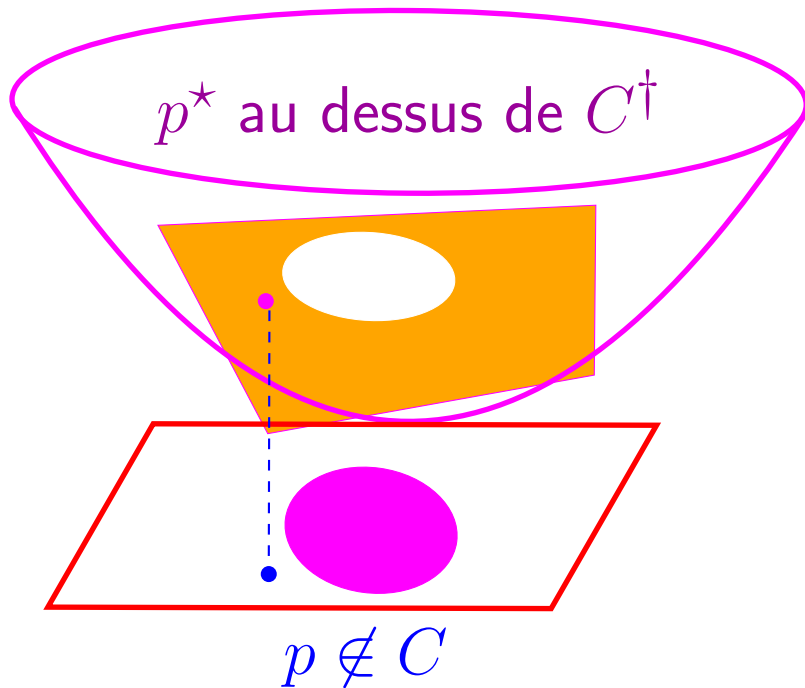


$$C : x^2 + y^2 - 2ax - 2by + c = 0$$

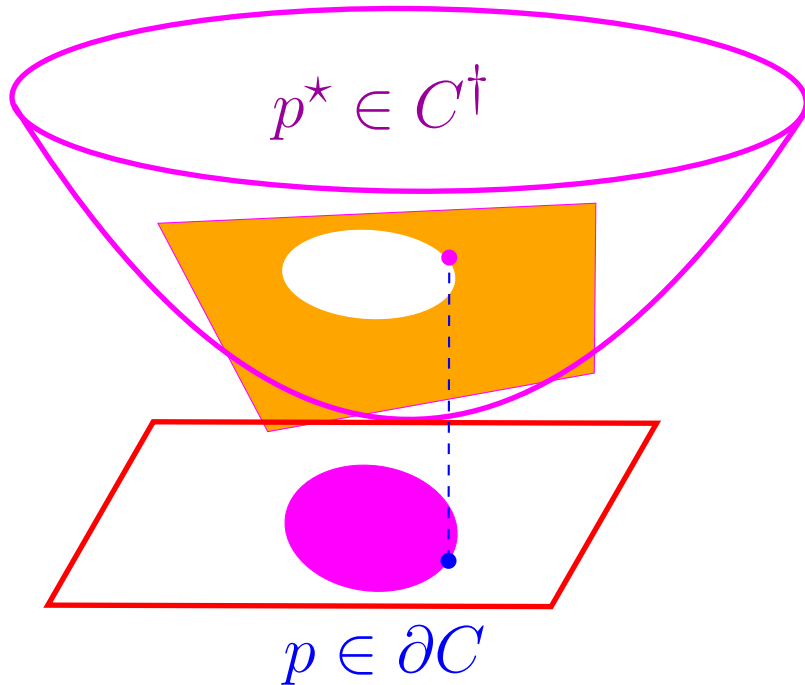
Rappel



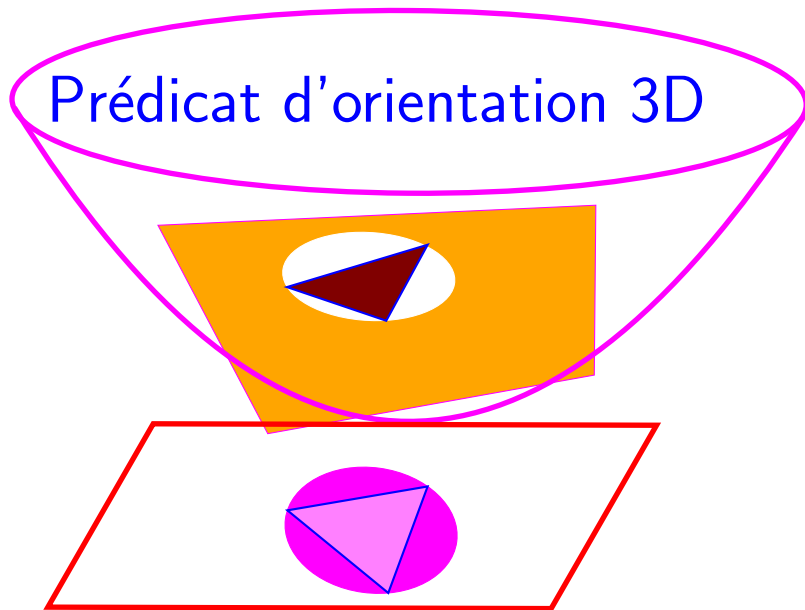
Rappel



Rappel

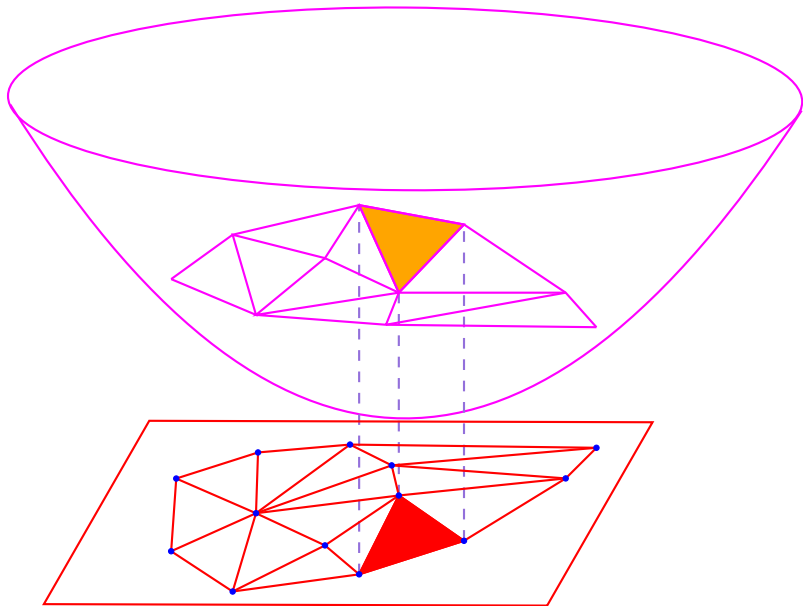


Rappel



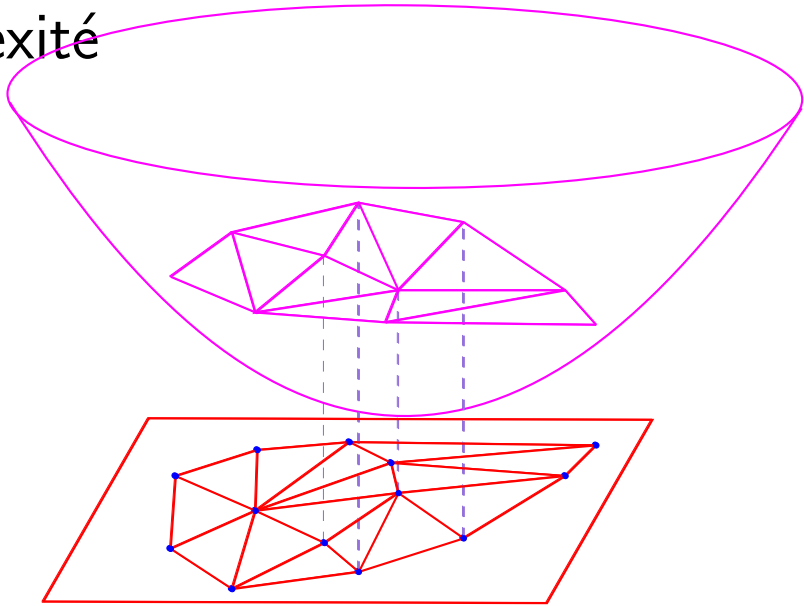
Prédicat de cocyclicité

Delaunay et enveloppe convexe



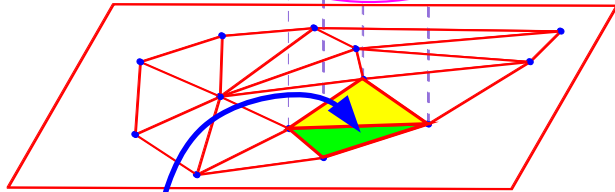
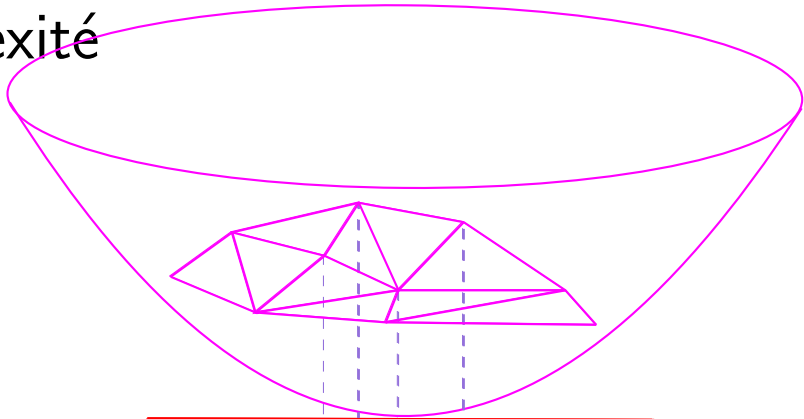
Retour sur la bascule de diagonales

Complexité



Retour sur la bascule de diagonales

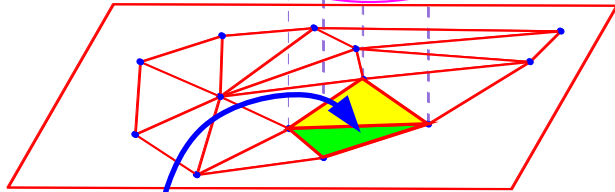
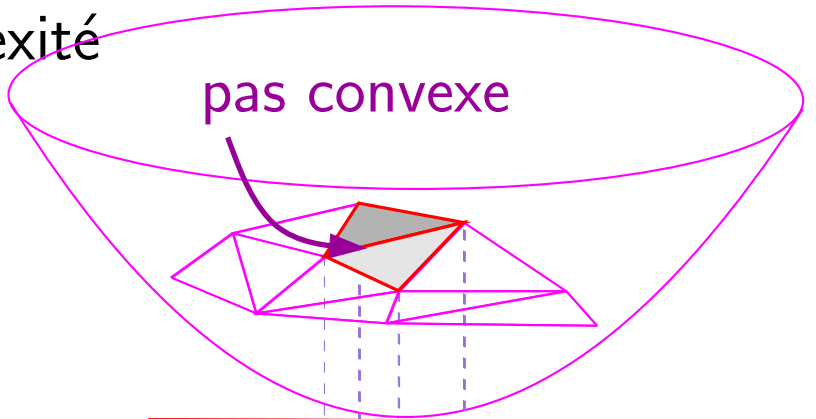
Complexité



pas localement Delaunay

Retour sur la bascule de diagonales

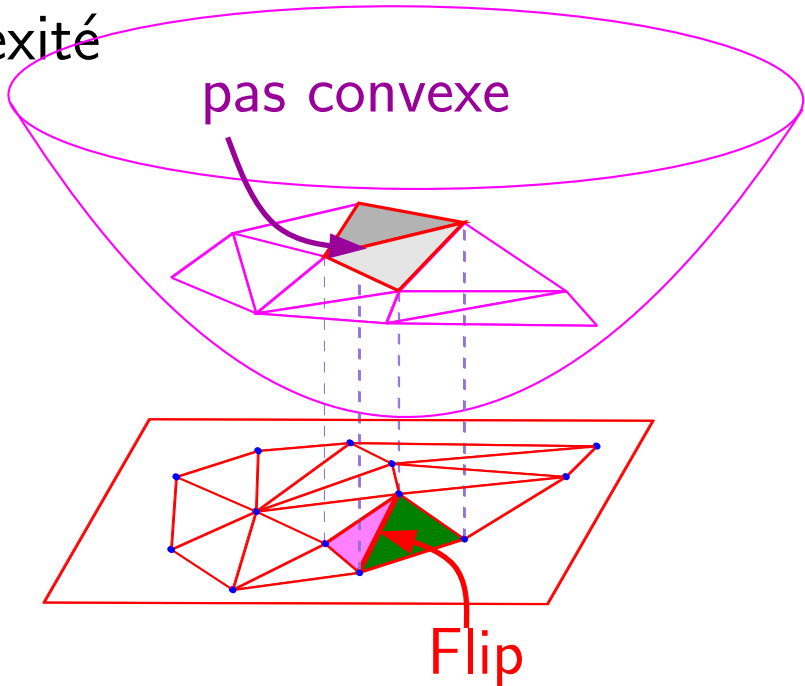
Complexité



pas localement Delaunay

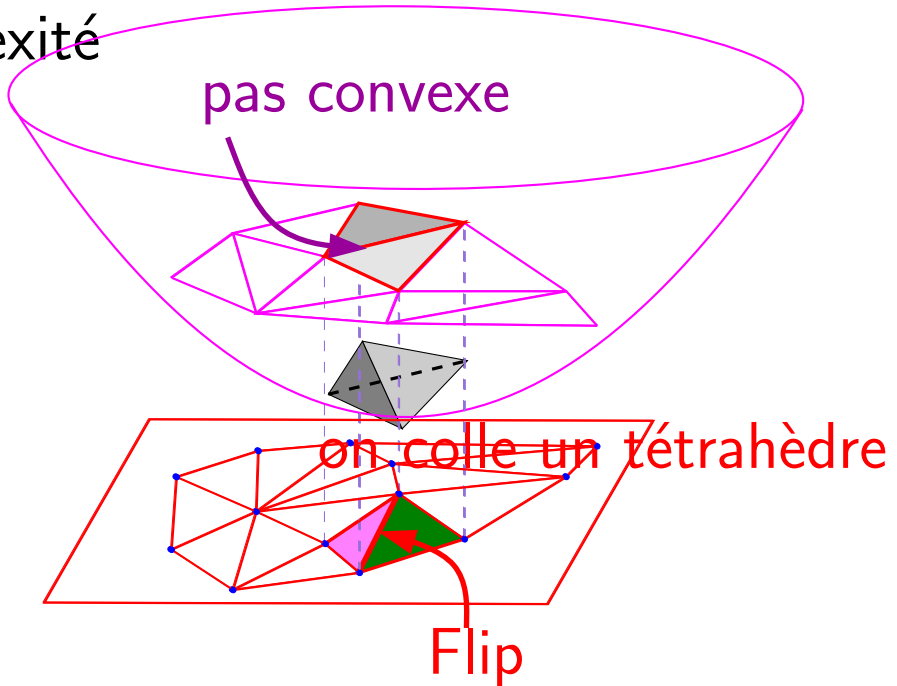
Retour sur la bascule de diagonales

Complexité



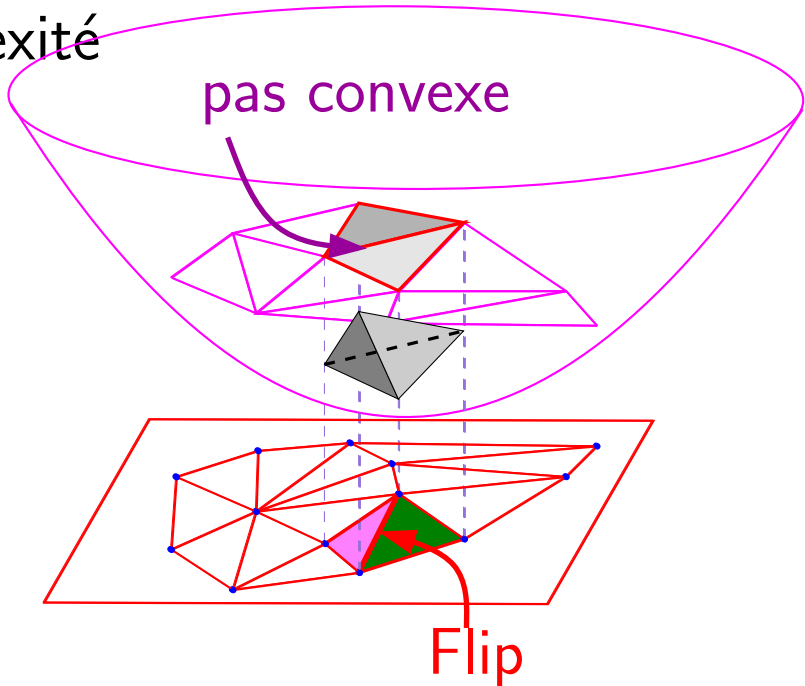
Retour sur la bascule de diagonales

Complexité



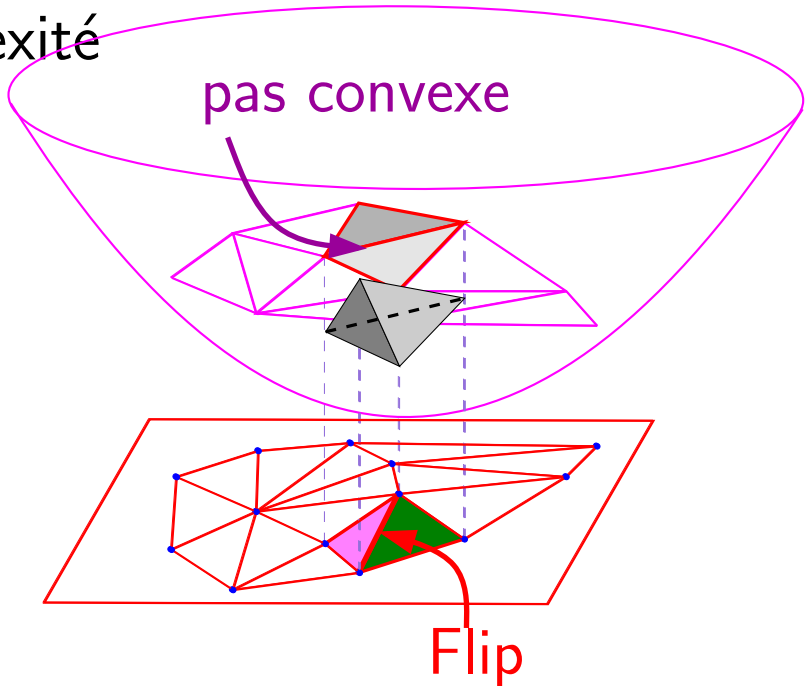
Retour sur la bascule de diagonales

Complexité



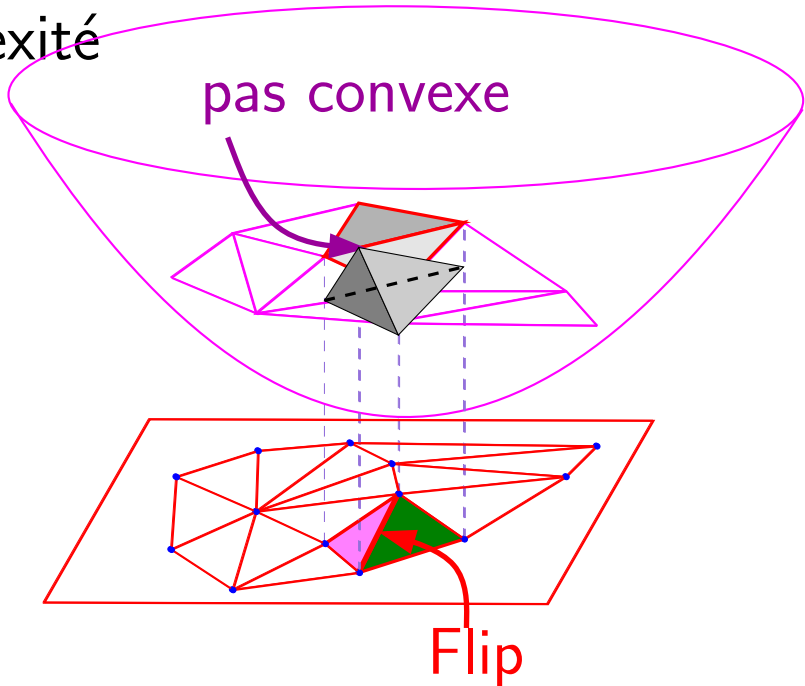
Retour sur la bascule de diagonales

Complexité



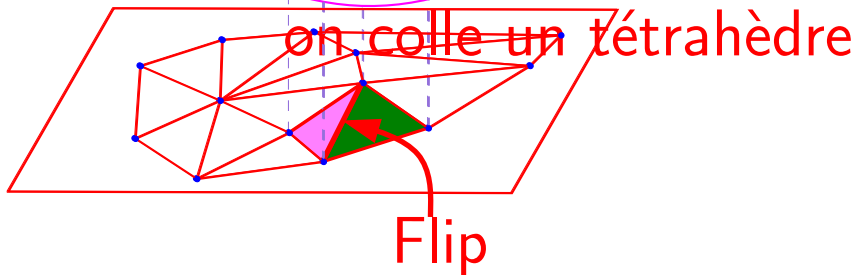
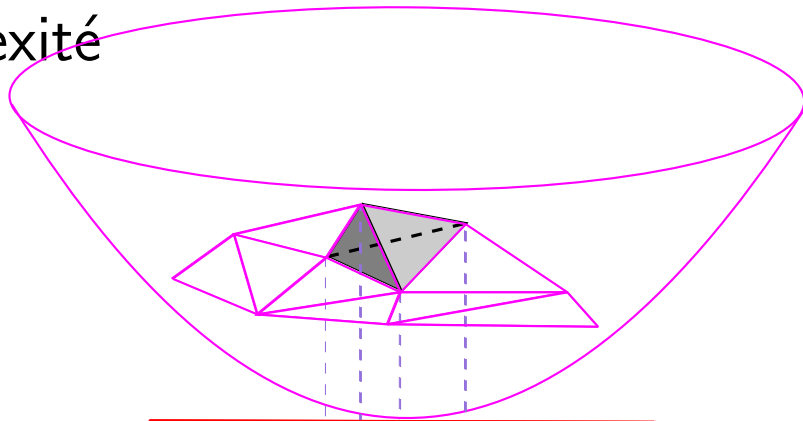
Retour sur la bascule de diagonales

Complexité



Retour sur la bascule de diagonales

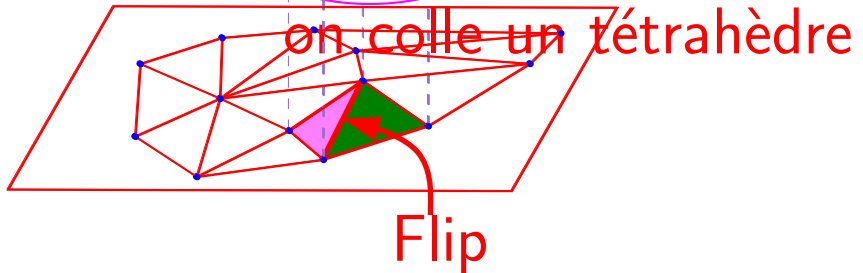
Complexité



Retour sur la bascule de diagonales

Complexité

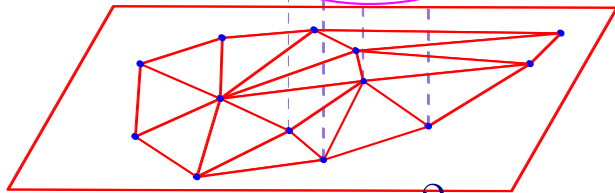
Une arête basculée n'est
jamais reconstruite
(les nouvelles arêtes
sont toujours dessous)



Retour sur la bascule de diagonales

Complexité

Une arête basculée n'est
jamais reconstruite
(les nouvelles arêtes
sont toujours dessous)



Algorithme en $O(n^2)$



Algorithmes optimaux pour
la triangulation de Delaunay

Division-Fusion

Division-Fusion

Technique classique

exemple: tri

Problème de taille n

 2 sous-problèmes de taille $\frac{n}{2}$

résolution récursive

fusion

Division-Fusion

Problème de taille n

$f(n)$

$O(n)$

2 sous-problèmes de taille $\frac{n}{2}$

résolution récursive

$2 \cdot f\left(\frac{n}{2}\right)$

fusion

$O(n)$

Division-Fusion

$$f(n) = O(n) + 2f\left(\frac{n}{2}\right)$$

Problème de taille n

$f(n)$

$O(n)$

2 sous-problèmes de taille $\frac{n}{2}$

résolution récursive

$2 \cdot f\left(\frac{n}{2}\right)$

fusion

$O(n)$

Division-Fusion

$$f(n) = O(n) + 2f\left(\frac{n}{2}\right)$$

$$f(n) =$$

$$n + 2f\left(\frac{n}{2}\right)$$

$$n + 2\left(\frac{n}{2} + 2f\left(\frac{n}{4}\right)\right)$$

$$n + 2\left(\frac{n}{2} + 2\left(\frac{n}{4} + 2f\left(\frac{n}{8}\right)\right)\right)$$

$$n + 2\frac{n}{2} + 2 \cdot 2\frac{n}{4} + \dots$$

$\log_2 n$

$$f(n) = O(n \log n)$$

Division

Fusion facile !

Partition équilibrée

$O(n)$

Division

Fusion facile !

Partition par une droite

Partition équilibrée

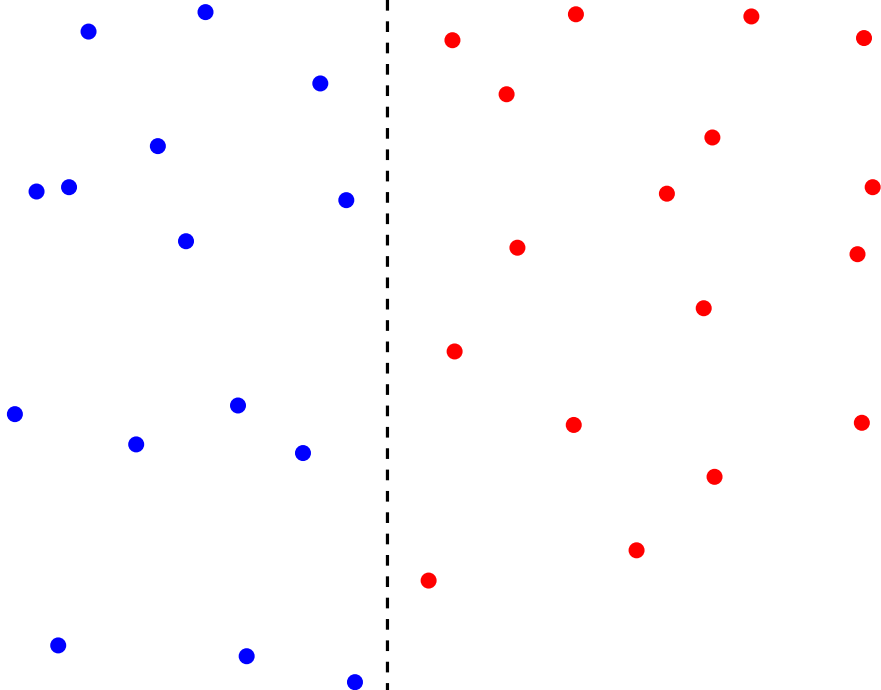
Droite médiane

$O(n)$

Médian linéaire ?

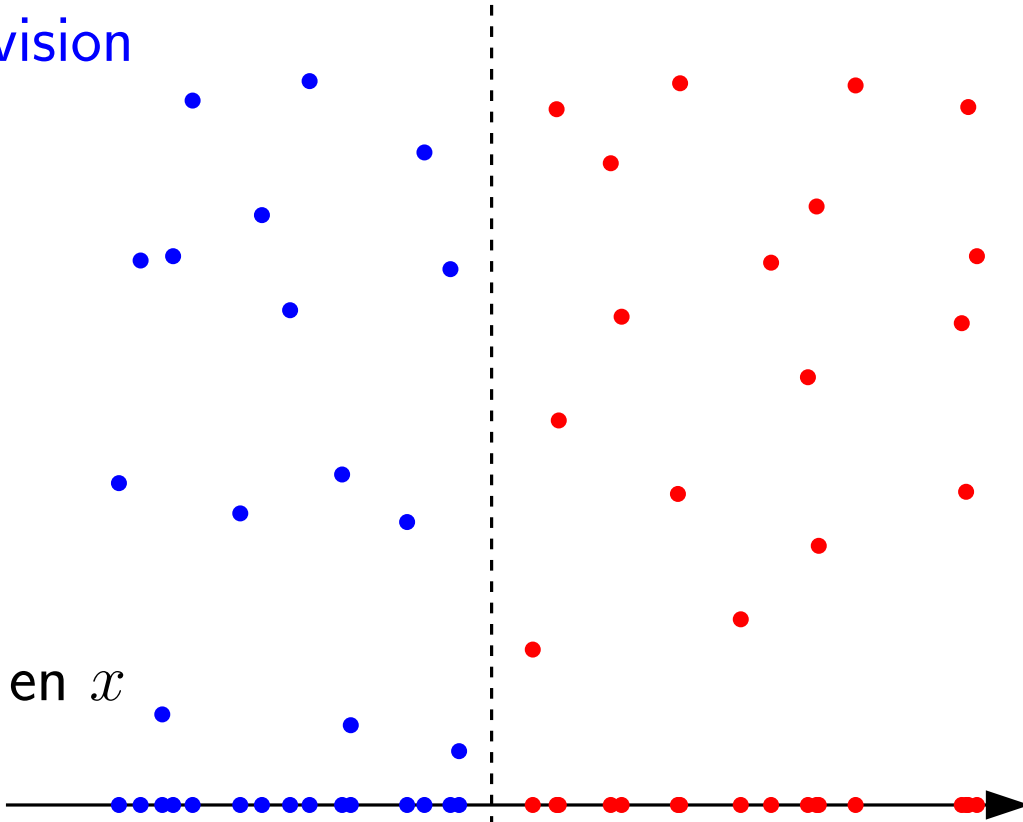
Prétraitement

Division



Division

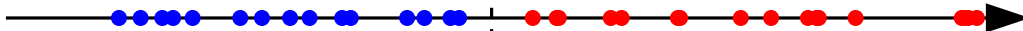
Tri en x

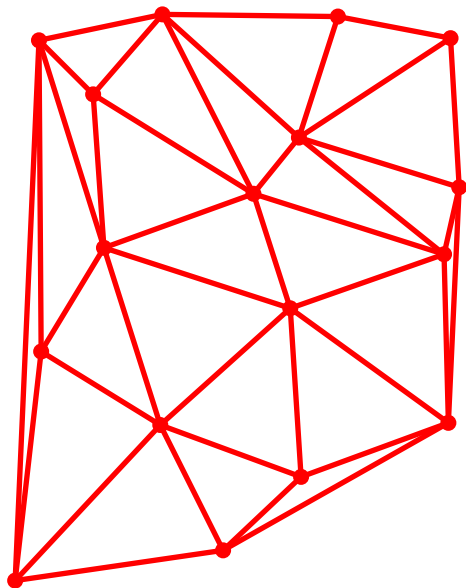
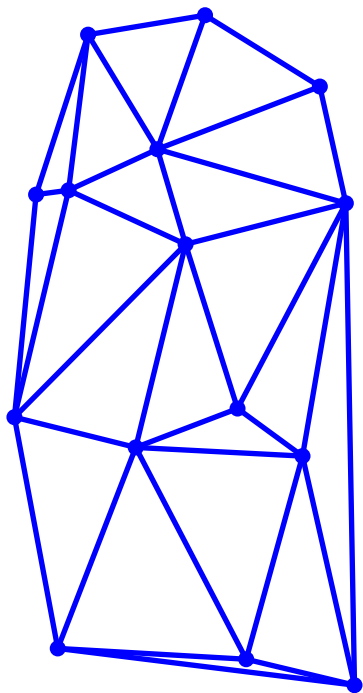


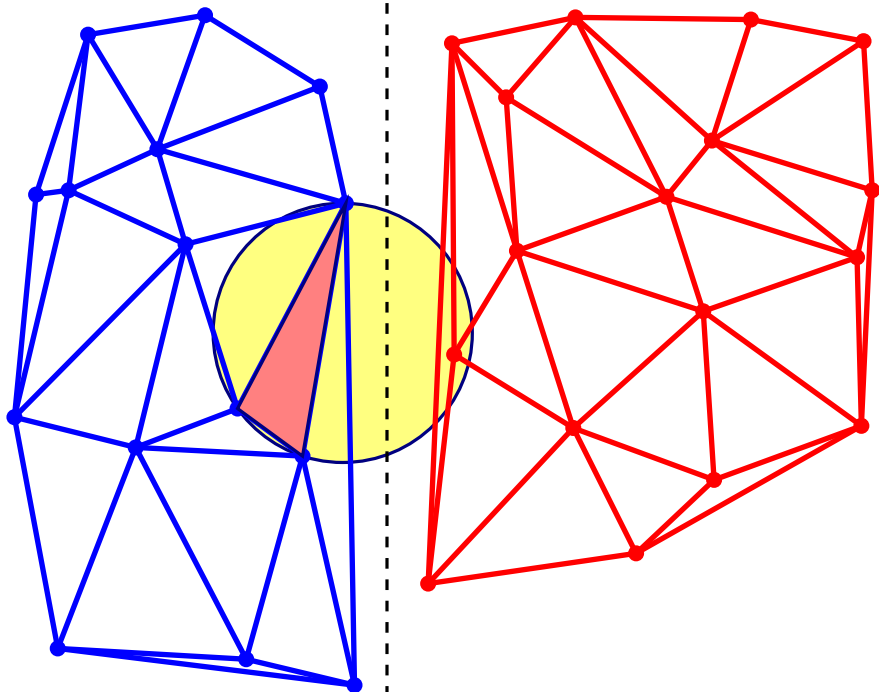
Division

Tri en x

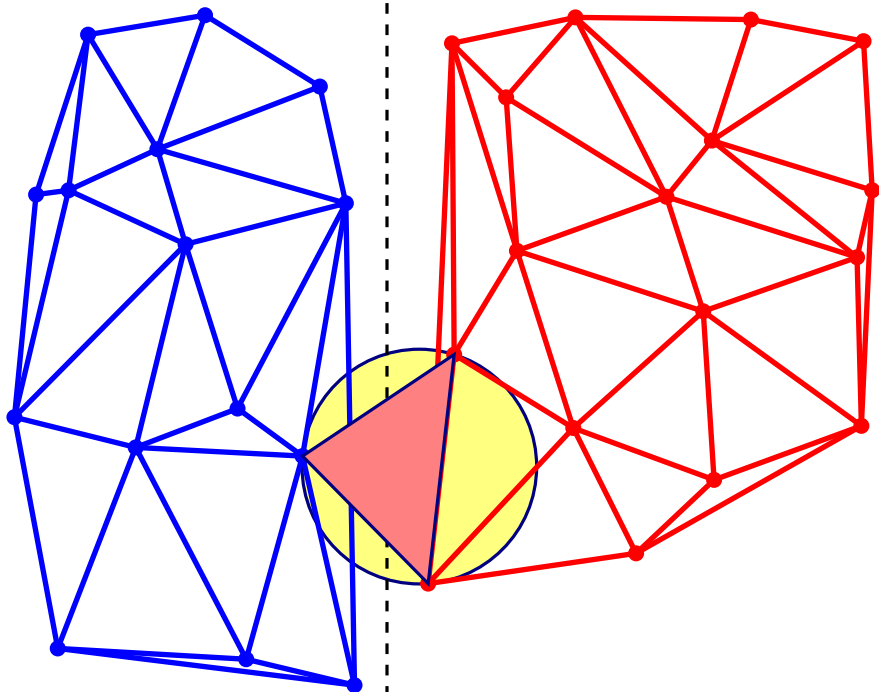
→ tous les médians



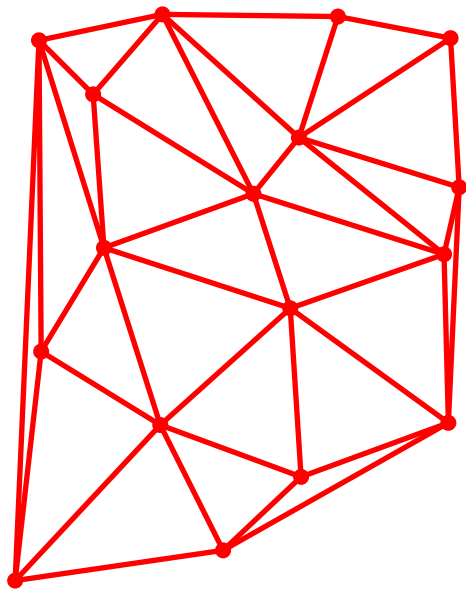
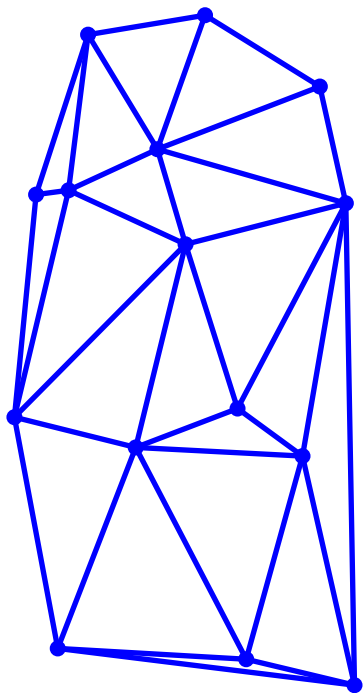




Triangles monocolors à éliminer

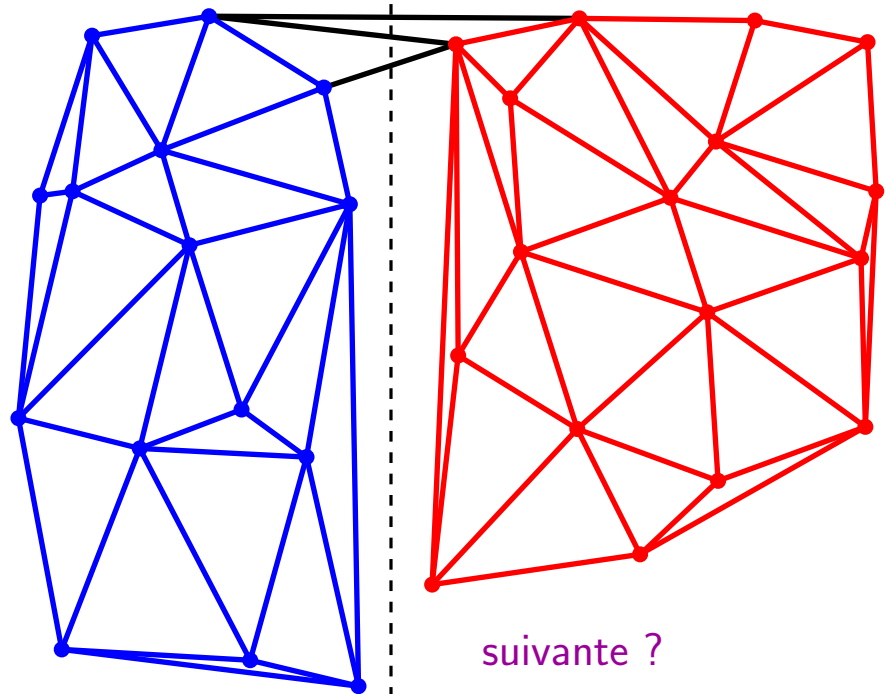


Triangles bicolores à construire



Construction des arêtes bicolorées

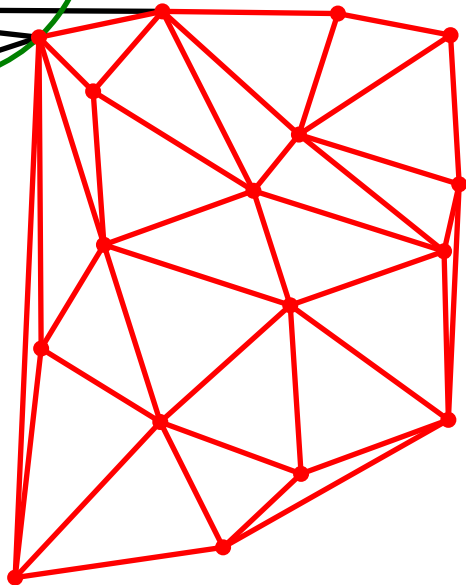
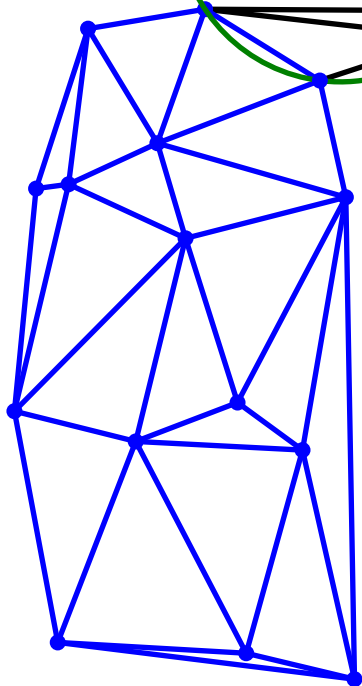
du haut vers le bas



suivante ?

Construction des arêtes bicolorées

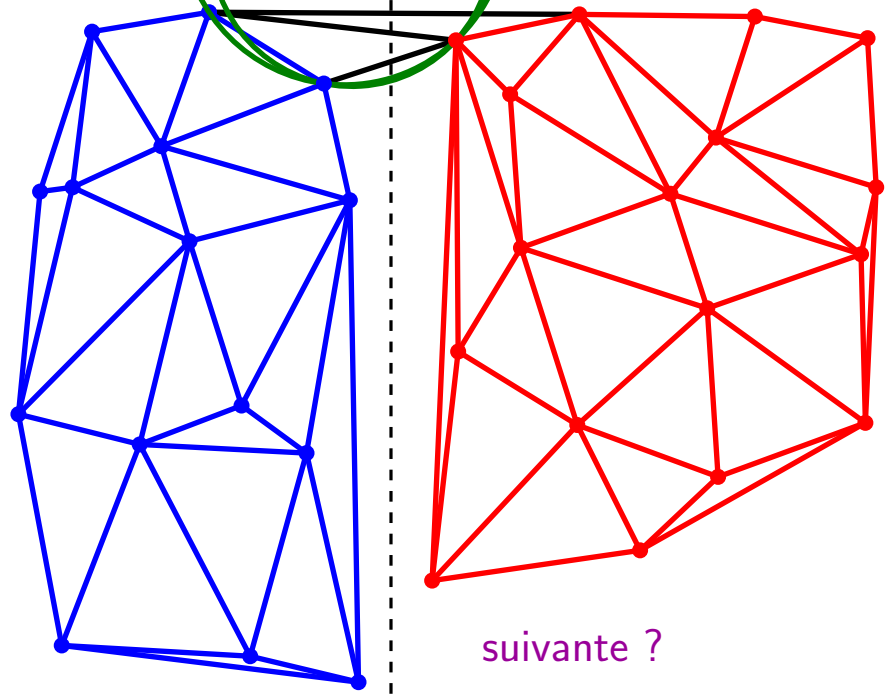
du haut vers le bas



suivante ?

Construction des arêtes bicolorées

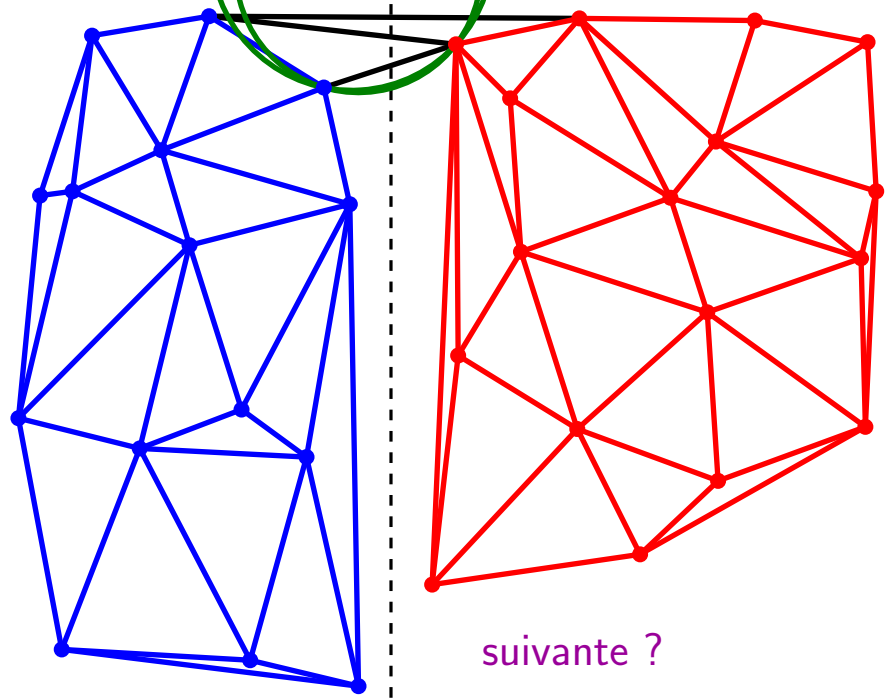
du haut vers le bas



suivante ?

Construction des arêtes bicolores

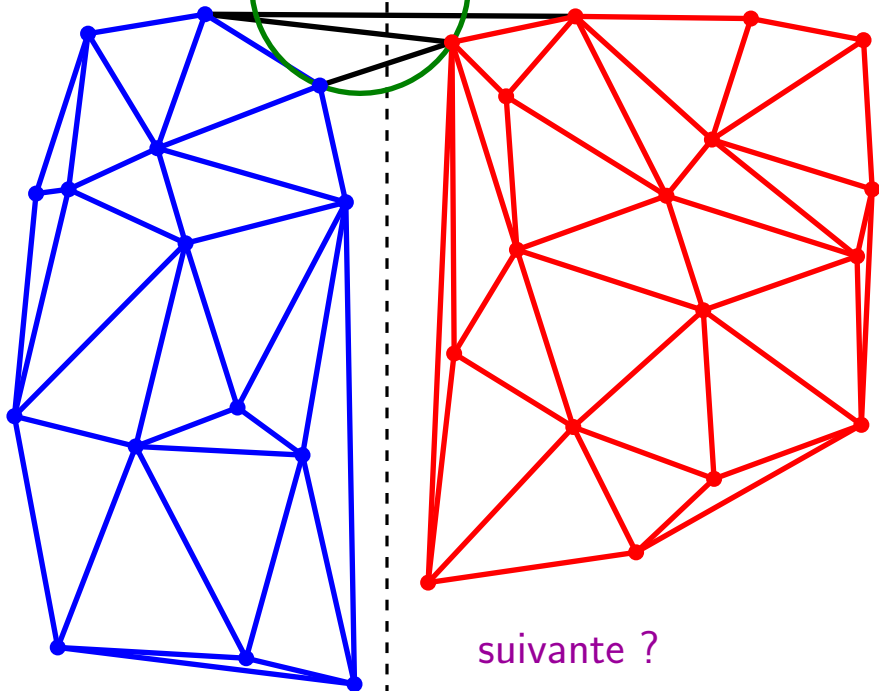
du haut vers le bas



suivante ?

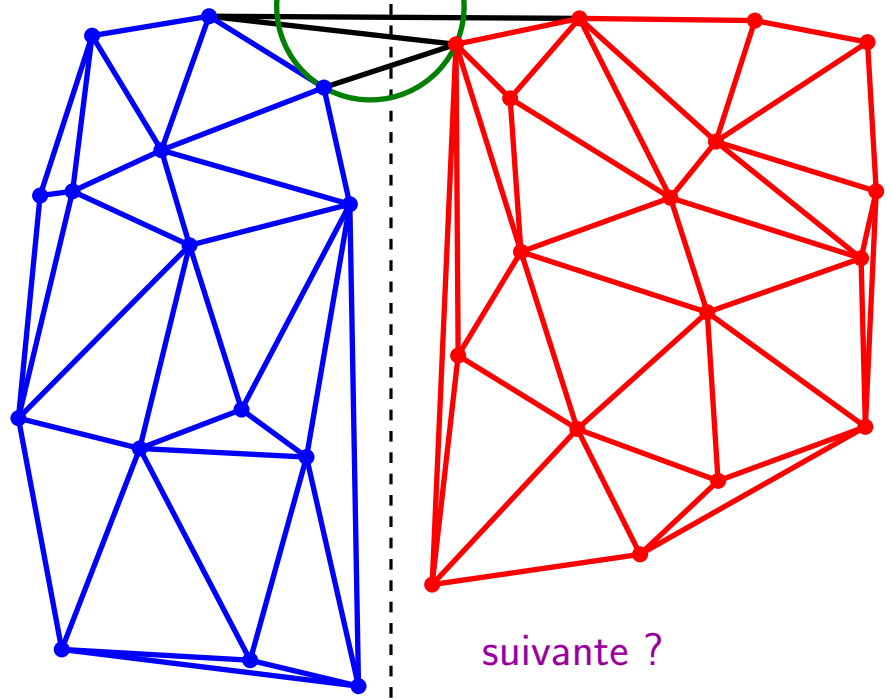
Construction des arêtes (bicolores)

du haut vers le bas



Construction des arêtes bicolorées

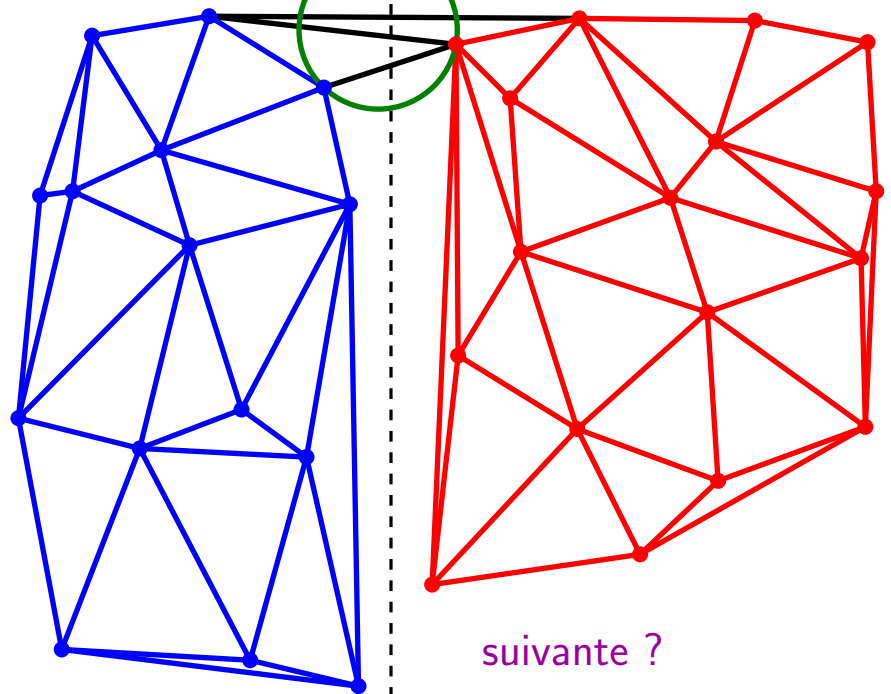
du haut vers le bas



suivante ?

Construction des arêtes bicolorées

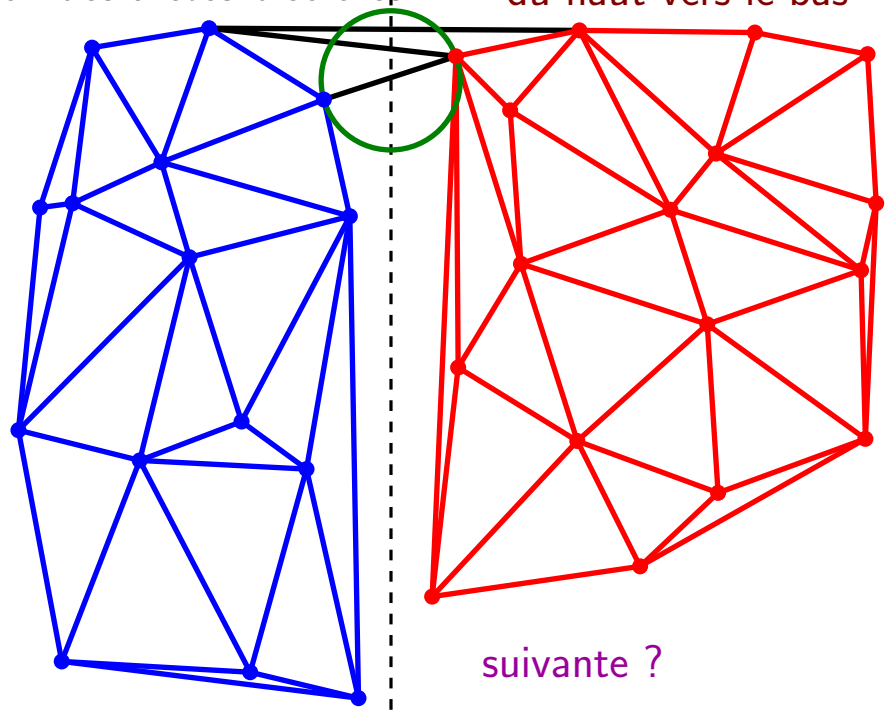
du haut vers le bas



suivante ?

Construction des arêtes bicolorées

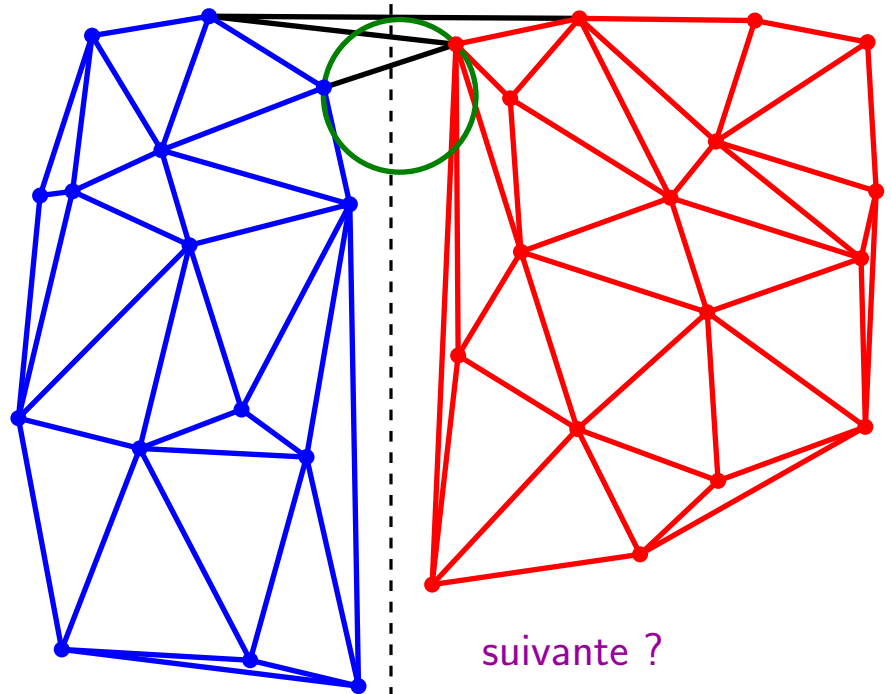
du haut vers le bas



suivante ?

Construction des arêtes bicolorées

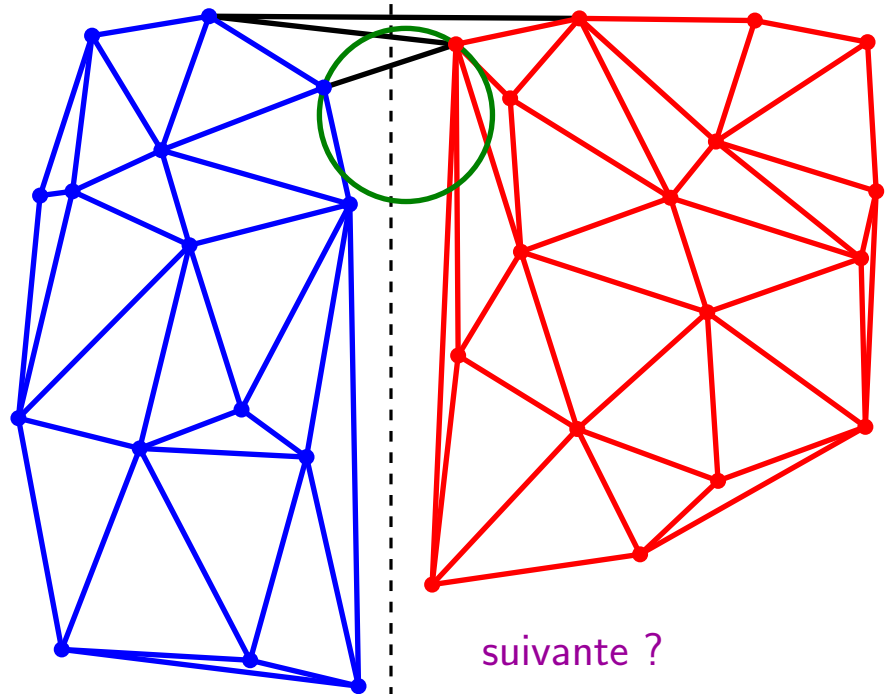
du haut vers le bas



suivante ?

Construction des arêtes bicolorées

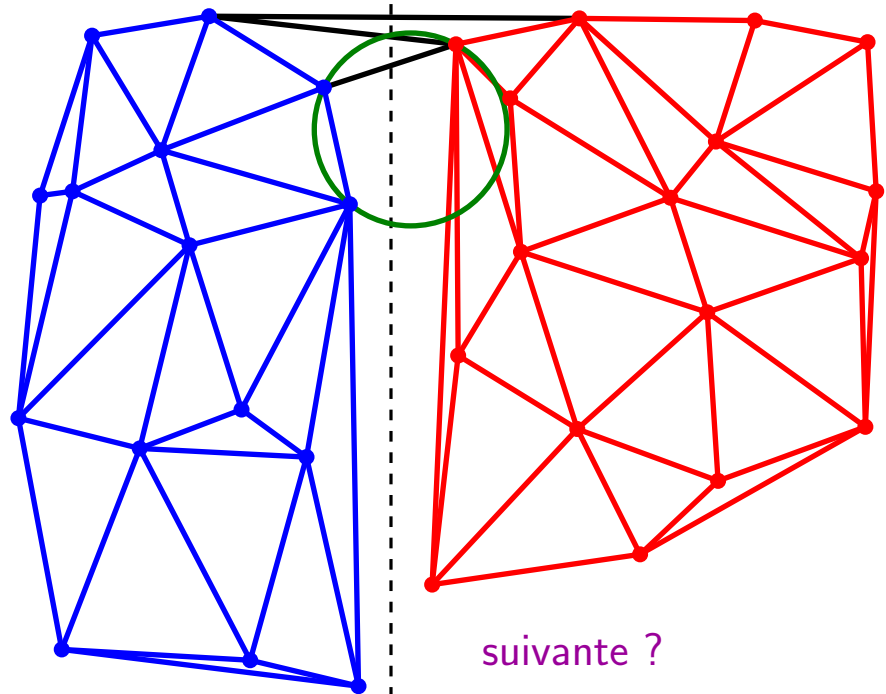
du haut vers le bas



suivante ?

Construction des arêtes bicolorées

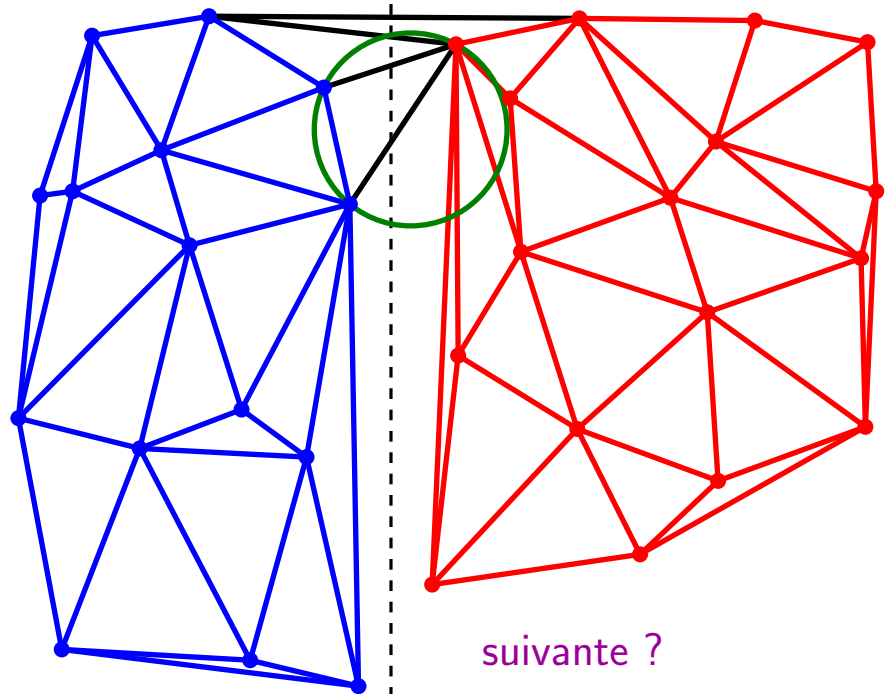
du haut vers le bas



suivante ?

Construction des arêtes bicolorées

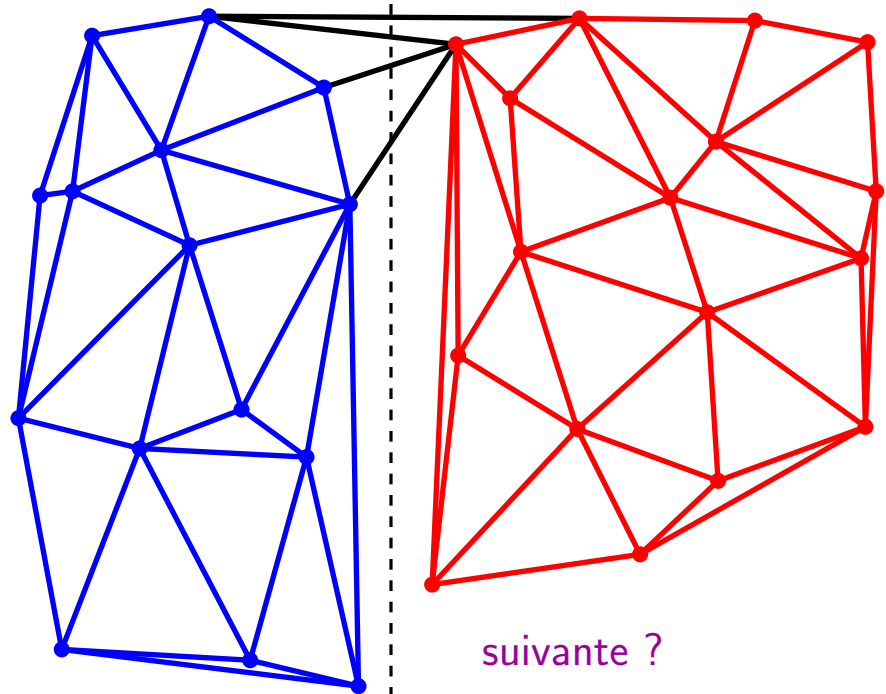
du haut vers le bas



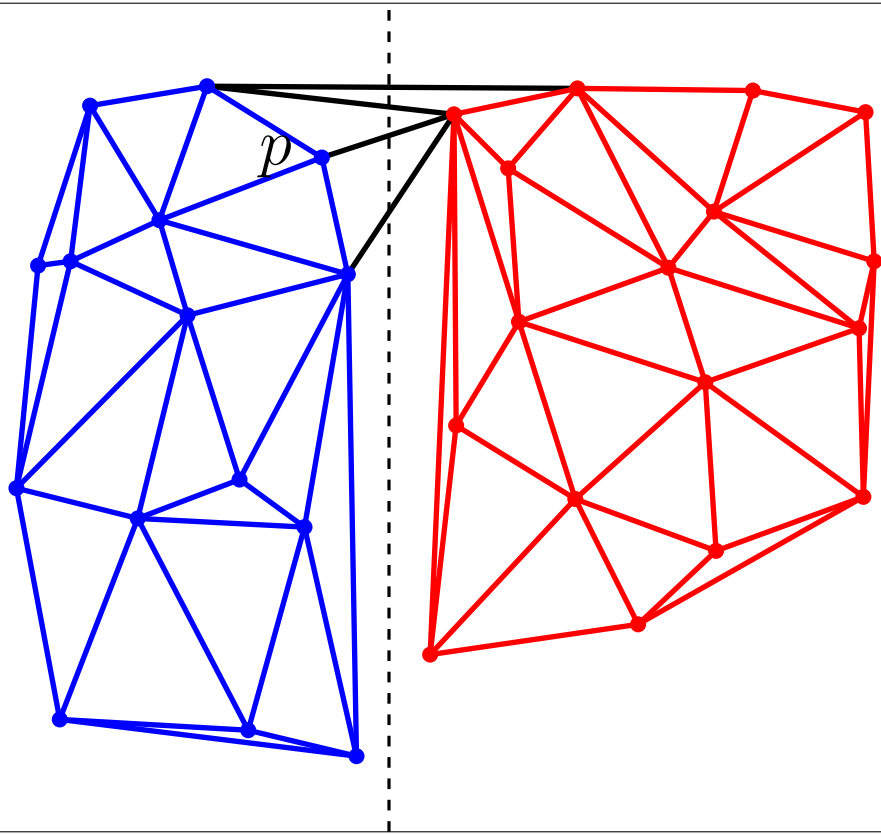
suivante ?

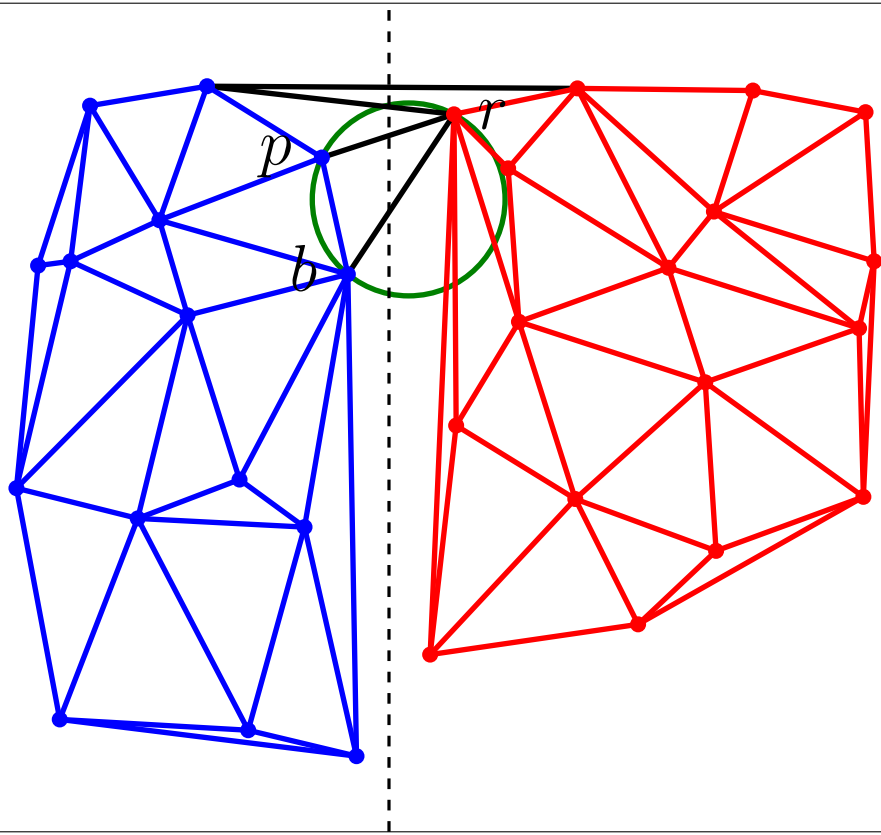
Construction des arêtes bicolorées

du haut vers le bas

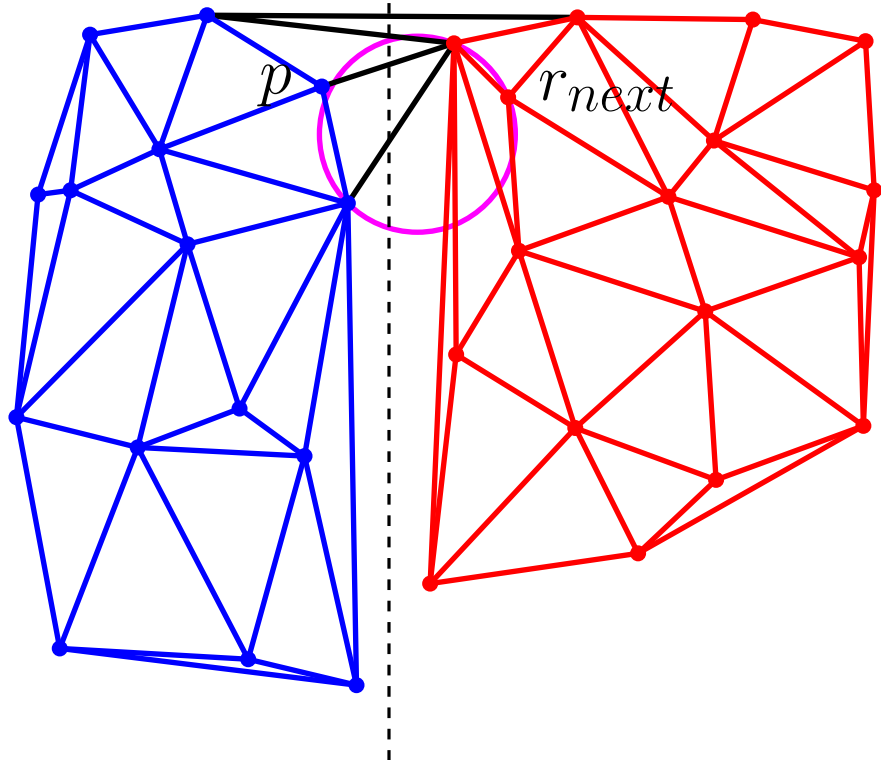


suivante ?

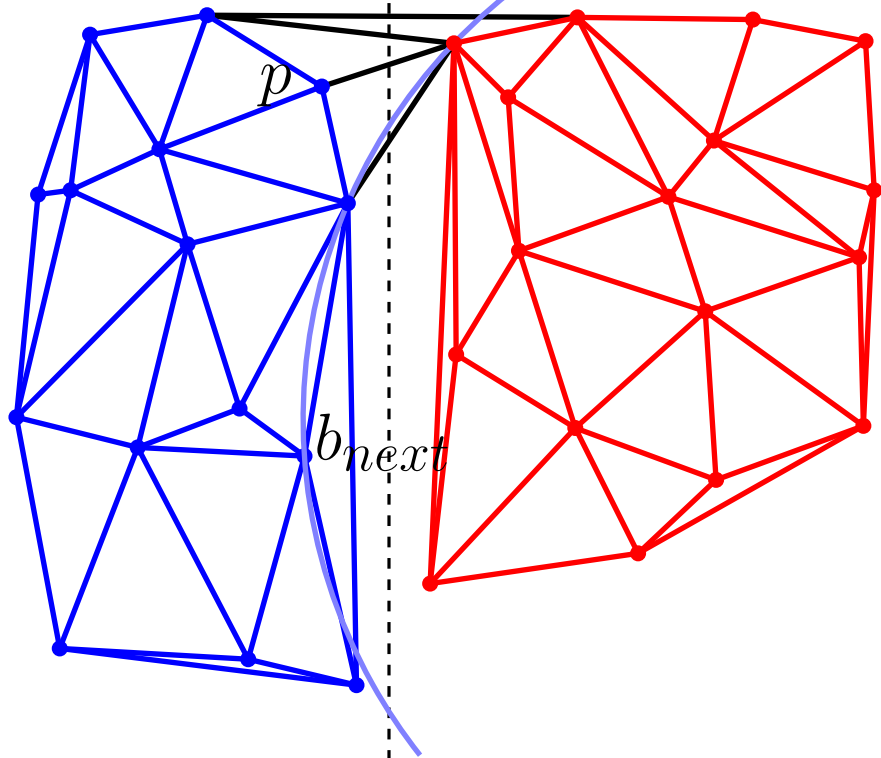




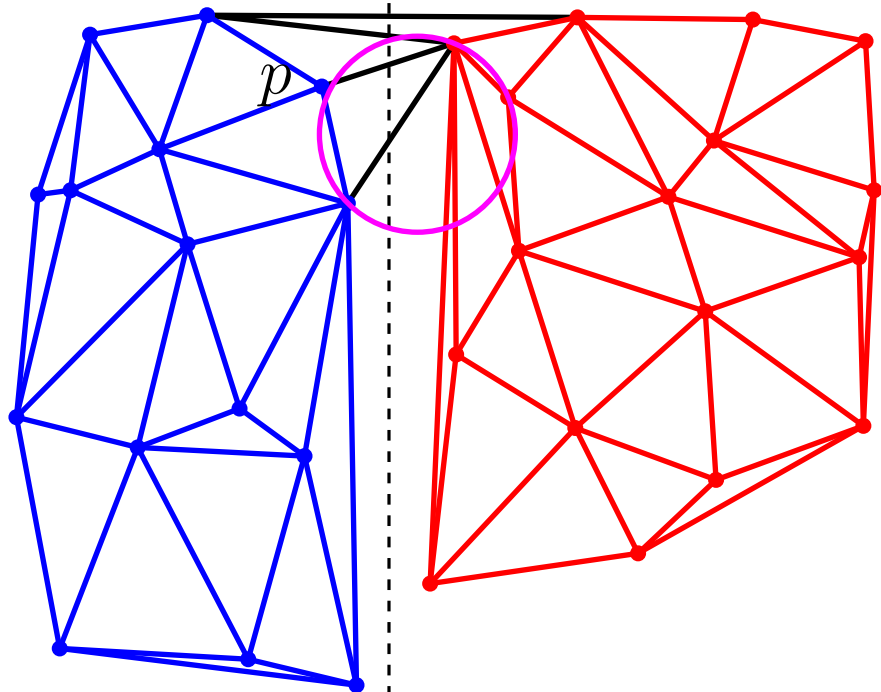
premier rouge rencontré par le faisceau de cercles



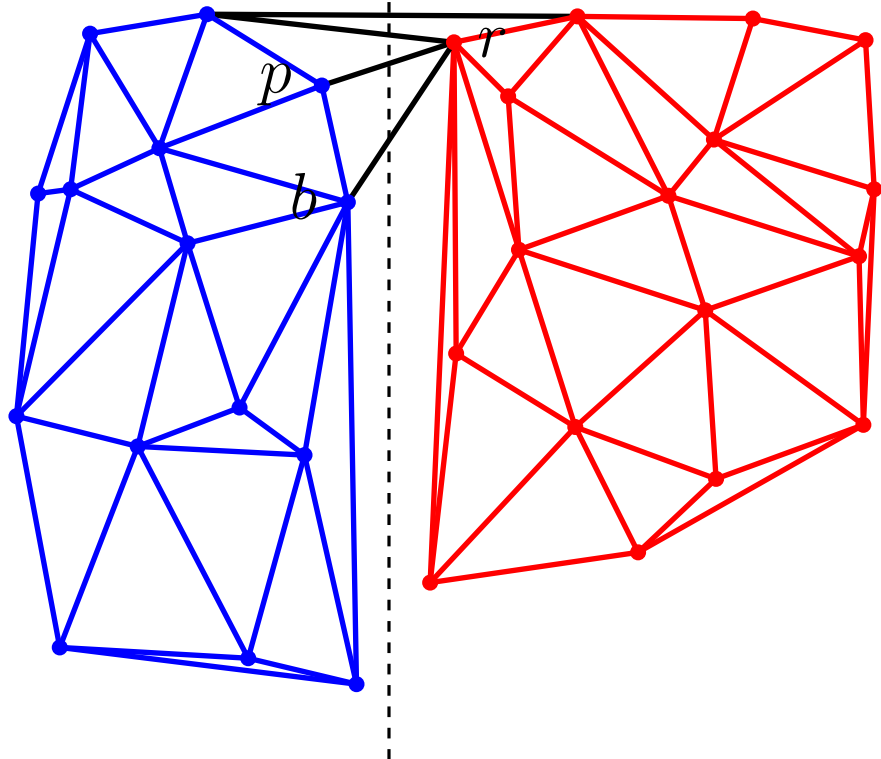
premier bleu rencontré par le faisceau de cercles



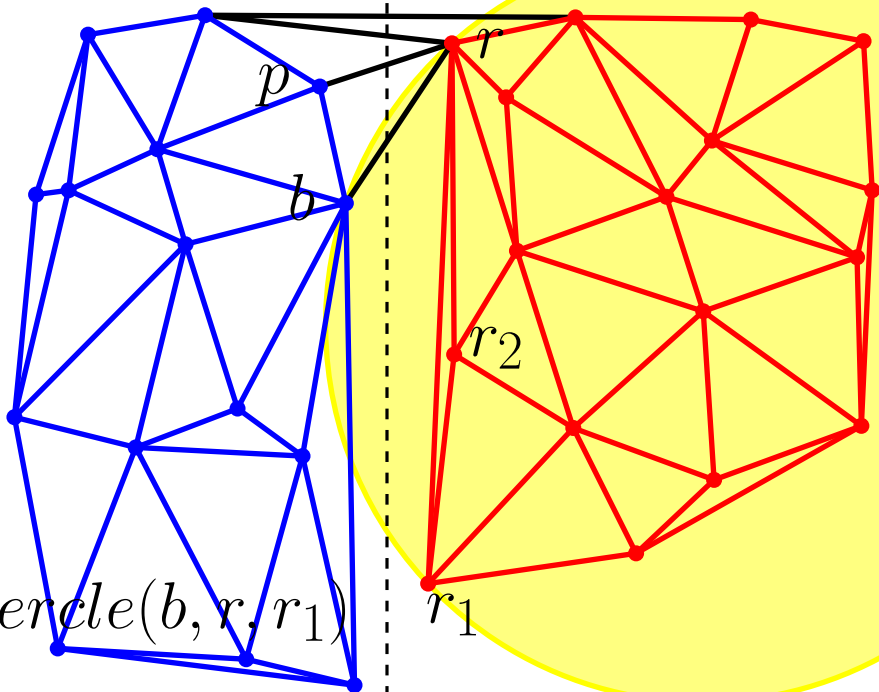
On garde le meilleur des deux



premier rouge rencontré par le faisceau de cercles



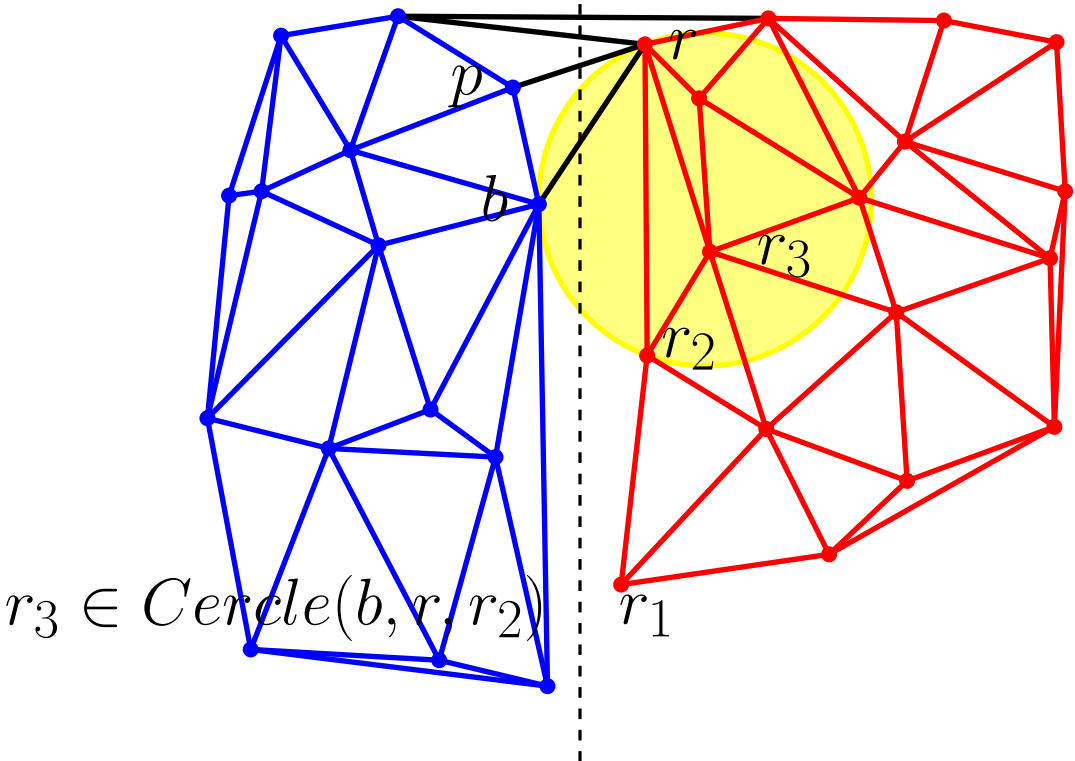
premier rouge rencontré par le faisceau de cercles



$r_2 \in Cercle(b, r, r_1)$

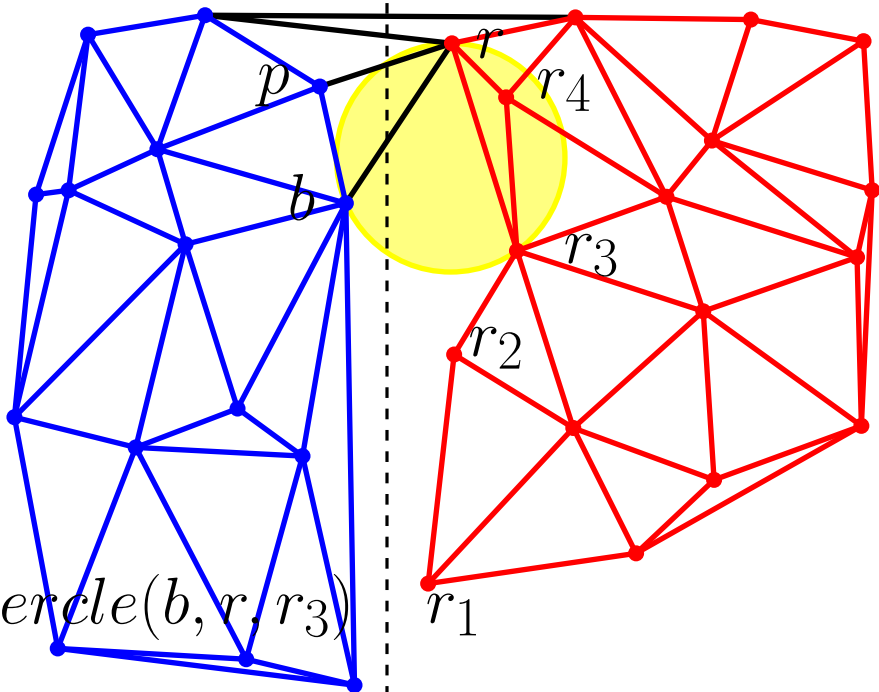
r_1

premier rouge rencontré par le faisceau de cercles



$r_3 \in Cercle(b, r, r_2)$

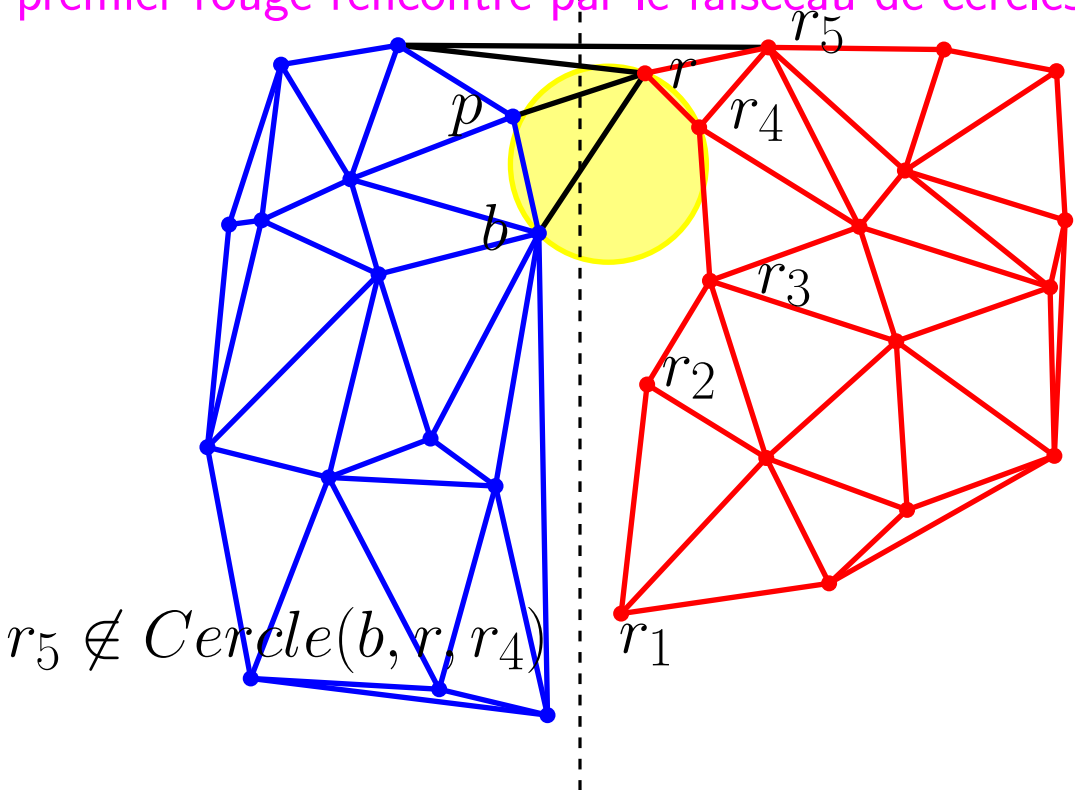
premier rouge rencontré par le faisceau de cercles



$r_4 \in Cercle(b, r, r_3)$

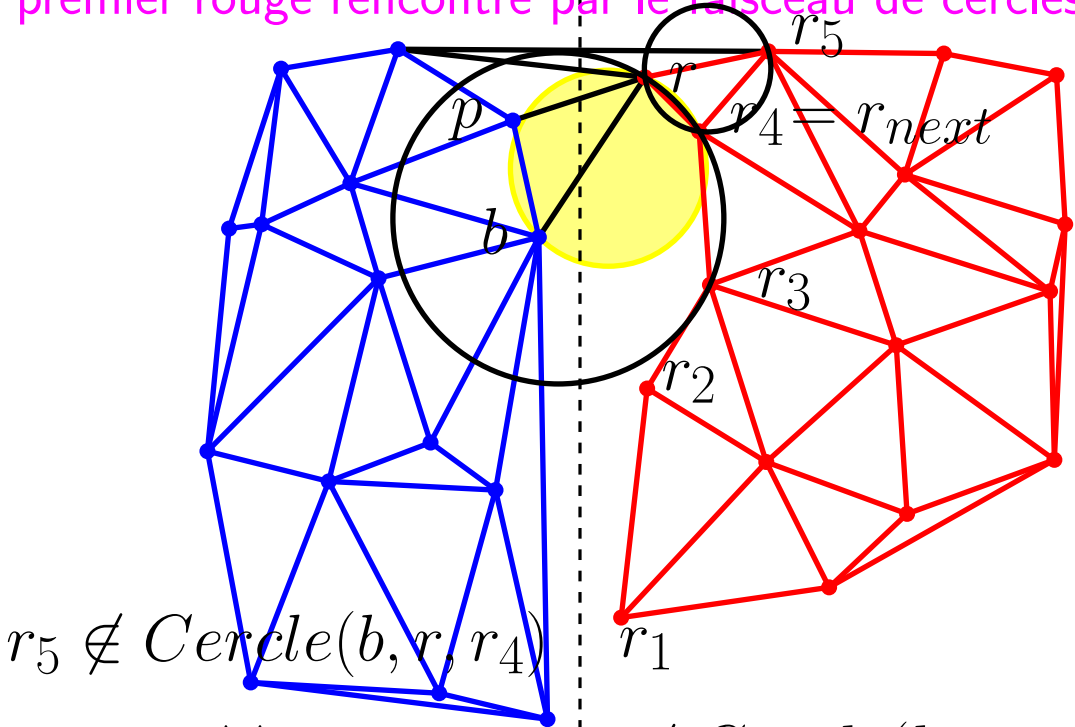
r_1

premier rouge rencontré par le faisceau de cercles



$r_5 \notin Cercle(b, r, r_4)$

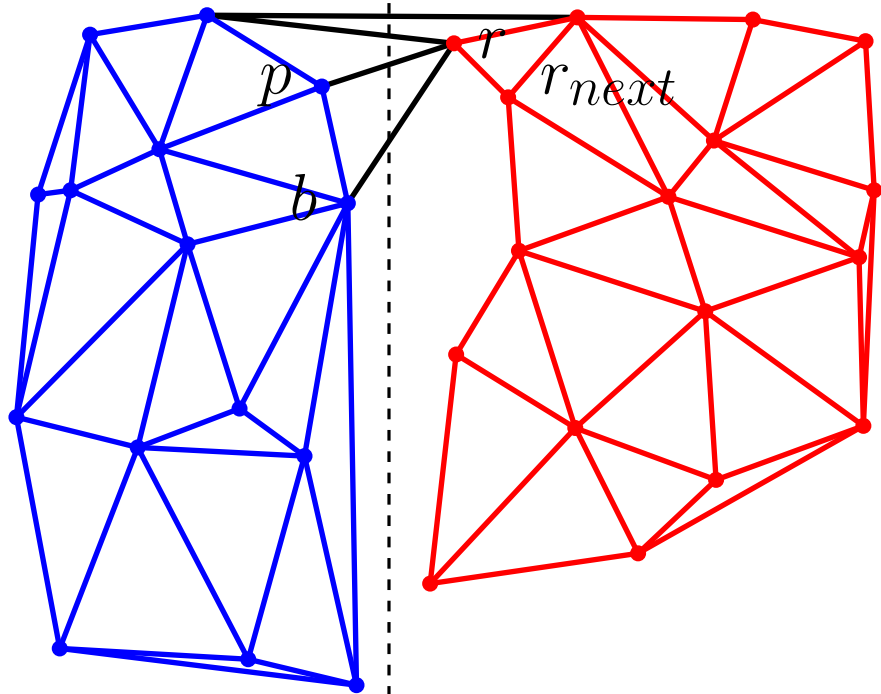
premier rouge rencontré par le faisceau de cercles



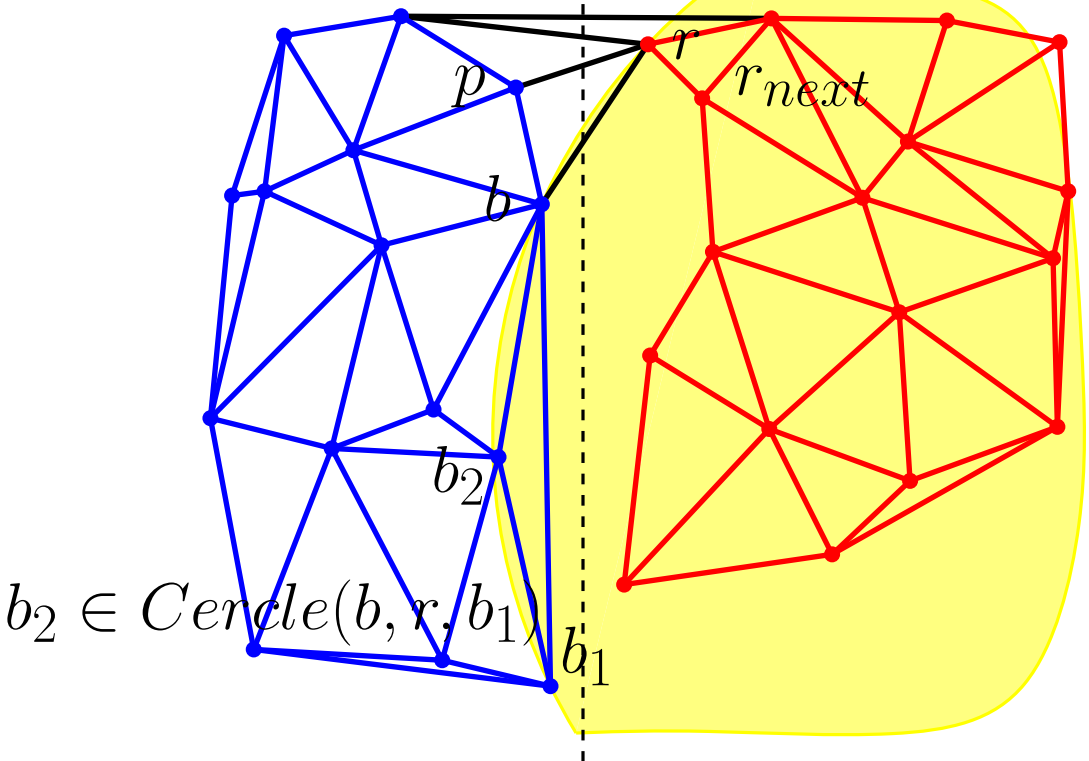
$r_5 \notin Cercle(b, r, r_4)$

$\forall \text{rouge}, \text{rouge} \notin Cercle(b, r, r_4)$

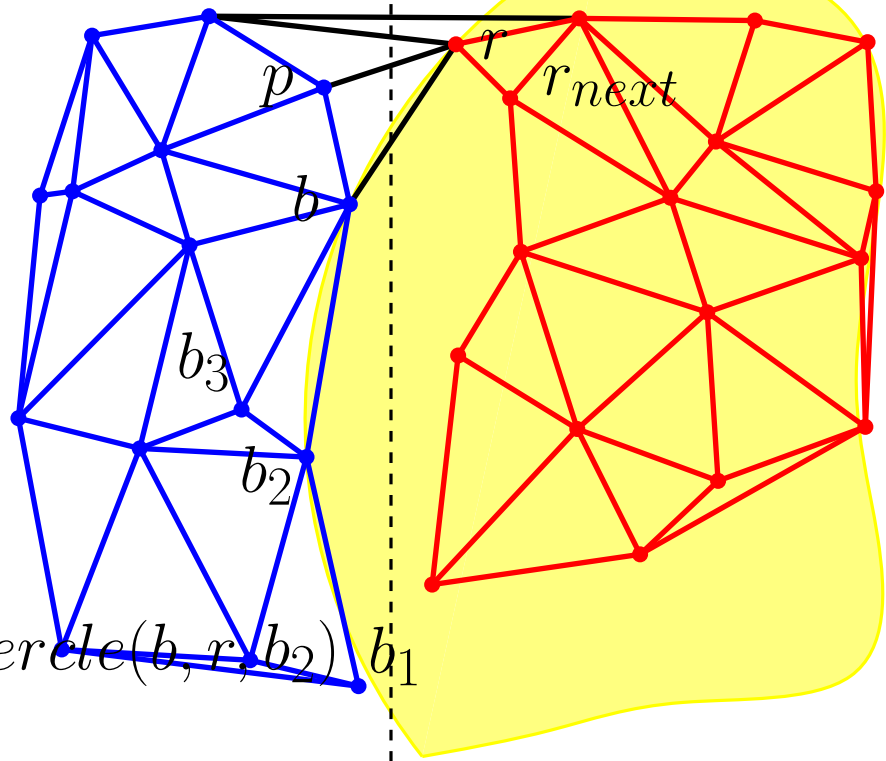
premier bleu rencontré par le faisceau de cercles



premier bleu rencontré par le faisceau de cercles

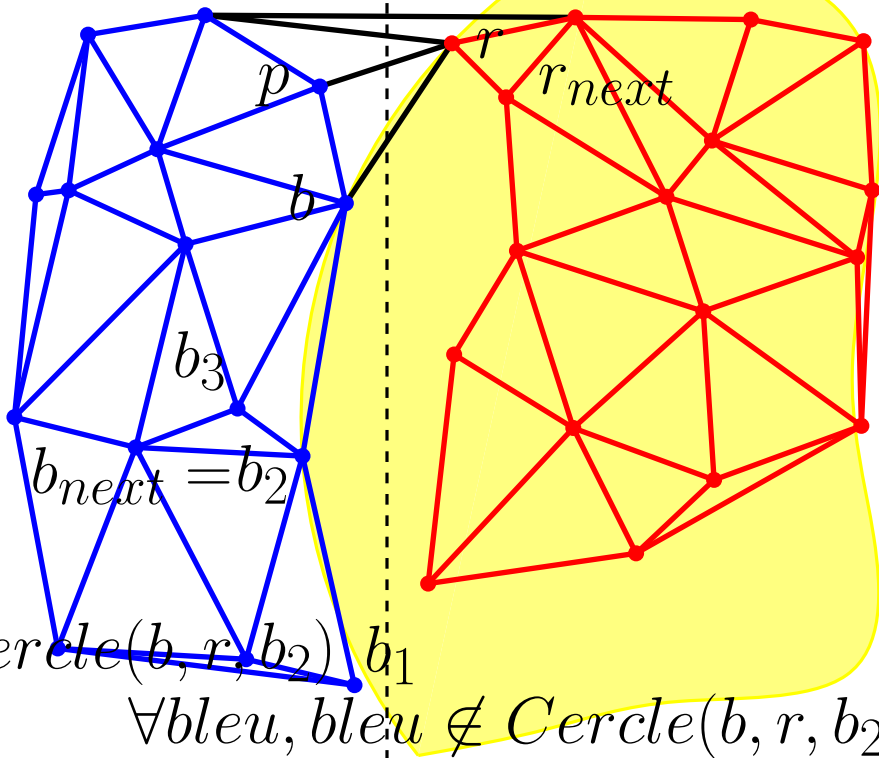


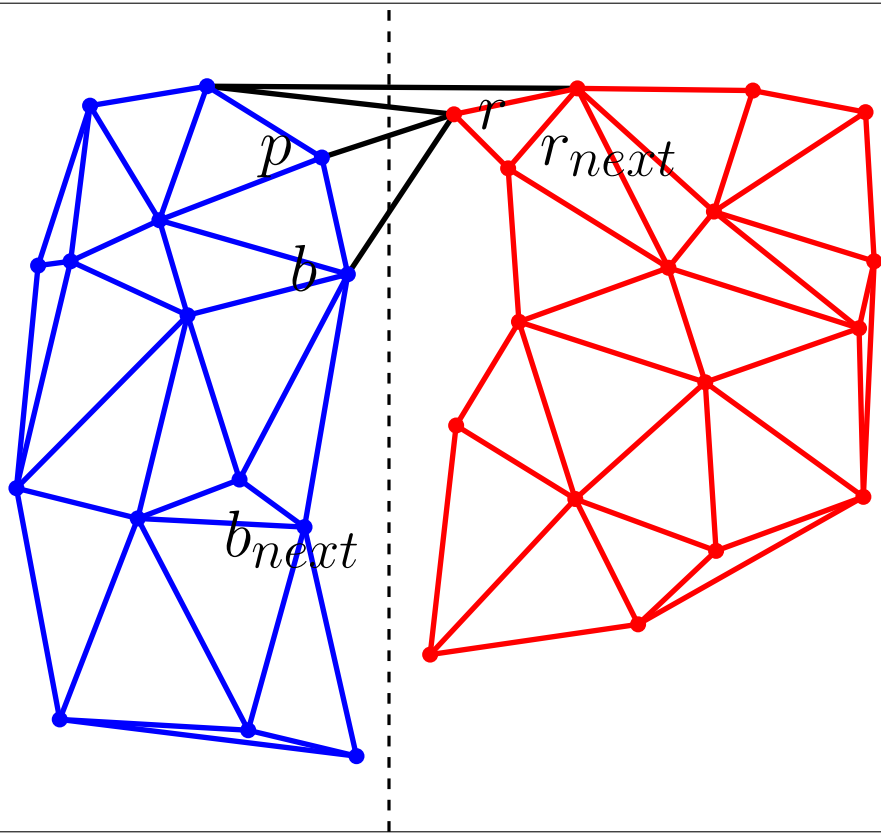
premier bleu rencontré par le faisceau de cercles



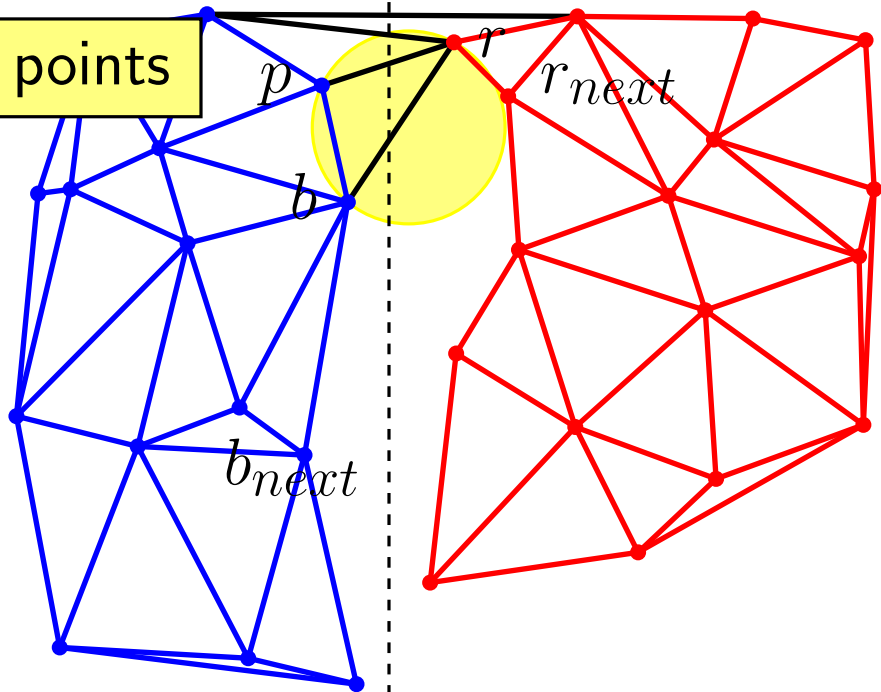
$b_3 \notin Cercle(b, r, b_2)$

premier bleu rencontré par le faisceau de cercles

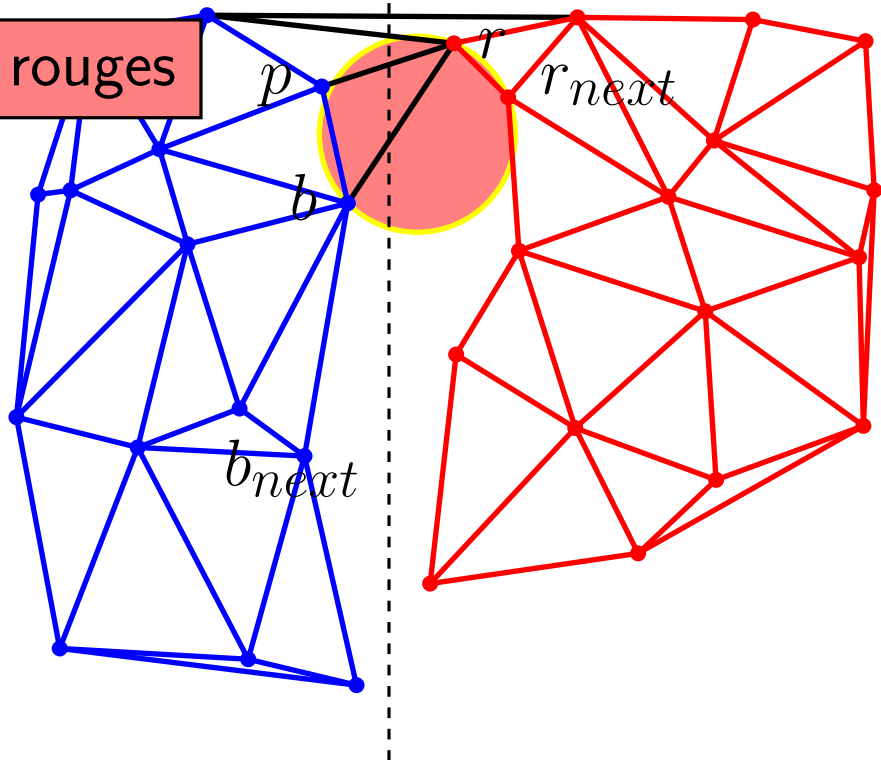




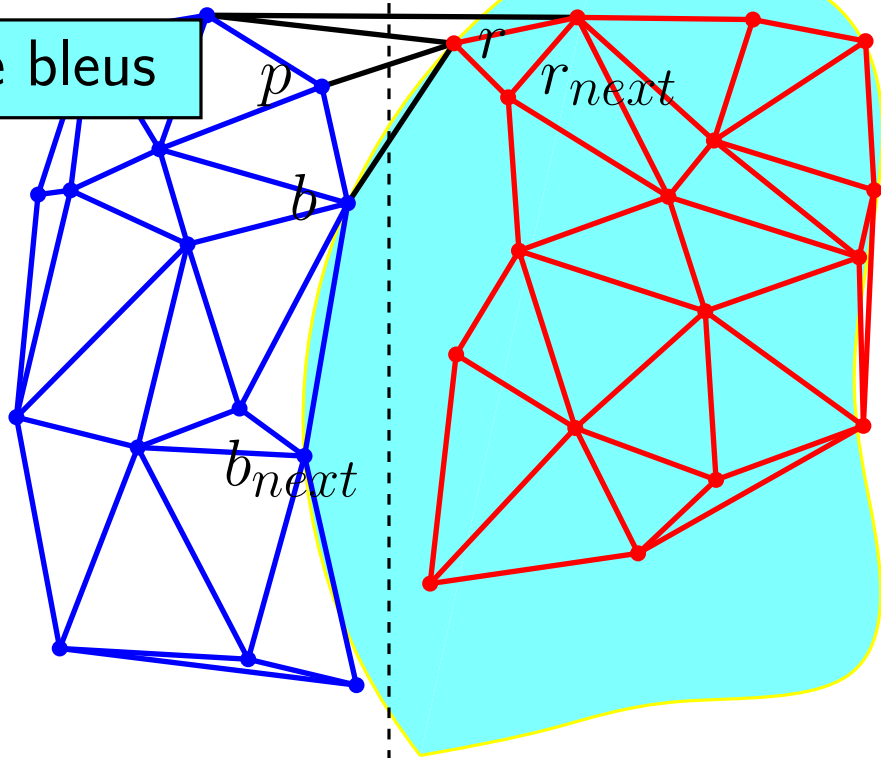
pas de points



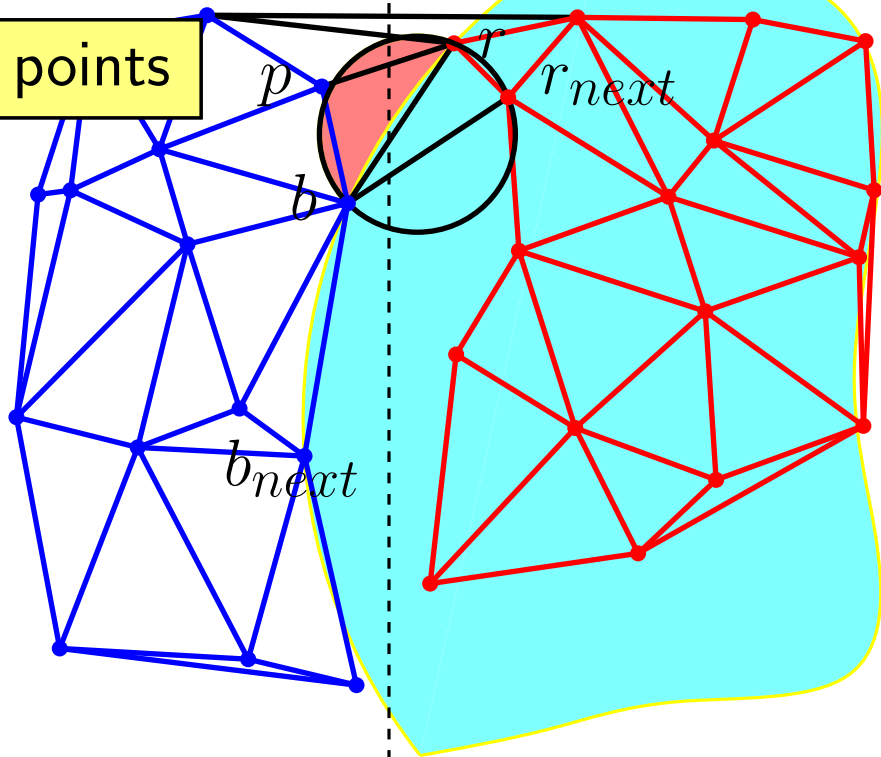
pas de rouges

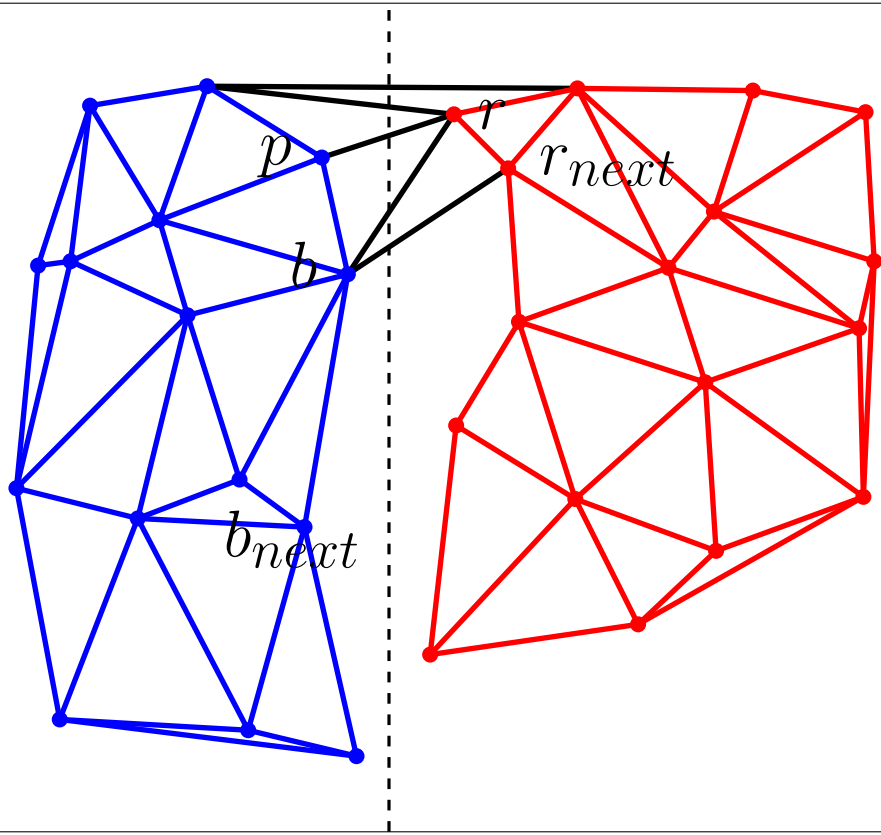


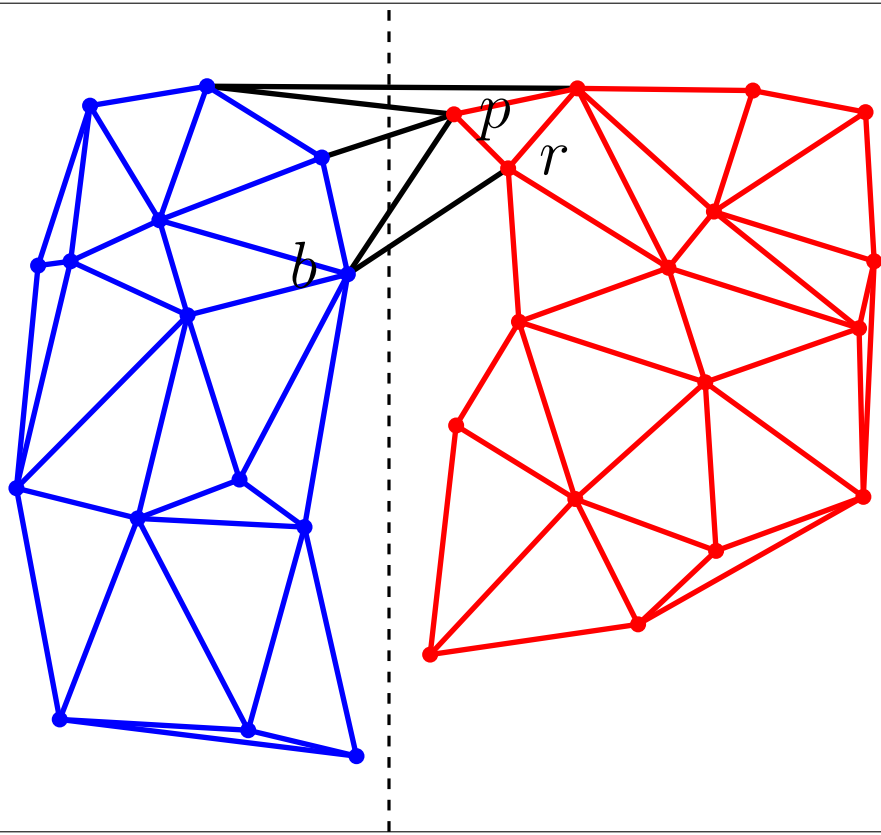
pas de bleus

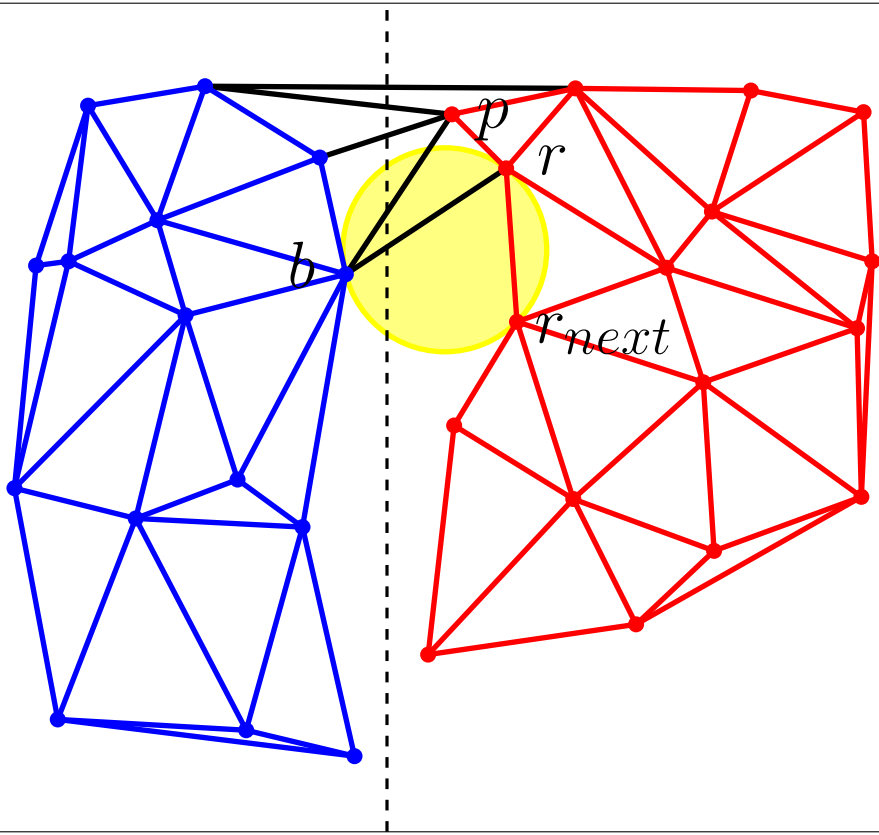


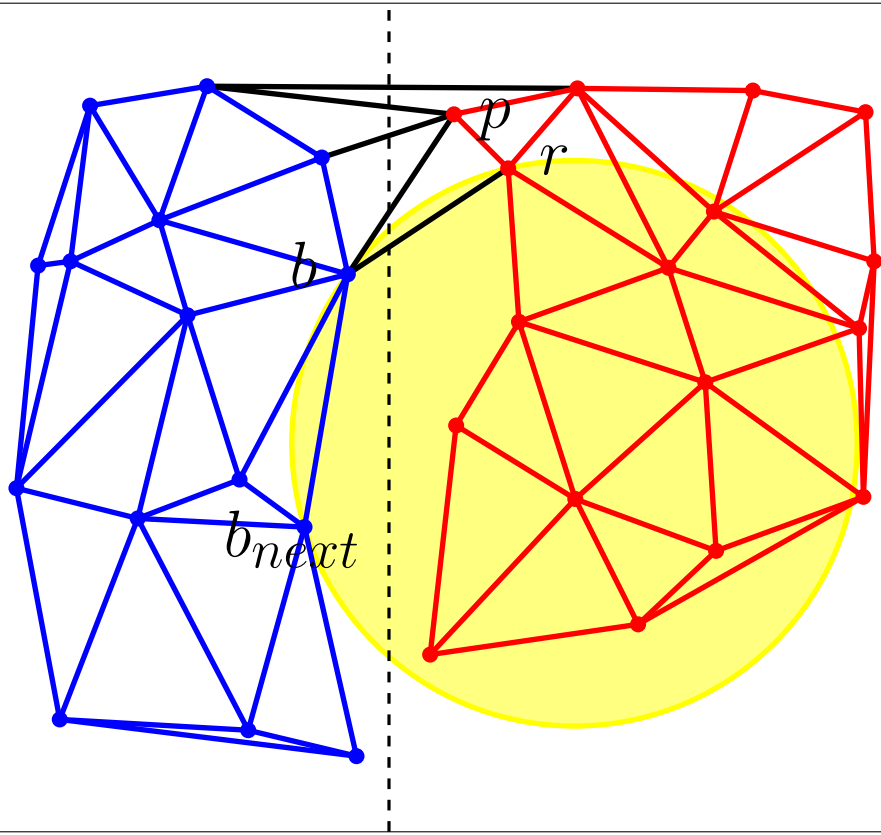
pas de points

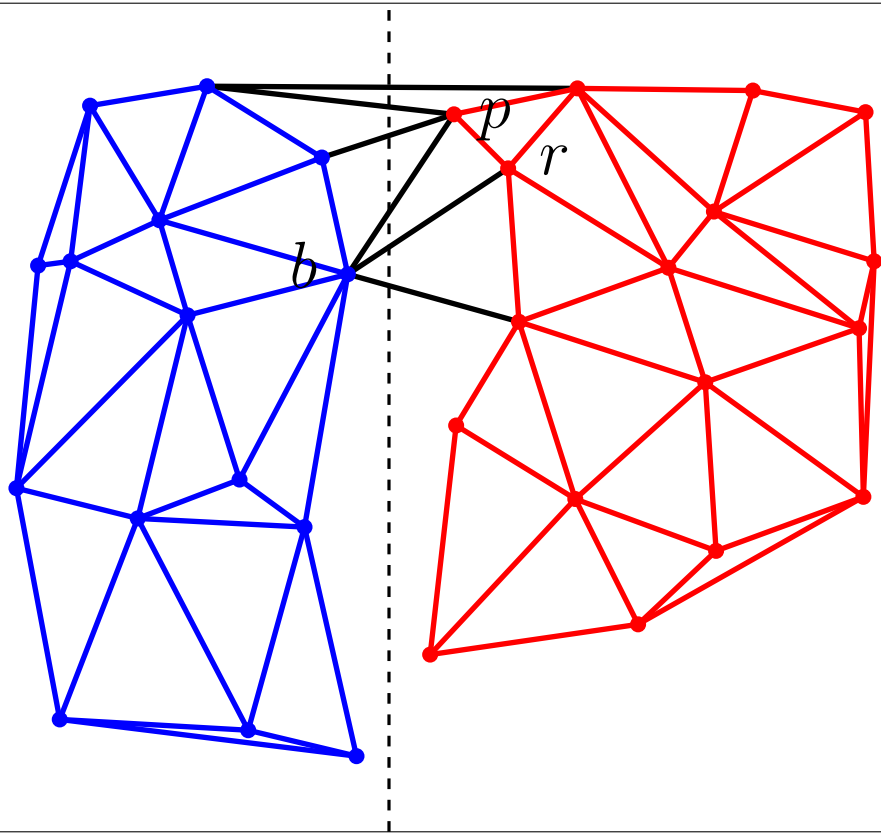


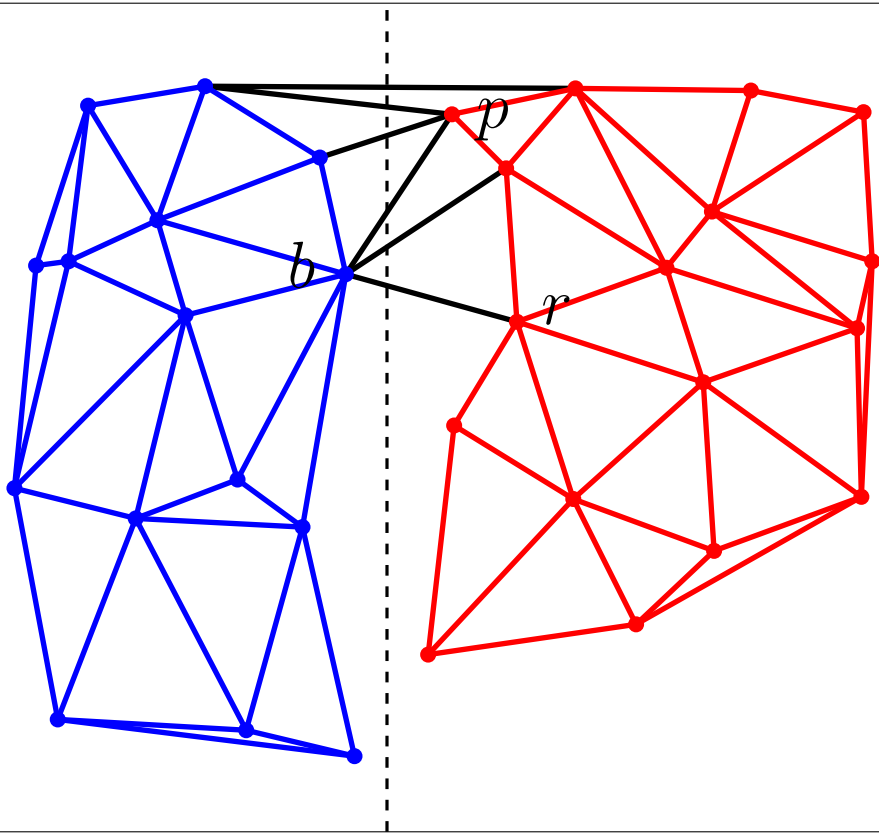


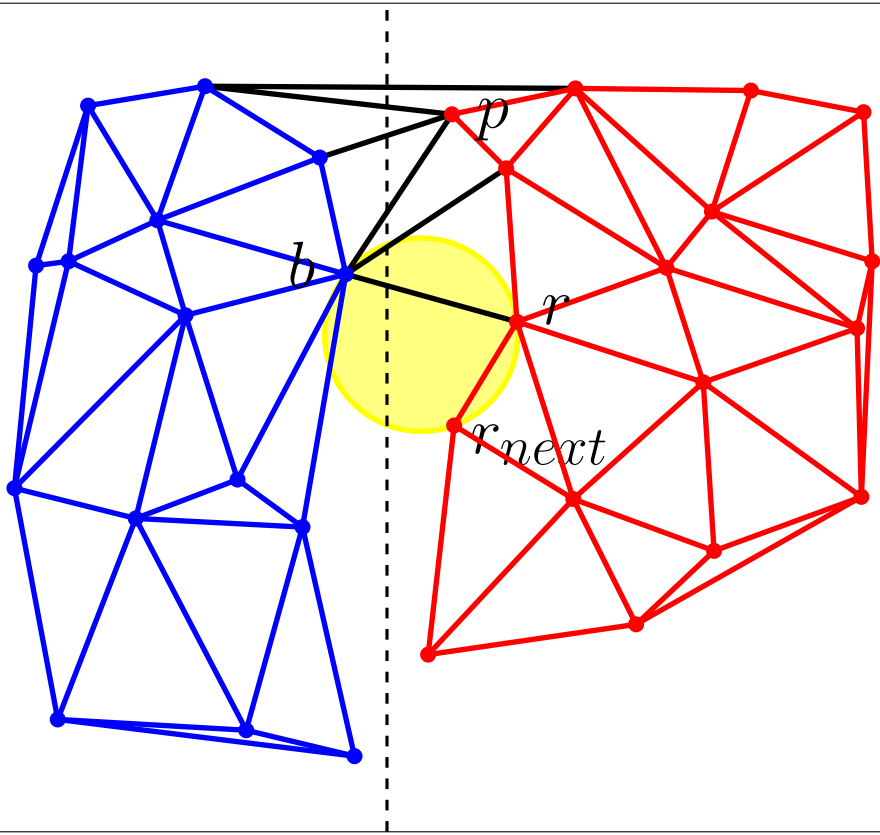


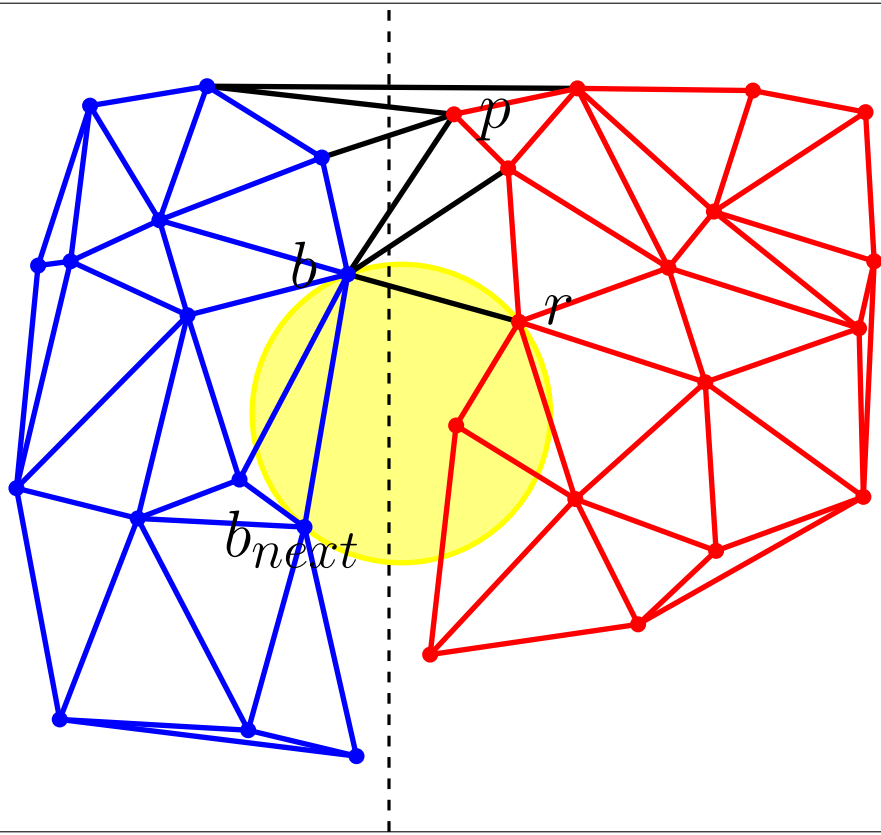


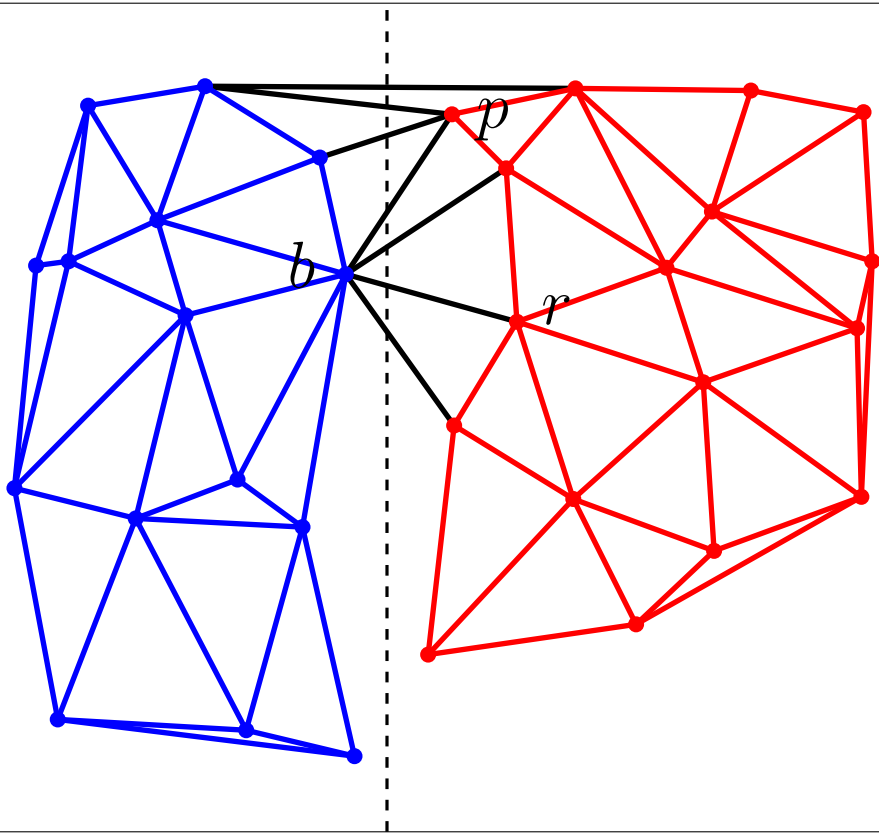


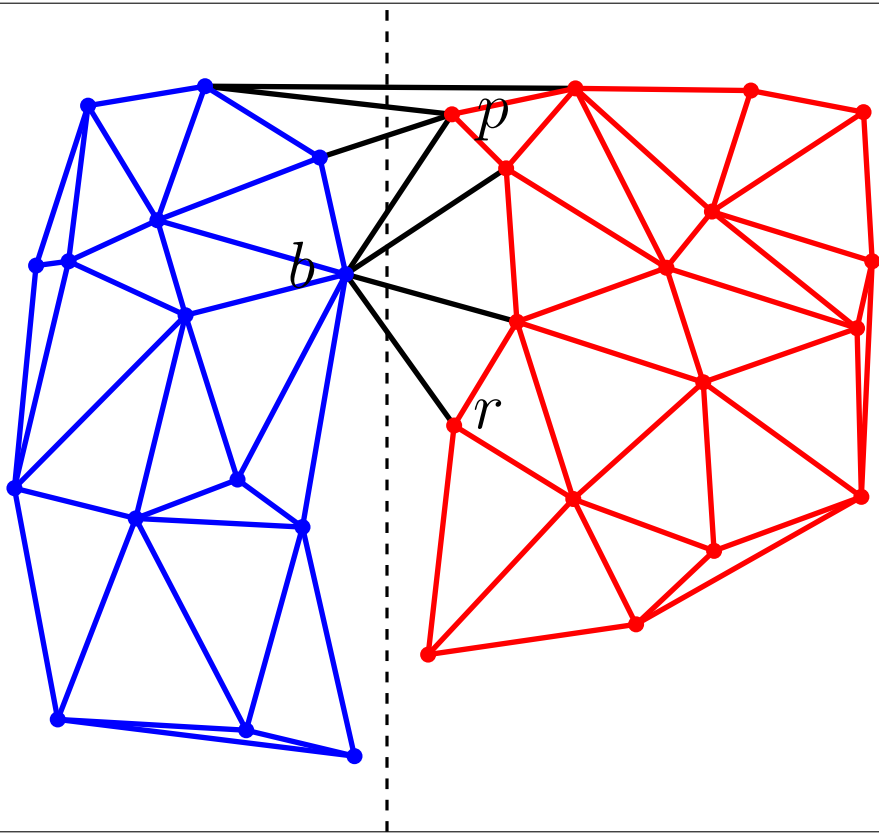


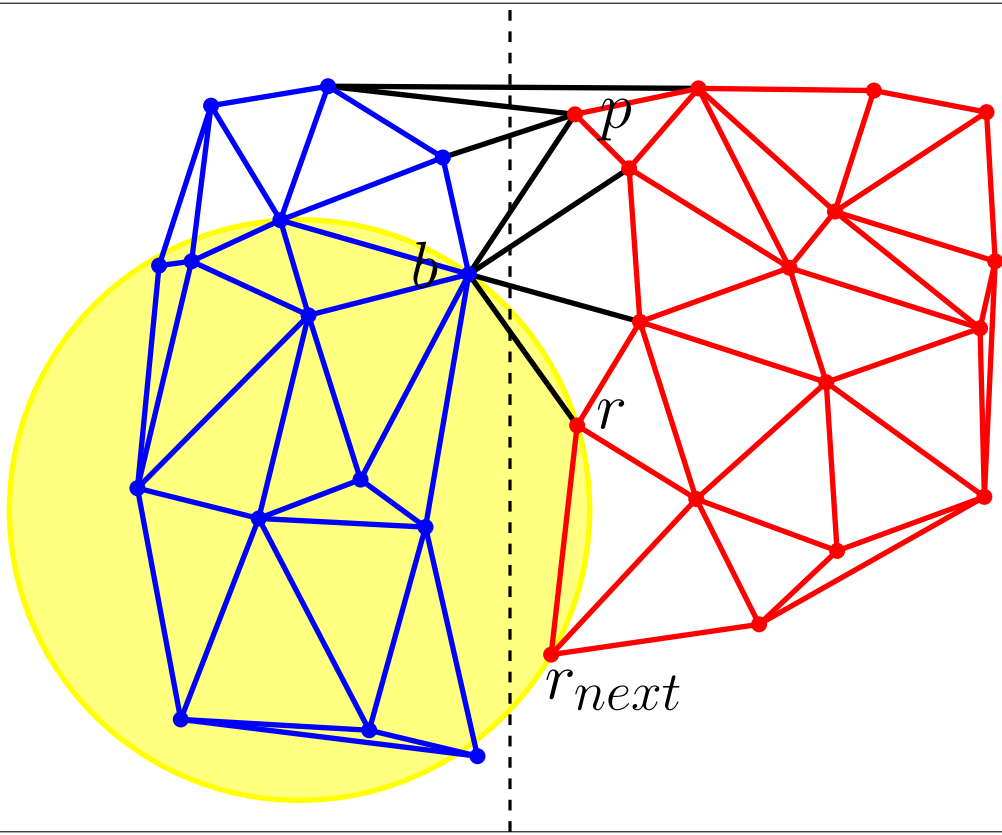


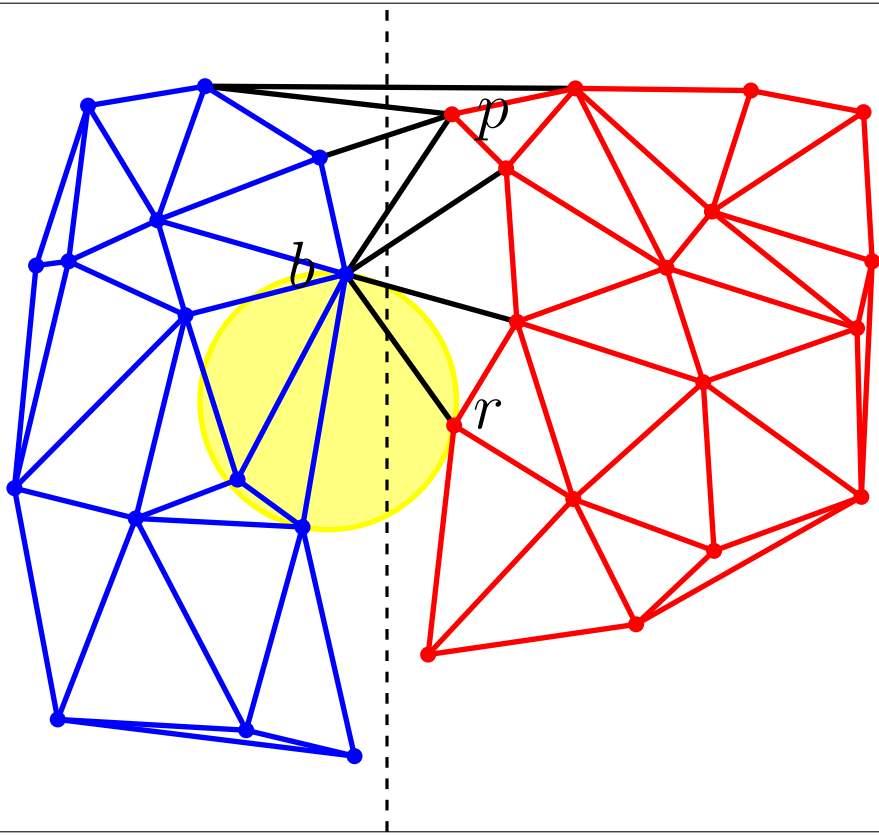


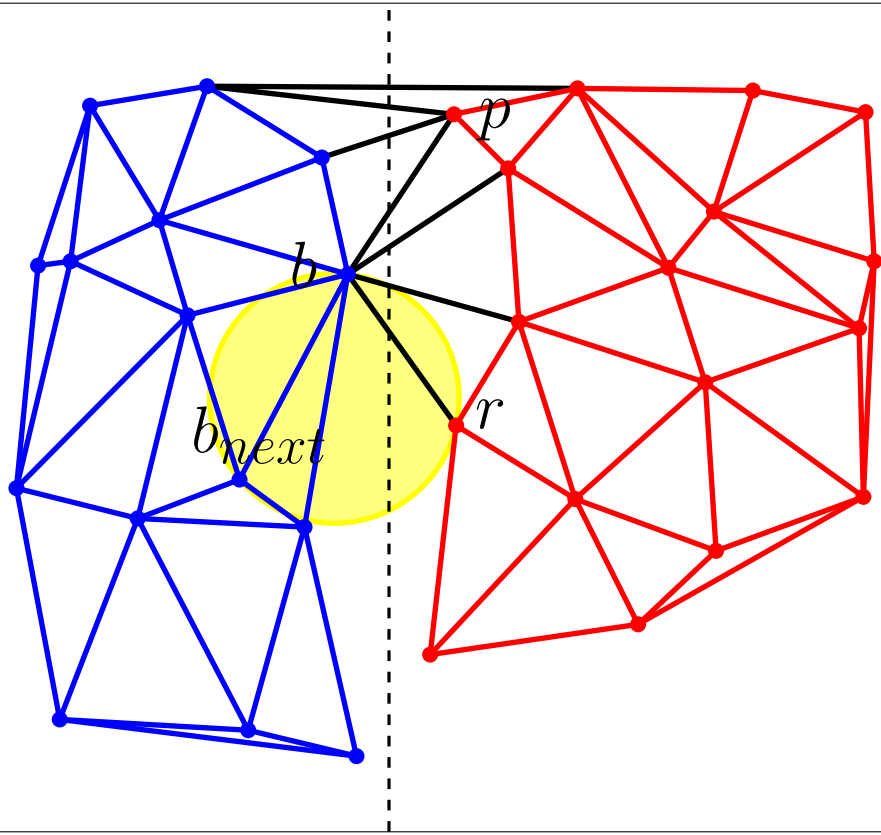


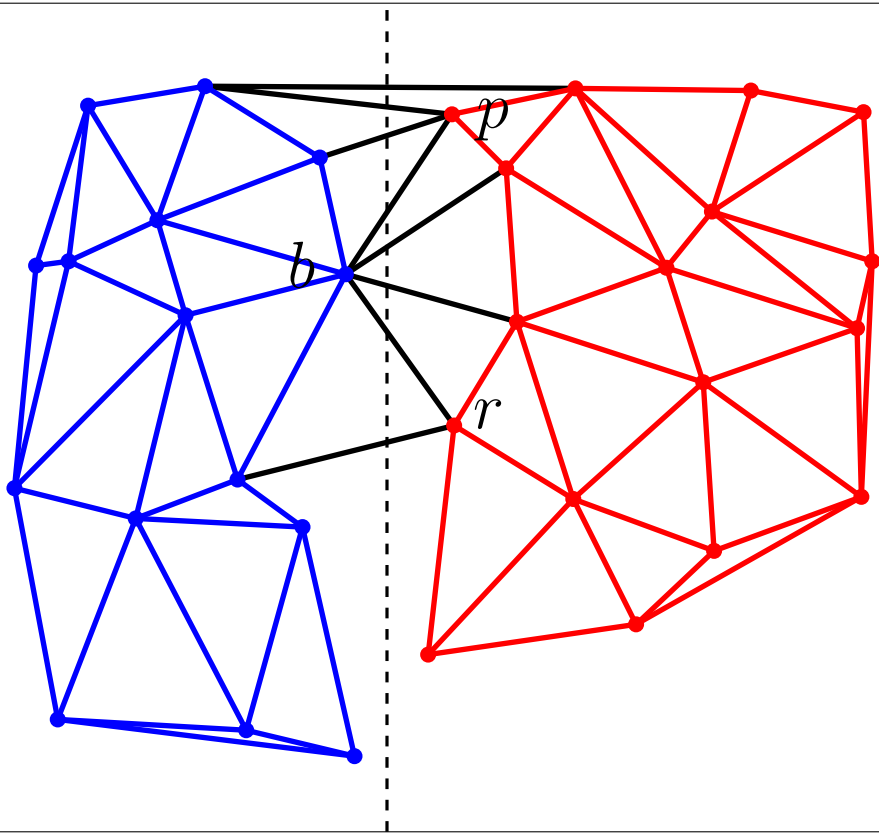


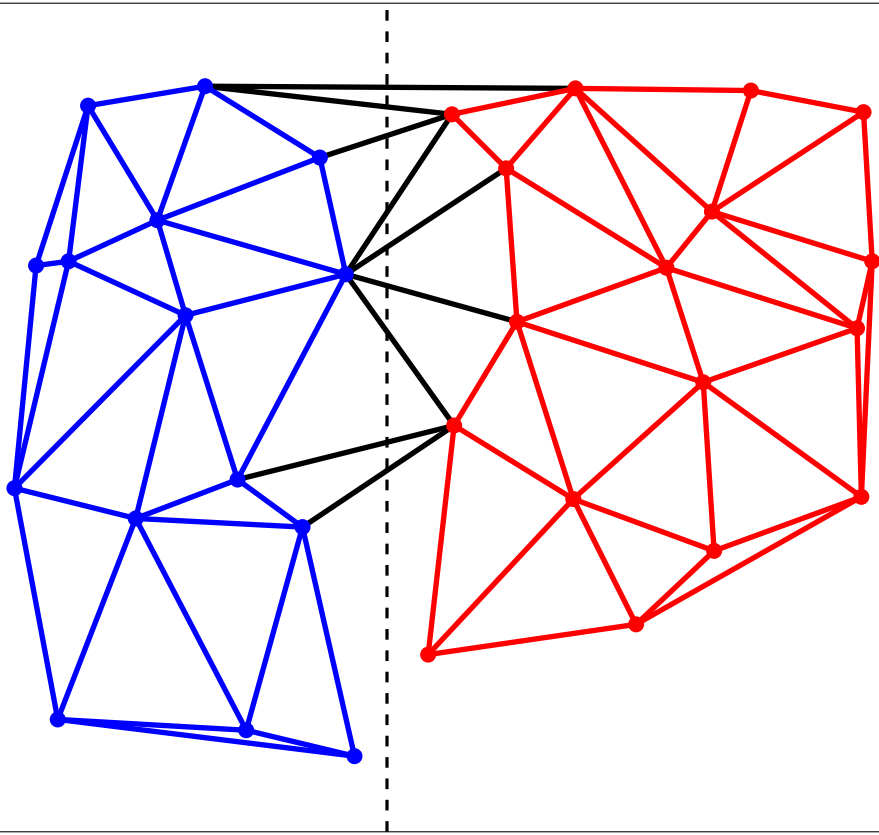


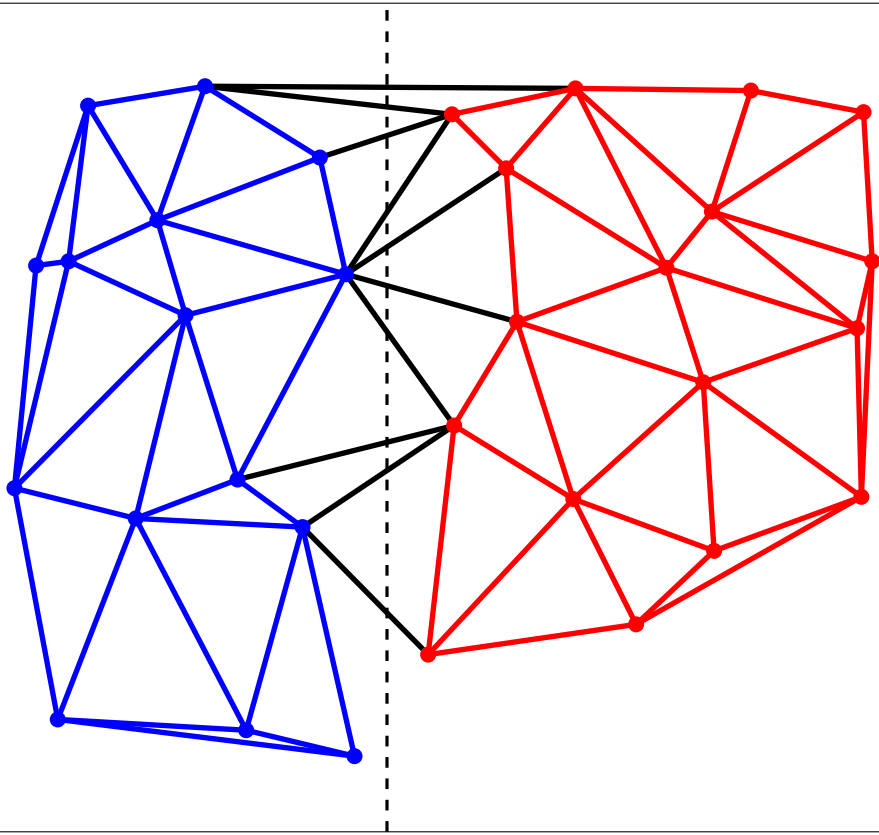


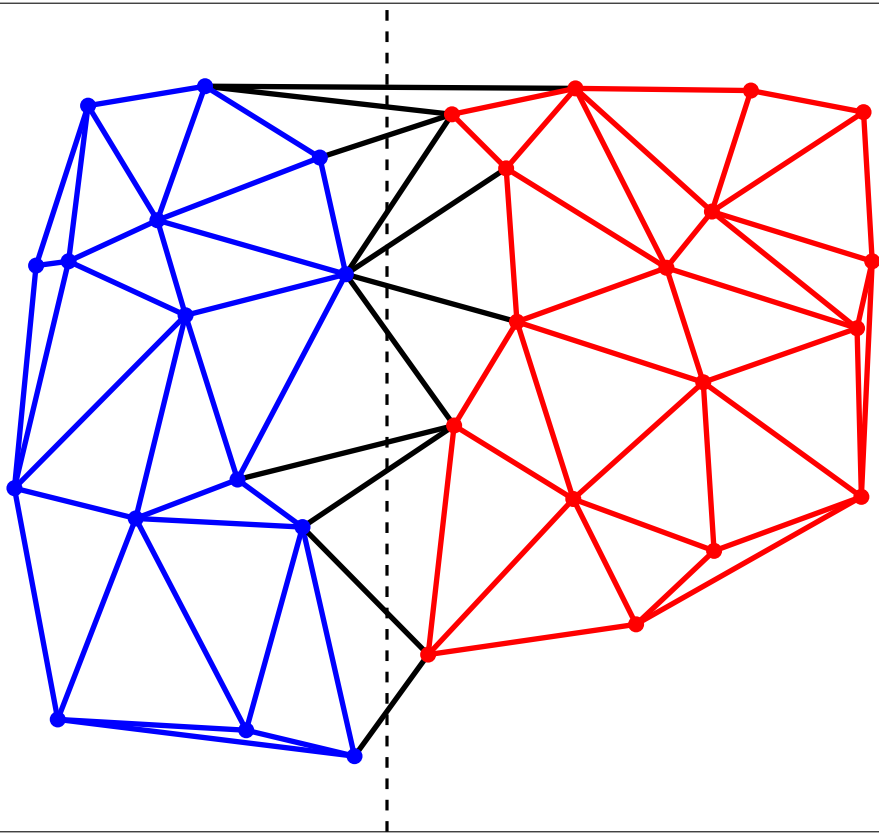


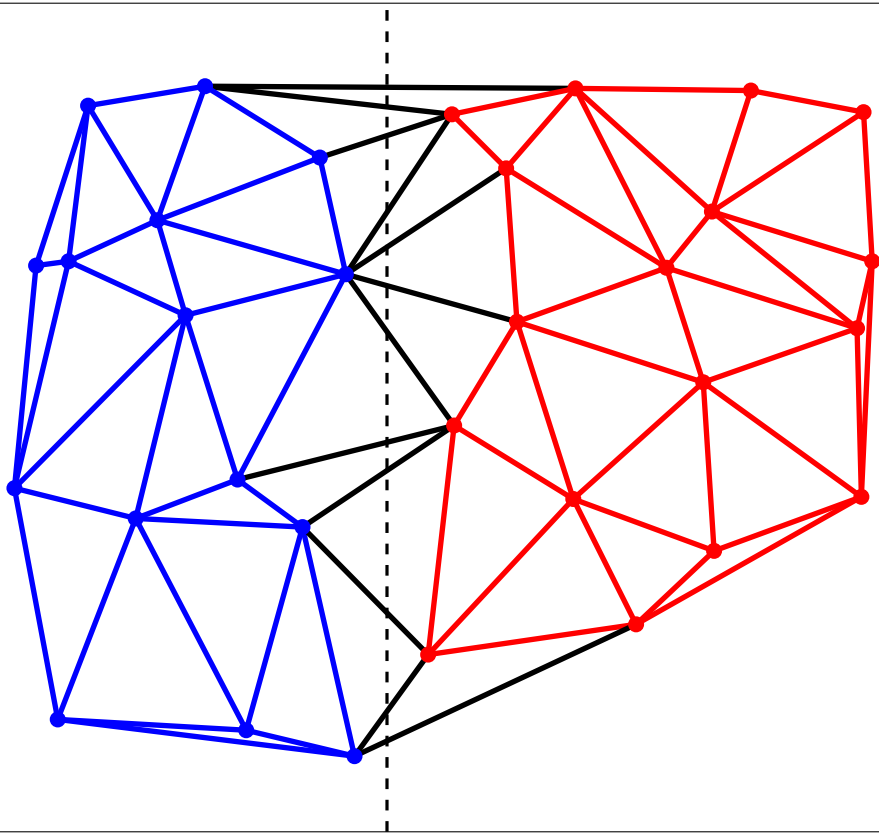












Complexité

Complexité

A chaque étape de la recherche de r_{next}

Complexité

A chaque étape de la recherche de r_{next}

On efface une arête rouge

Complexité

A chaque étape de la recherche de r_{next}

On efface une arête rouge

A chaque étape de la recherche de b_{next}

Complexité

A chaque étape de la recherche de r_{next}

On efface une arête rouge

A chaque étape de la recherche de b_{next}

On efface une arête bleue

Complexité

A chaque étape de la recherche de r_{next}

On efface une arête rouge

A chaque étape de la recherche de b_{next}

On efface une arête bleue

Choisir entre r_{next} et b_{next}

Complexité

A chaque étape de la recherche de r_{next}

On efface une arête rouge

A chaque étape de la recherche de b_{next}

On efface une arête bleue

Choisir entre r_{next} et b_{next}

On trace une arête noire

Complexité

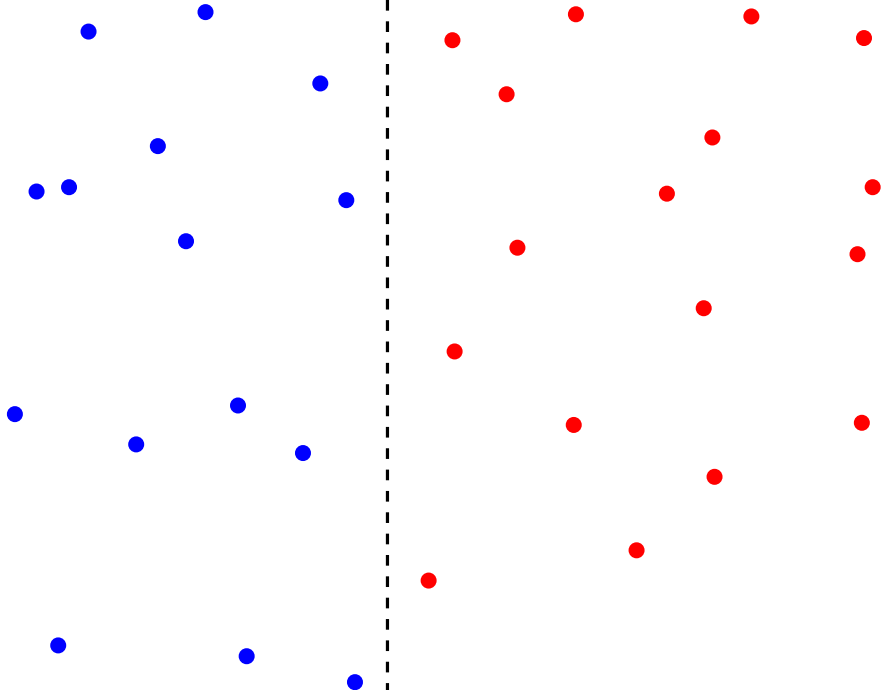
$$\text{Complexité} \leq \begin{aligned} & \# \text{ arêtes rouges} \\ & + \# \text{ arêtes bleues} \\ & + \# \text{ arêtes noires} \end{aligned}$$

Complexité

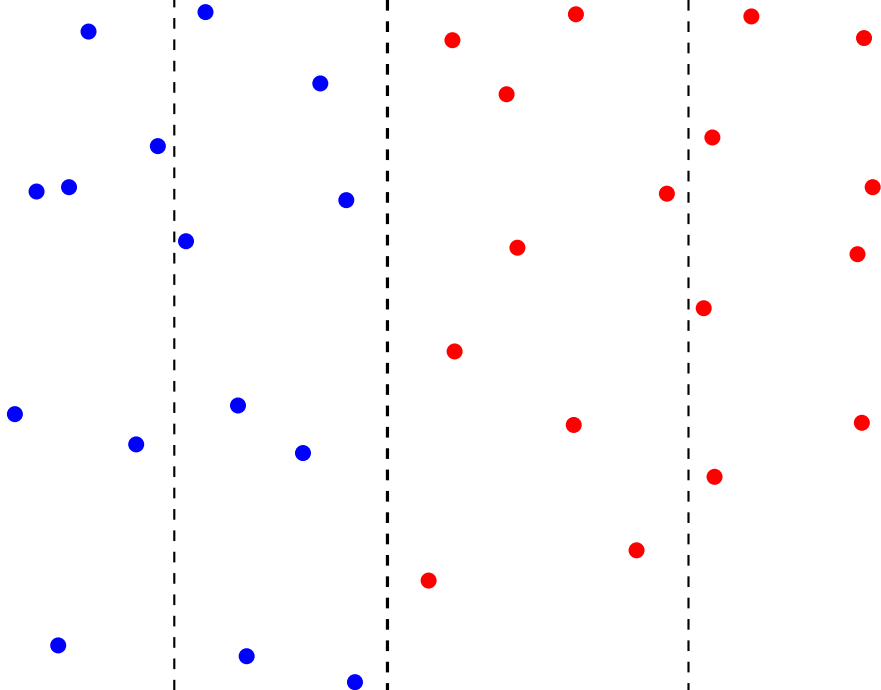
$$\begin{aligned} \text{Complexité} &\leq \# \text{ arêtes rouges} \\ &\quad + \# \text{ arêtes bleues} \\ &\quad + \# \text{ arêtes noires} \\ &\leq 3n + 3n = O(n) \end{aligned}$$

Division-Fusion $\implies O(n \log n)$

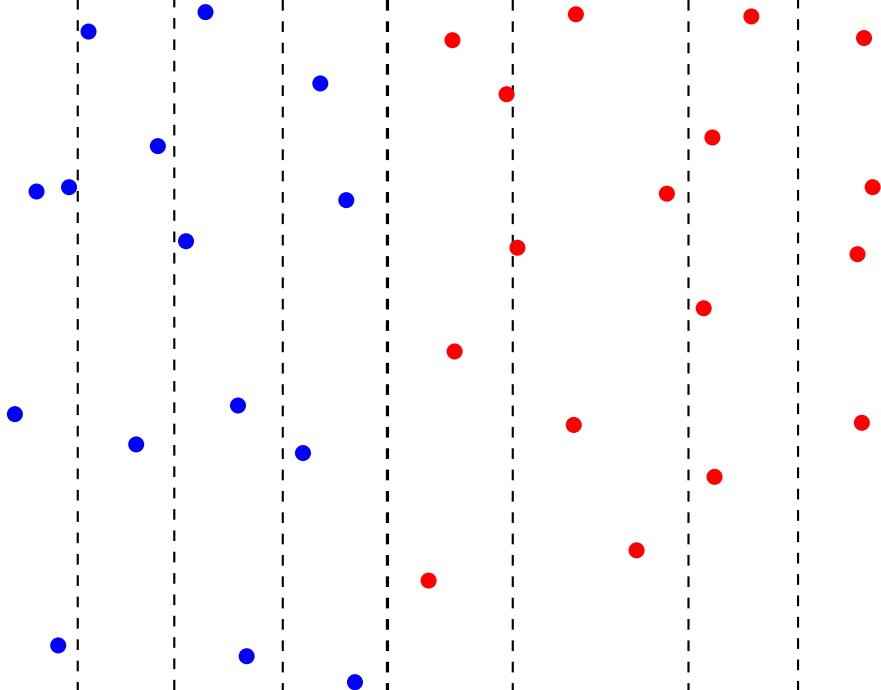
Division



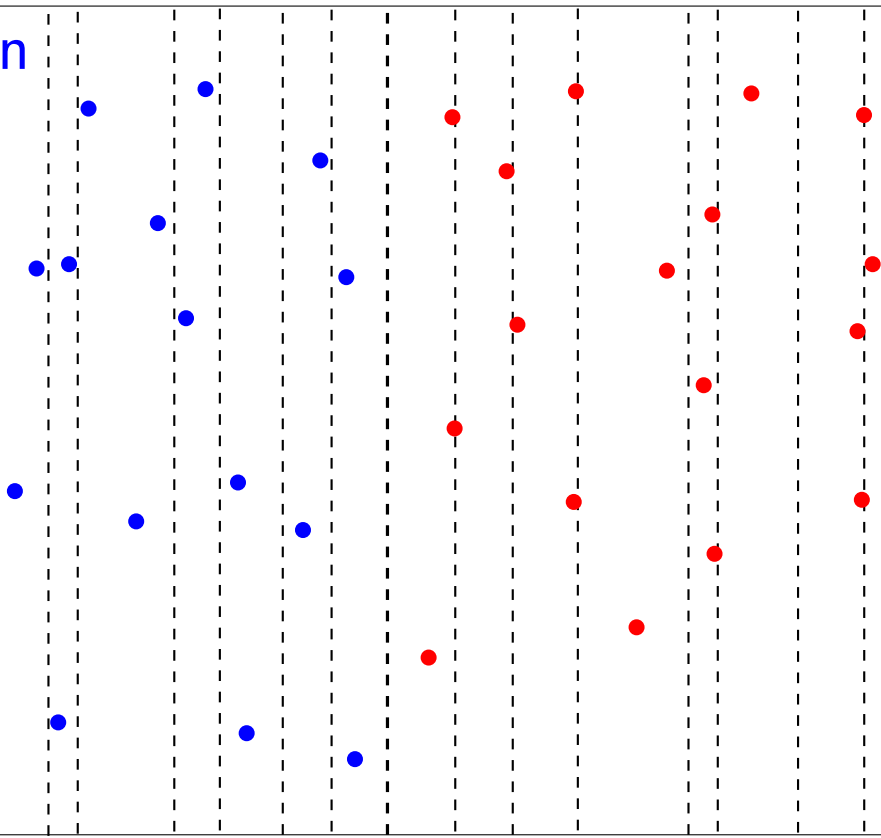
Division



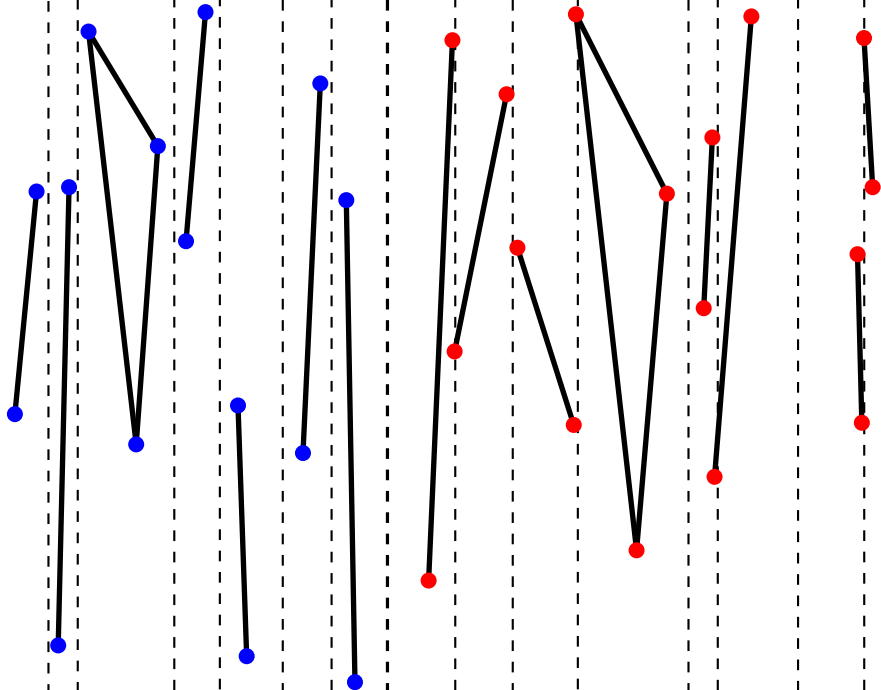
Division



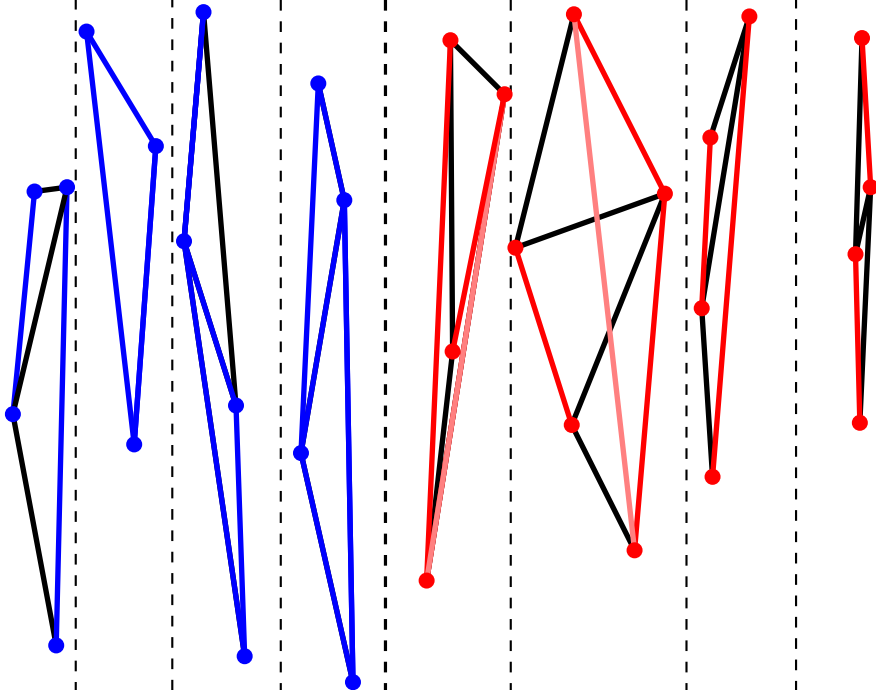
Division



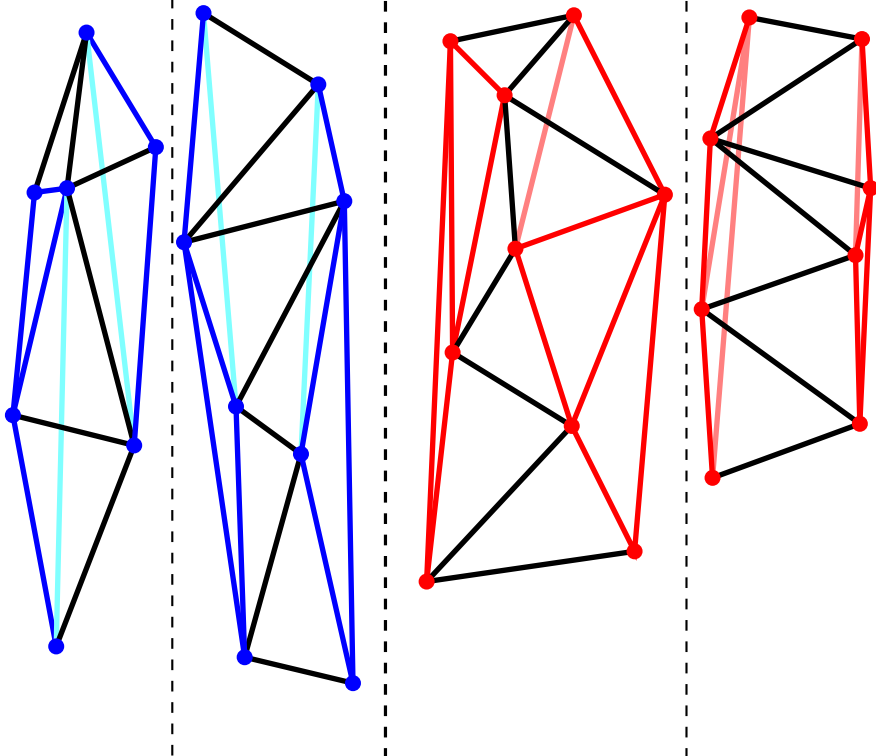
Division Fusion



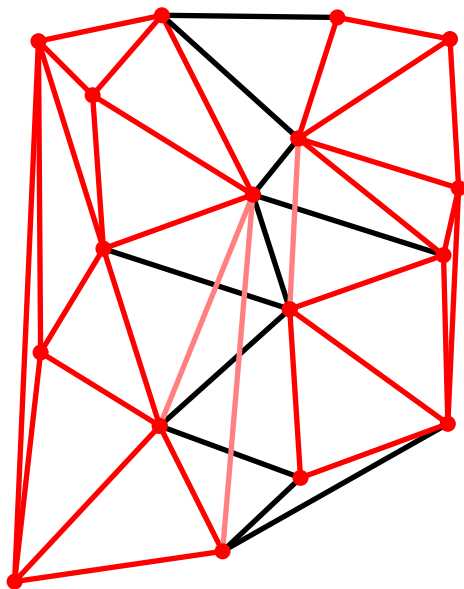
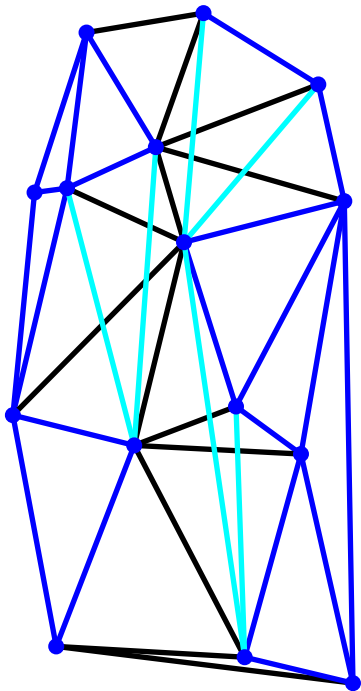
Division
Fusion



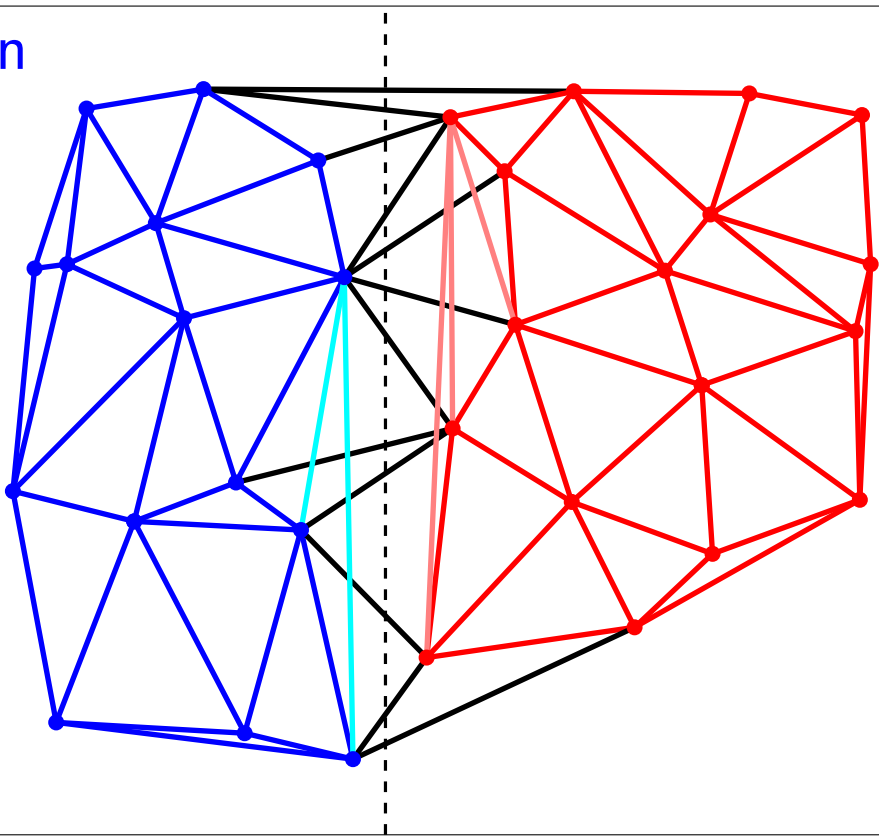
Division
Fusion



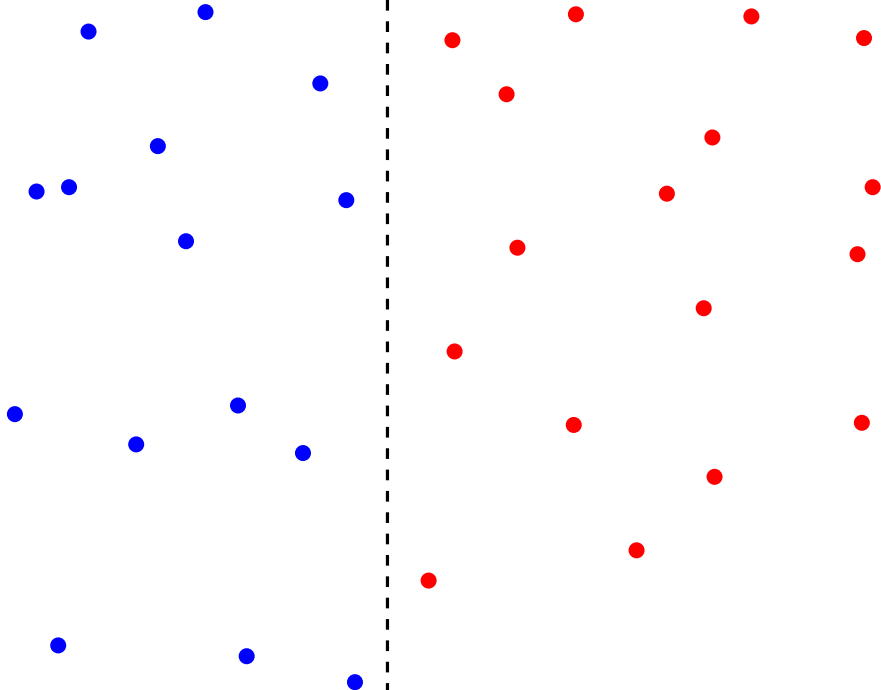
Division
Fusion



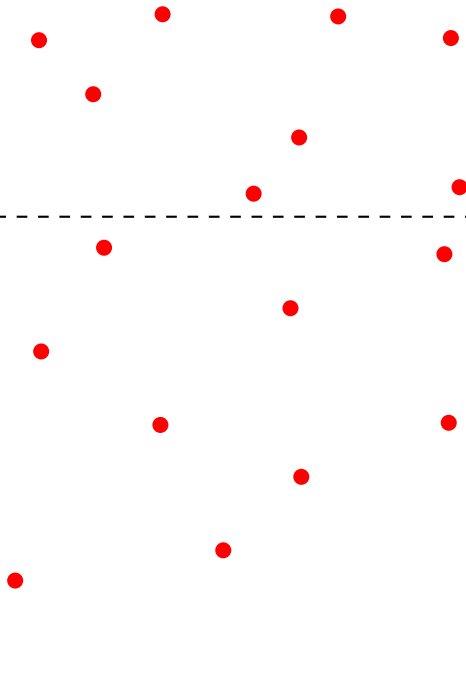
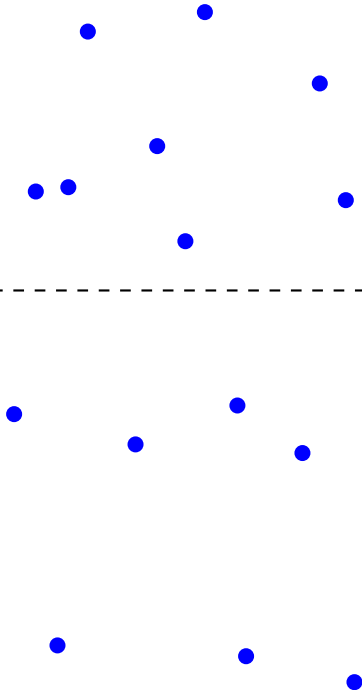
Division
Fusion



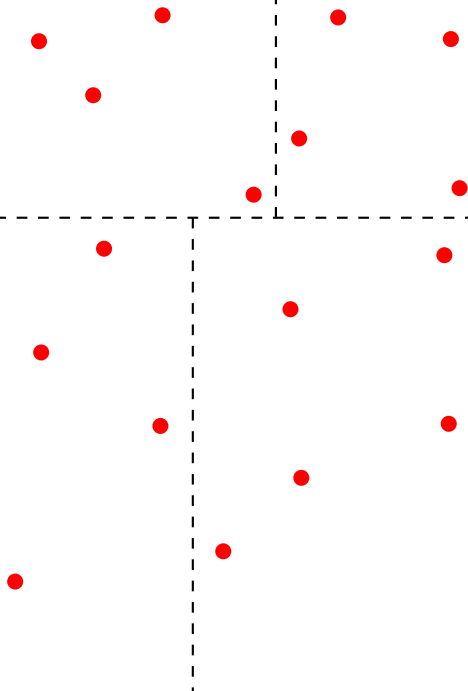
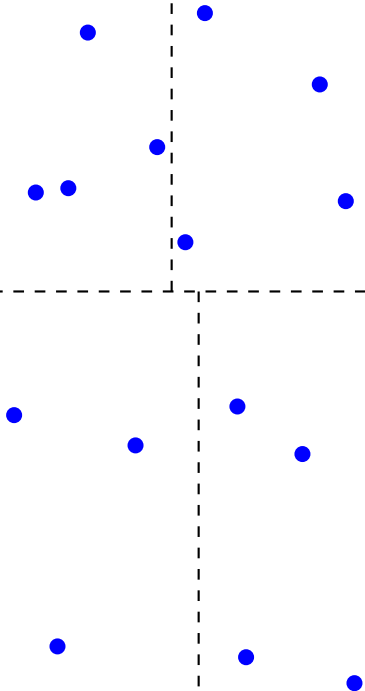
Division



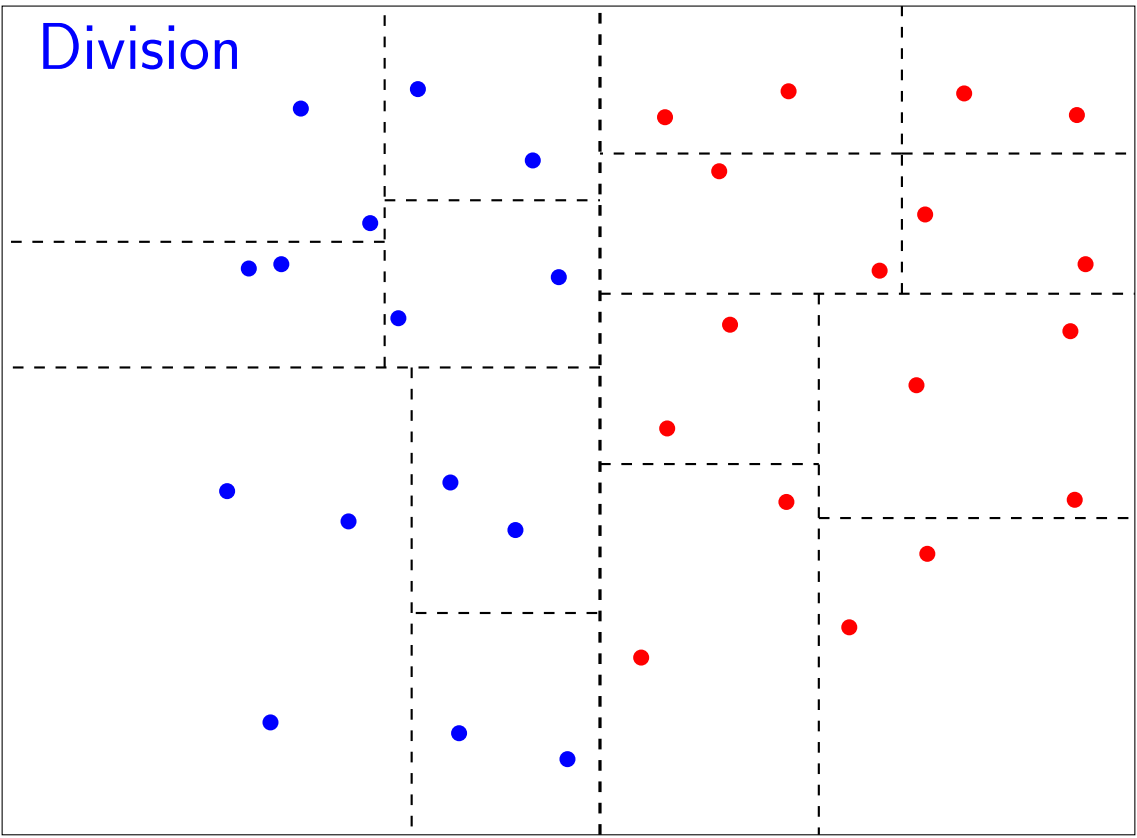
Division



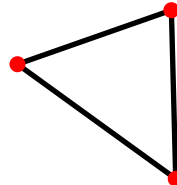
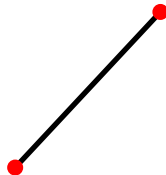
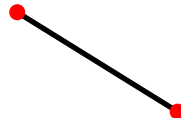
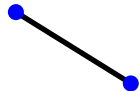
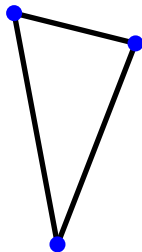
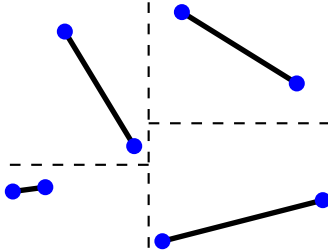
Division



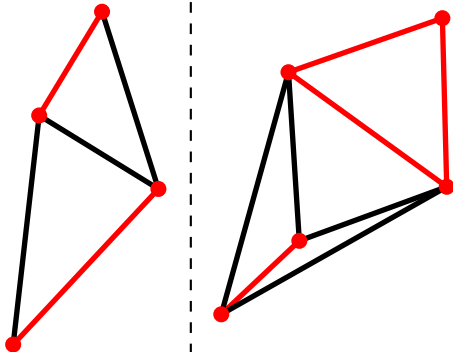
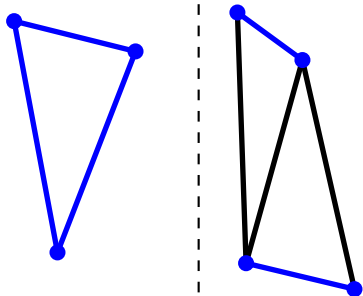
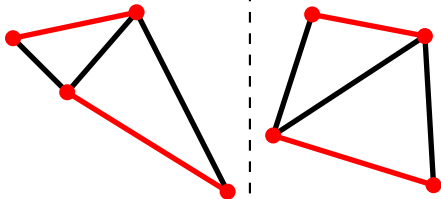
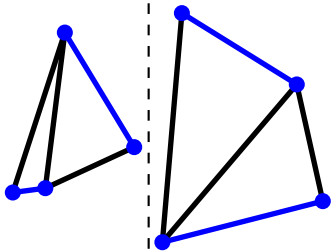
Division



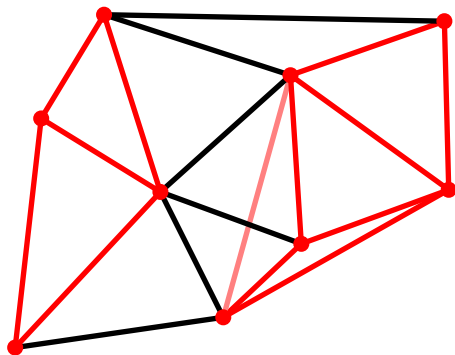
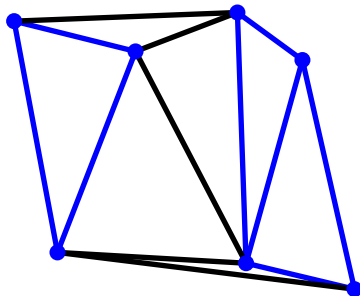
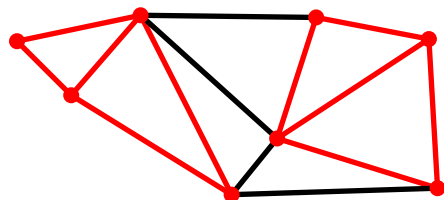
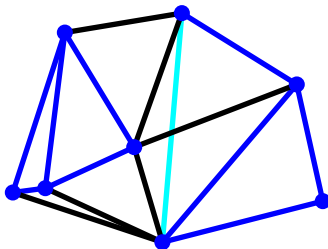
Division
Fusion



Division
Fusion

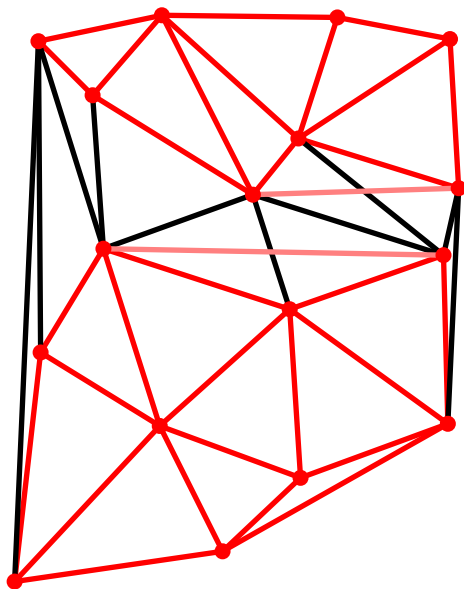
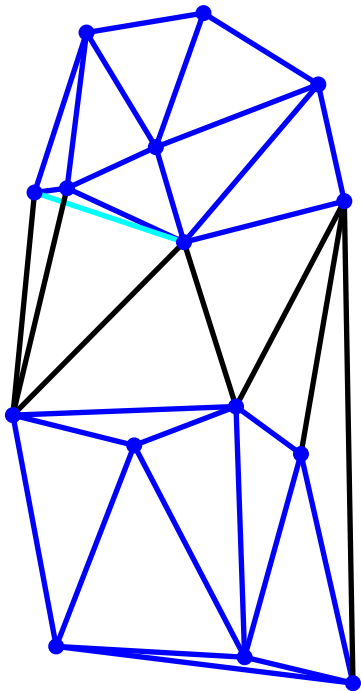


Division
Fusion

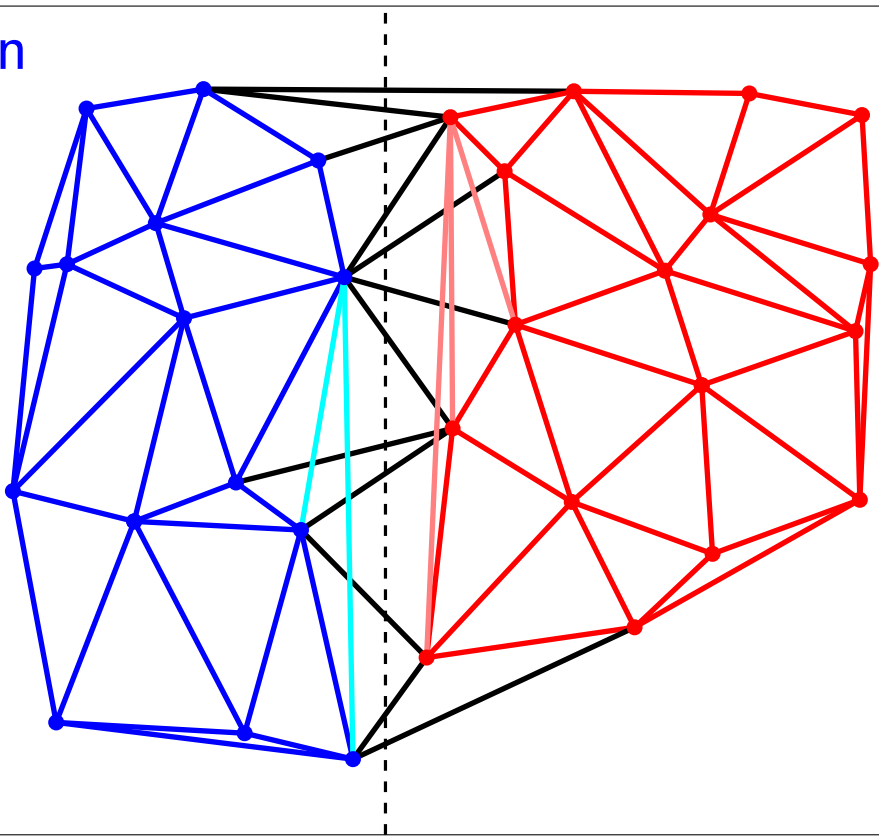


Division

Fusion



Division
Fusion



Complexité

Complexité

Fusion

Complexité

Fusion

$$O(n)$$

Complexité

Fusion

$$O(n)$$

Division ?

Complexité

Fusion

$O(n)$

Division ?

médian ?

Complexité

Fusion

$O(n)$

Division ?

médian ?

plus difficile

Complexité

Fusion

$$O(n)$$

Division ?

médian ?

$$O(n)$$

Complexité

Points aléatoires

Fusion

$O(n)$

$O(\sqrt{n})$

Division ?

médian ?

$O(1)$

$O(n)$

$$f(n) = O(\sqrt{n}) + 2f\left(\frac{n}{2}\right)$$

$$f(n) = \sqrt{n} + 2f\left(\frac{n}{2}\right)$$

$$\sqrt{n} + 2\left(\sqrt{\frac{n}{2}} + f\left(\frac{n}{4}\right)\right)$$

$$\sqrt{n} + 2\left(\sqrt{\frac{n}{2}} + 2\left(\sqrt{\frac{n}{4}} + f\left(\frac{n}{8}\right)\right)\right)$$

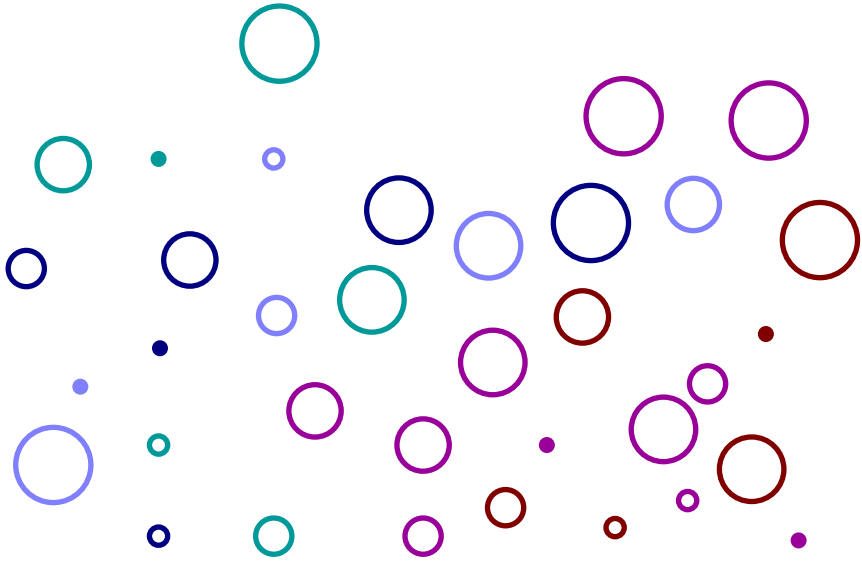
$$\underbrace{\sqrt{n} + 2\sqrt{\frac{n}{2}} + \dots + \frac{n}{2}\sqrt{2} + n\sqrt{1}}_{\log_2 n}$$

$$f(n) \leq n + 2^{-\frac{1}{2}}n + \dots + 2^{-\frac{i}{2}}n + \dots$$

$$f(n) = O(n)$$

Médian linéaire

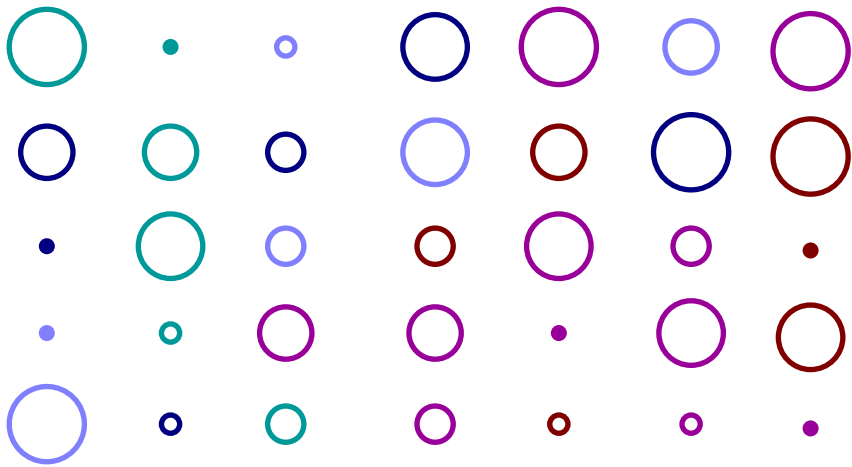
Médian linéaire



n nombres

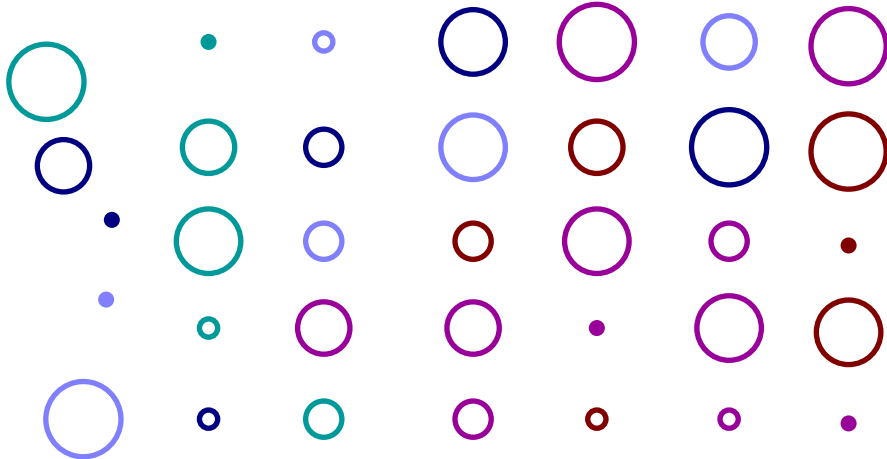
Médian linéaire

des paquets de 5



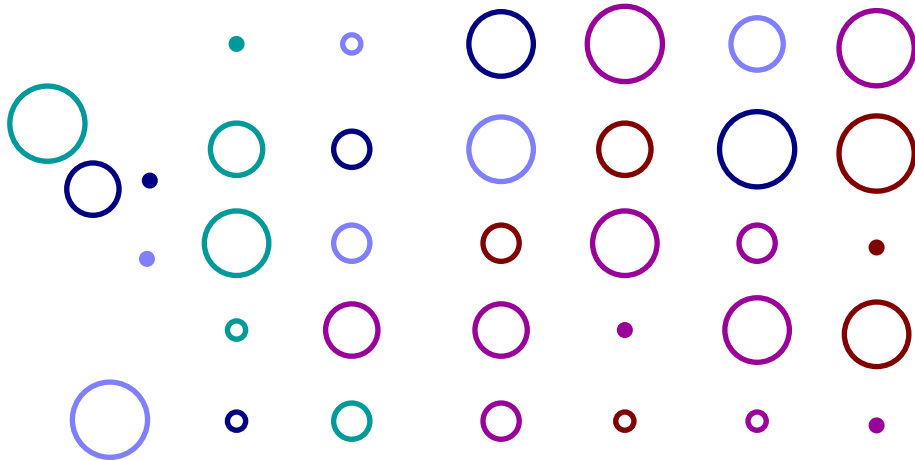
Médian linéaire

des paquets de 5



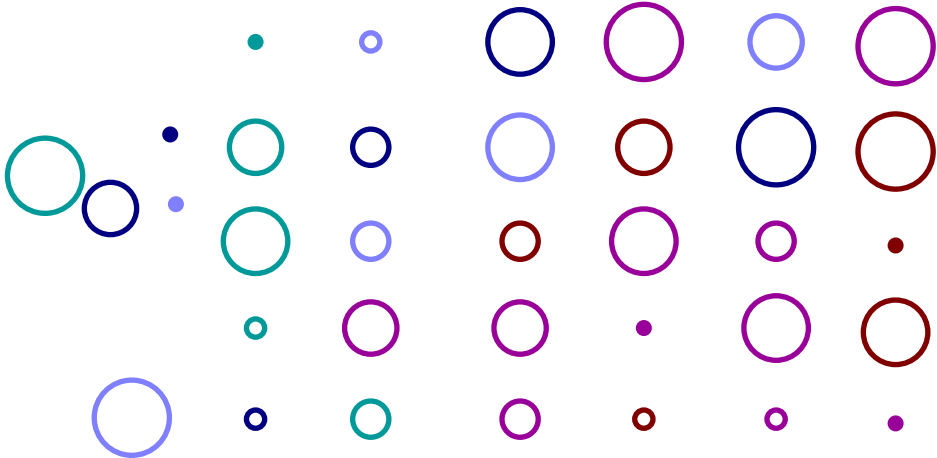
Médian linéaire

des paquets de 5



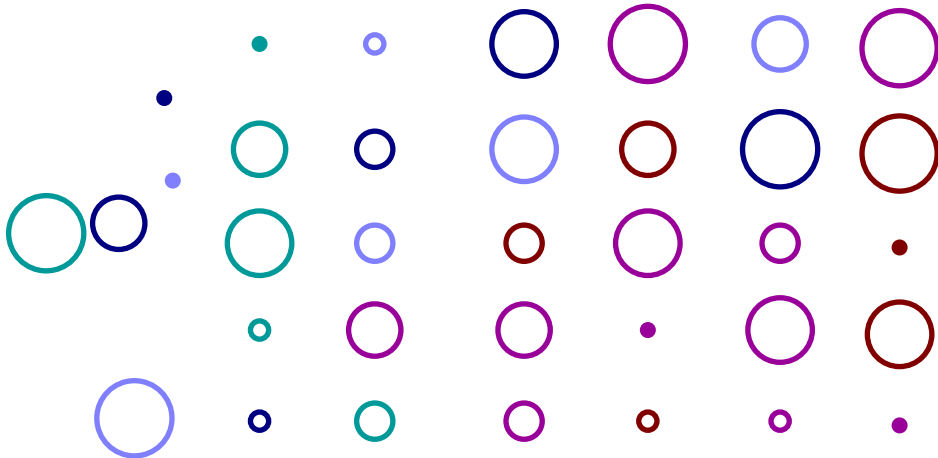
Médian linéaire

des paquets de 5

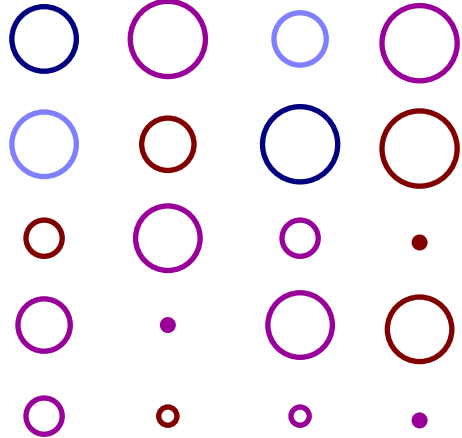
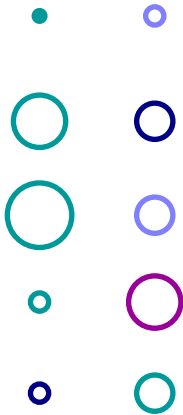
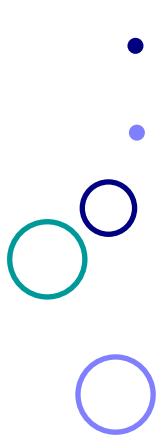


Médian linéaire

des paquets de 5

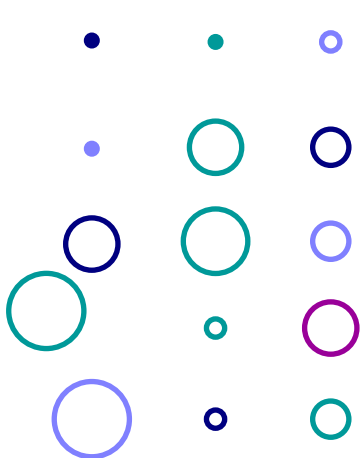


Médian linéaire

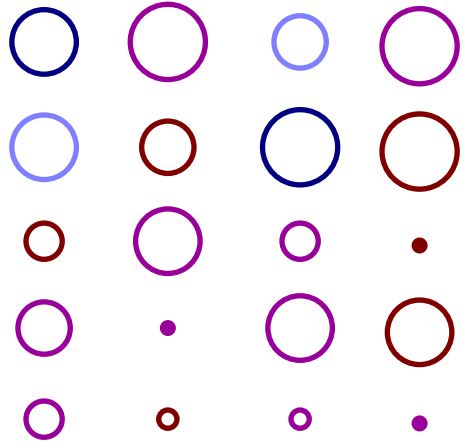


des paquets de 5

Médian linéaire

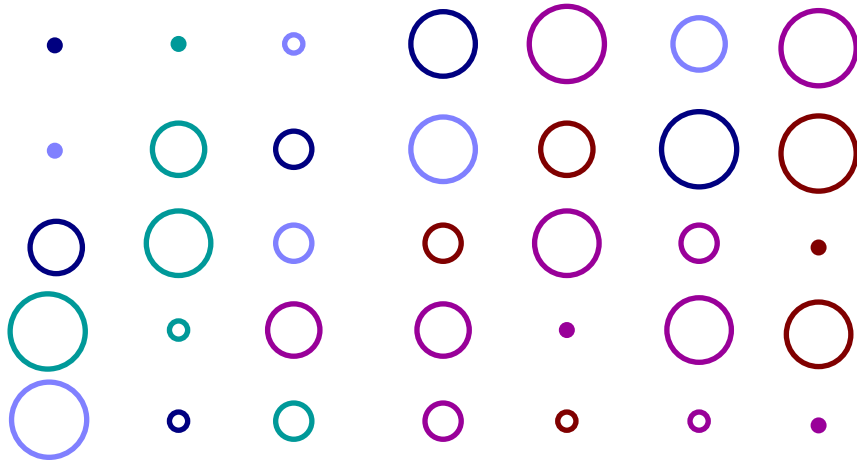


des paquets de 5



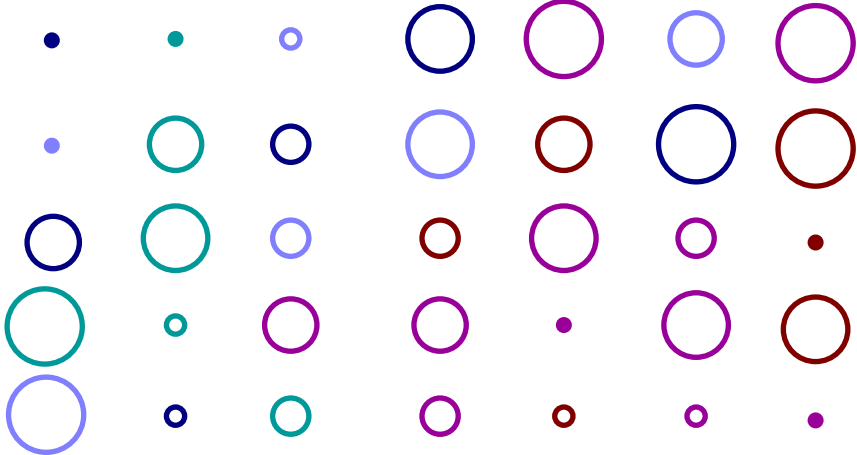
Médian linéaire

des paquets de 5



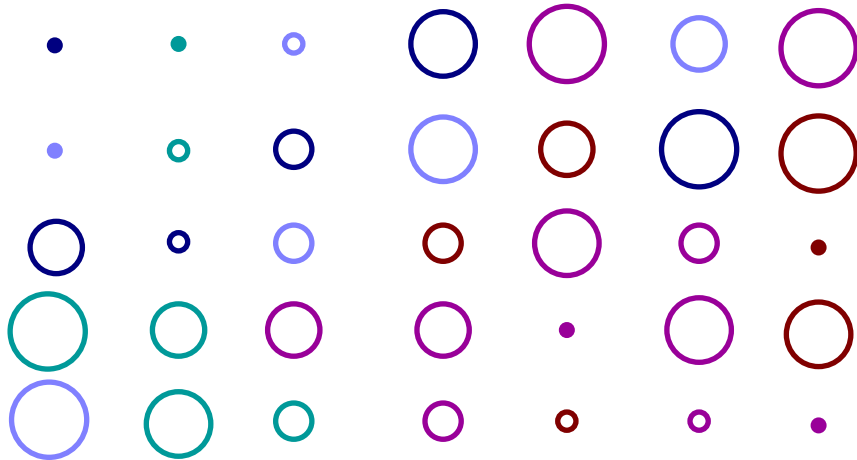
Médian linéaire

médian de 5



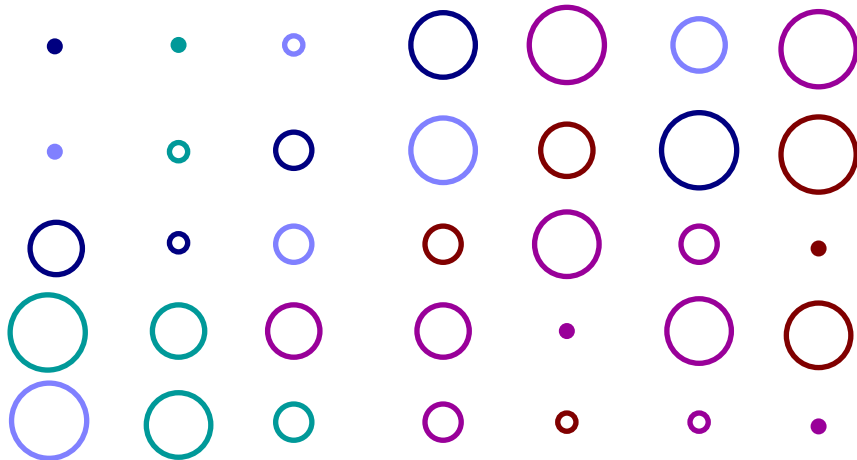
Médian linéaire

médian de 5



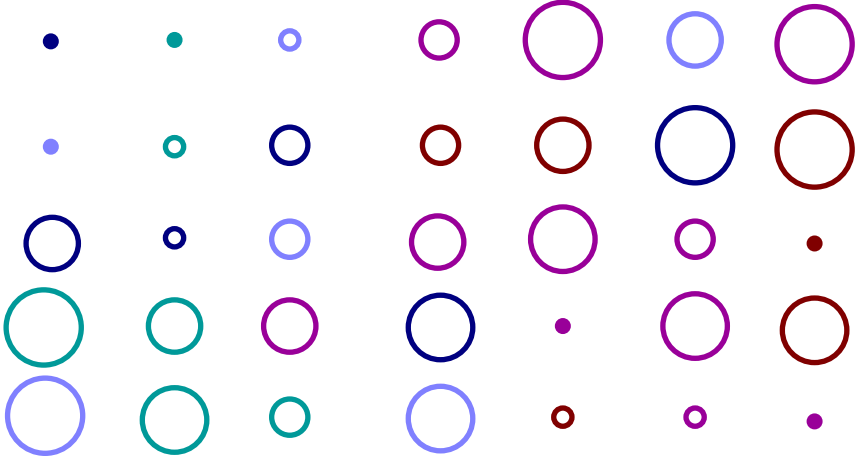
Médian linéaire

médian de 5



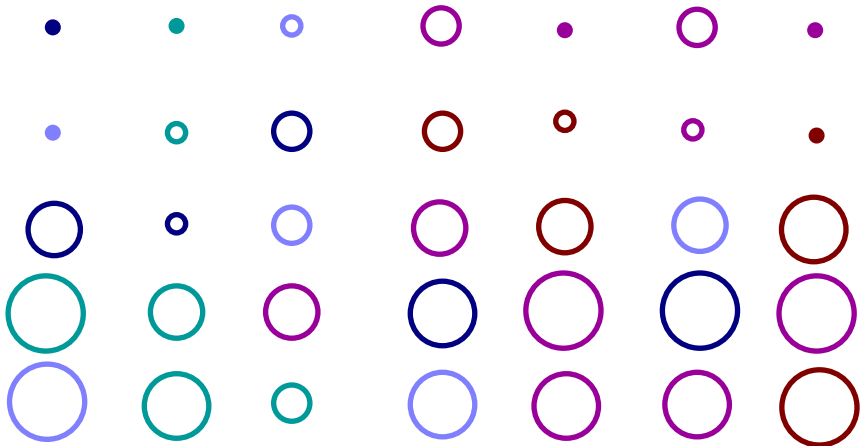
Médian linéaire

médian de 5



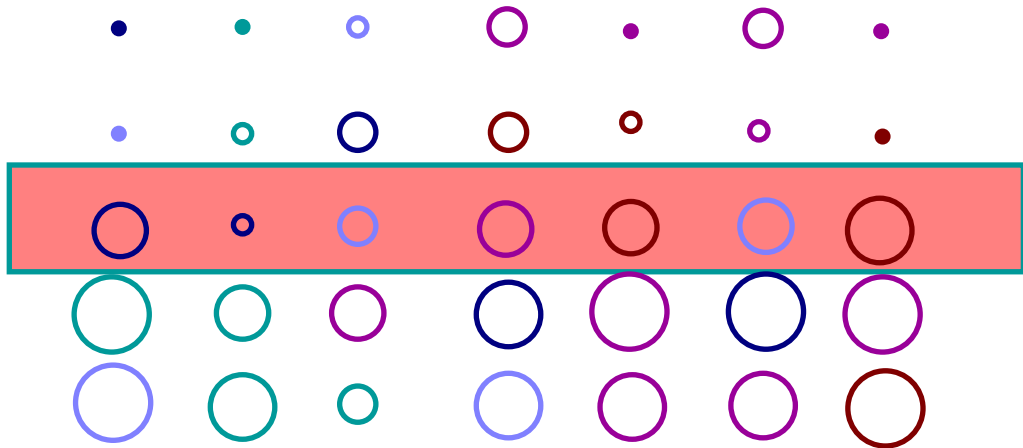
Médian linéaire

médian de 5



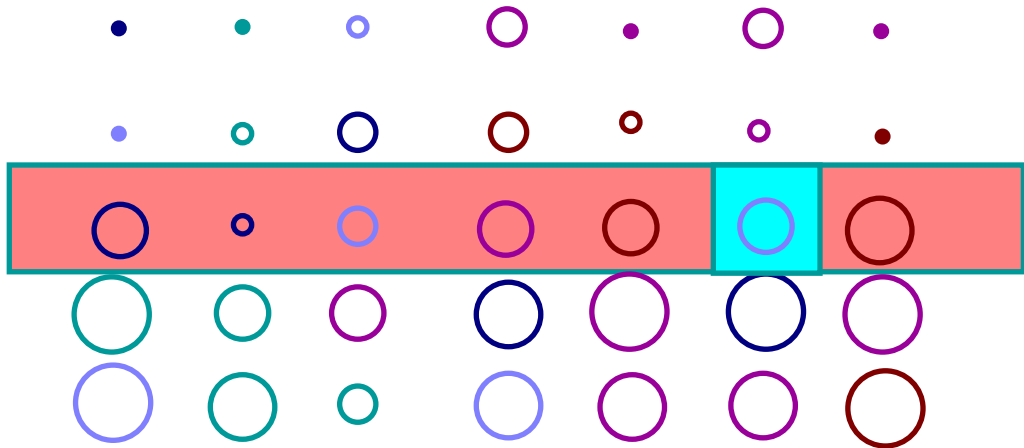
Médian linéaire

médian de $\frac{n}{5}$



Médian linéaire

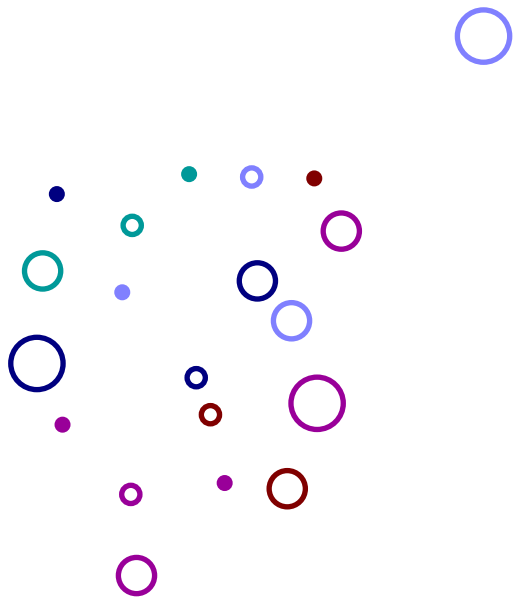
médian de $\frac{n}{5}$



Médian linéaire

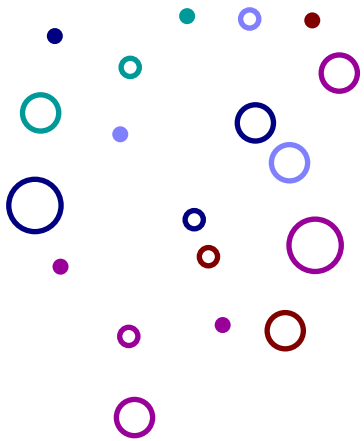


Médian linéaire

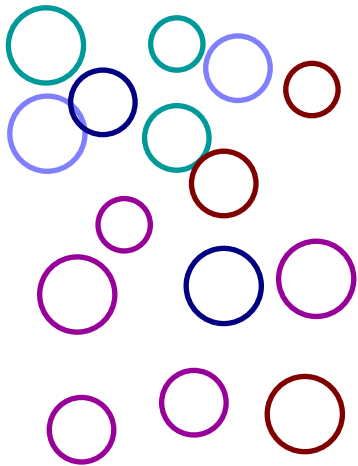


plus petits

Médian linéaire

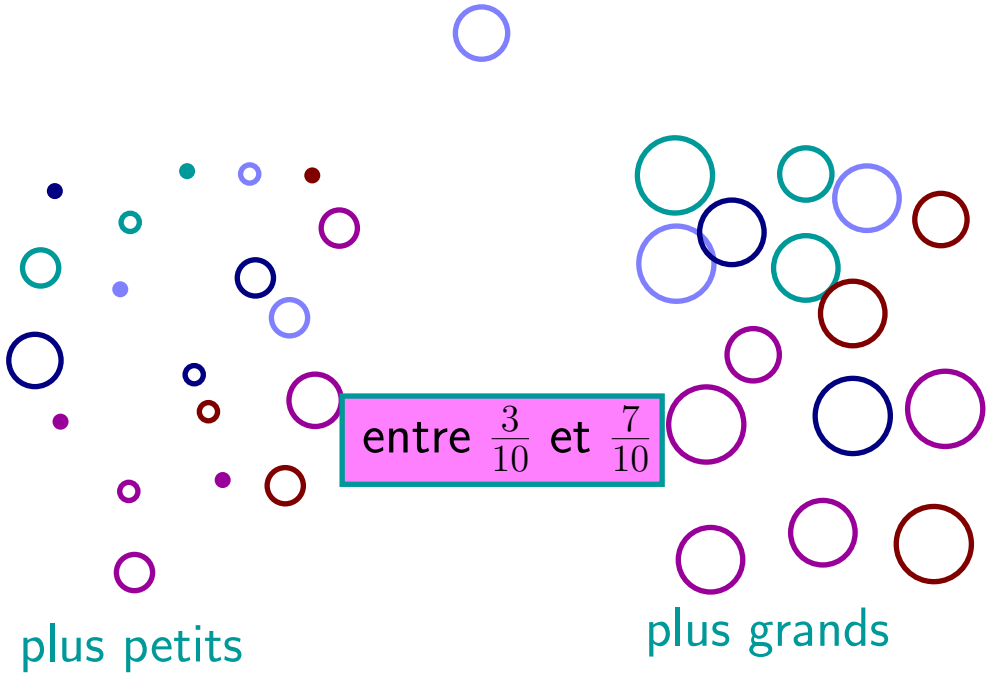


plus petits



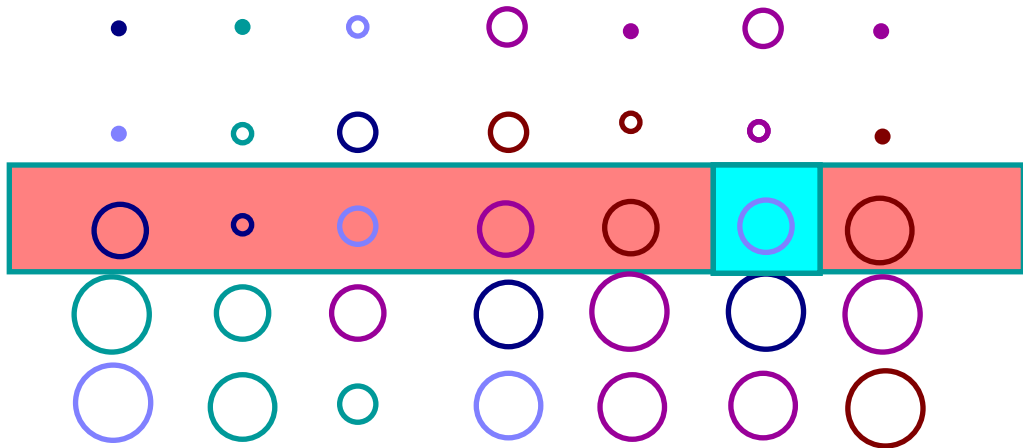
plus grands

Médian linéaire

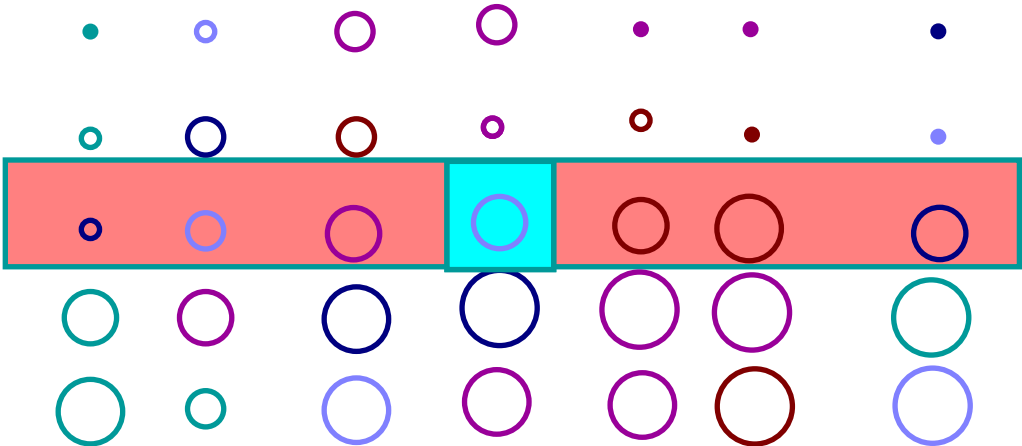


Médian linéaire

médian de $\frac{n}{5}$

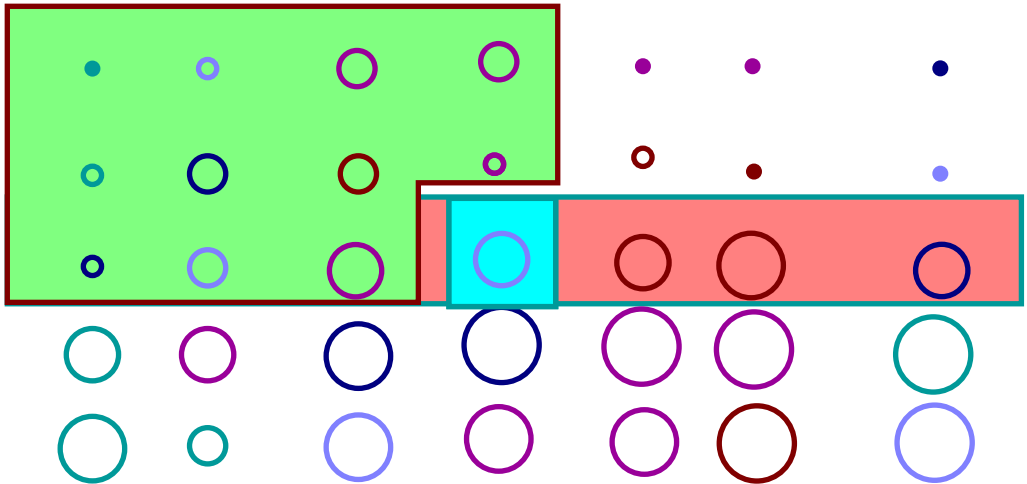


Médian linéaire



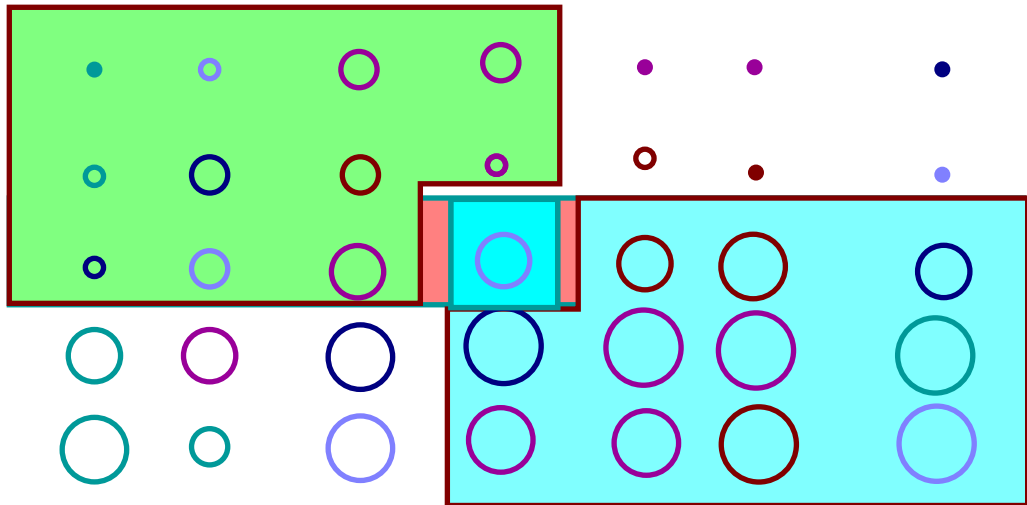
Médian linéaire

plus petits



Médian linéaire

plus petits



plus grands

$$f(n) = O(n) + f\left(\frac{n}{5}\right) + f\left(\frac{7n}{10}\right)$$

$$f(n) = n + f\left(\frac{n}{5}\right) + f\left(\frac{7n}{10}\right)$$

$$n + \frac{n}{5} + \frac{7n}{10} + f\left(\frac{n}{25}\right) + f\left(\frac{7n}{50}\right) + f\left(\frac{7n}{50}\right) + f\left(\frac{49n}{100}\right)$$

$$n + \frac{9}{10}n + \left(\frac{9}{10}\right)^2 n + f(\dots) + f(\dots) + \dots$$

$$f(n) \leq 10n\alpha$$

$$f(n) = O(n)$$

$$f(n) = O(n) + f\left(\frac{n}{5}\right) + f\left(\frac{7n}{10}\right)$$

$$f(n) = n + f\left(\frac{n}{5}\right) + f\left(\frac{7n}{10}\right)$$

$$n + \frac{n}{5} + \frac{7n}{10} + f\left(\frac{n}{25}\right) + f\left(\frac{7n}{50}\right) + f\left(\frac{7n}{50}\right) + f\left(\frac{49n}{100}\right)$$

$$n + \frac{9}{10}n + \left(\frac{9}{10}\right)^2 n + f(\dots) + f(\dots) + \dots$$

$$f(n) \leq 10n\alpha$$

$$f(n) = O(n)$$

α médian de 5
séparation

$$f(n) = O(n) + f\left(\frac{n}{5}\right) + f\left(\frac{7n}{10}\right)$$

$$f(n) = n + f\left(\frac{n}{5}\right) + f\left(\frac{7n}{10}\right)$$

$$n + \frac{n}{5} + \frac{7n}{10} + f\left(\frac{n}{25}\right) + f\left(\frac{7n}{50}\right) + f\left(\frac{7n}{50}\right) + f\left(\frac{49n}{100}\right)$$

$$n + \frac{9}{10}n + \left(\frac{9}{10}\right)^2 n + f(\dots) + f(\dots) + \dots$$

$$f(n) \leq 10n\alpha$$

$$f(n) = O(n)$$

α médian de 5
séparation

$$\log_2(5!) = 7$$



C'est tout pour aujourd'hui