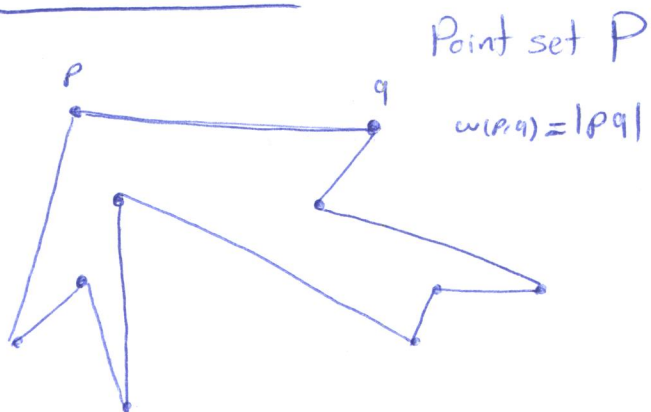
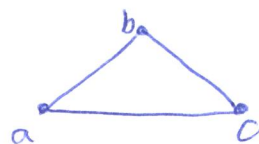


Euclidean TSP

①



Property 1 (Triangular Inequality):



$$|ac| \leq |ab| + |bc|$$

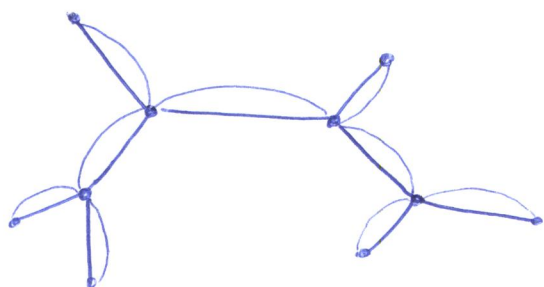
Property 2 (Extension of Property 1):



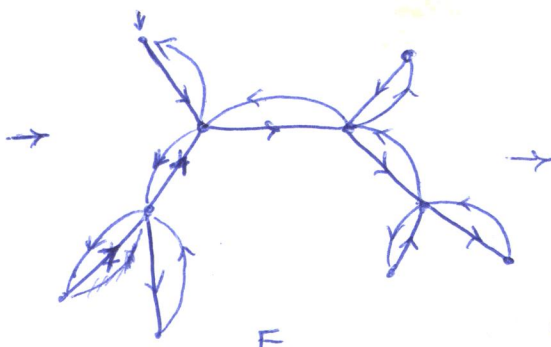
$$|ab| \leq |e_1| + |e_2| + \dots + |e_m|$$

First Alg.

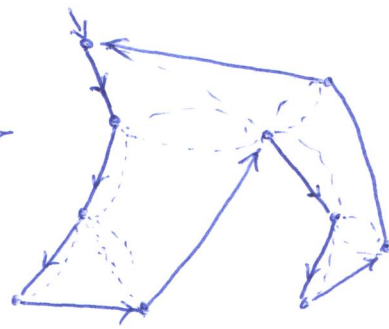
- Find $MST(P)$
- Duplicate edges of $MST(P)$
- Find an Eulerian tour E
- Convert E to a tour T by walking through vertices of E while skipping the vertices that already visited.



$MST(P)$



E



T

Eulerian tour: a closed walk which visits each vertex of the graph exactly once.

Theorem: a ^{connected} graph has an Eulerian tour iff all vertices are of even degree.

Theorem: The above alg. is a 2-approximation alg. for ETSP. (2)

Proof:

let OPT be an optimal tour.

by removing any edge from OPT we obtain a spanning path T' which is a spanning tree as well. Thus

$$\begin{matrix} T' < OPT \\ MST \leq T' \end{matrix} \quad \Rightarrow \quad MST \leq OPT \quad (1) \quad \text{abuse the notation for weight}$$

The weight of E is two times the weight of MST because E contains two copies of each edge in MST .

$$E = 2 MST$$

Since we obtain T by shortcutting the edges of E , the cost of T does not exceed the cost of E (remember the triangle inequality)

$$\Rightarrow T \leq E = 2MST \quad (2)$$

$$\text{Finally } \xrightarrow{(1)(2)} T \leq E = 2MST \leq 2.OPT$$

$$\Rightarrow T \leq 2.OPT$$

Second Alg.

(3)

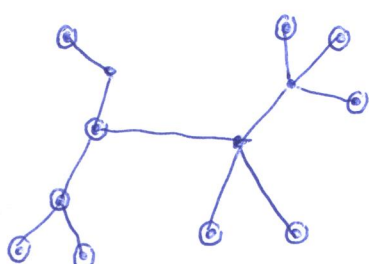
- Find $MST(P)$
- Let V' be the vertices of odd degree in $MST(P)$
- Compute a minimum perfect matching M for V'
- Add edges of M to $MST(P)$
- Find an Eulerian tour E in $MUMST(P)$
- Convert E to a tour T

perfect matching:

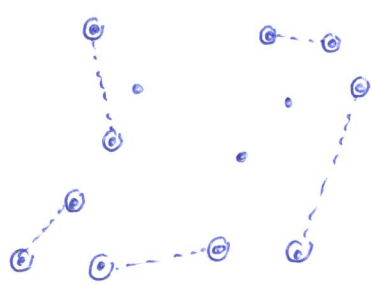
a matching which covers all the vertices

Observation: the number of vertices of odd degree is even.

$\Rightarrow V'$ has a perfect matching



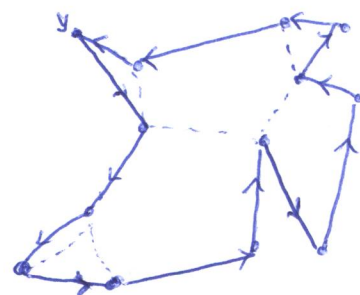
MST and V'



M



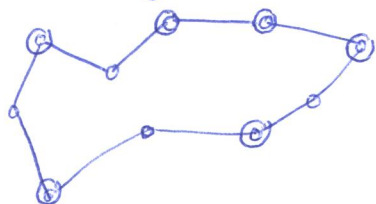
$MUMST$ is Eulerian



T

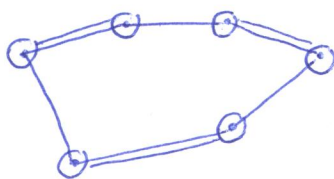
Theorem: The above alg. is a $\frac{3}{2}$ -approximation for the ETSP.

Let OPT be an optimal tour and let T' be the tour obtained from OPT by shortcutting the vertices of $V \setminus V'$.



OPT

$\Rightarrow$



$T' = M_1 + M_2$

$$T' \leq OPT$$

T' contains two perfect matchings for V' say M_1 and M_2

M is a minimum perfect matching and smaller than both M_1 and M_2

$$M \leq M_1 \text{ and } M \leq M_2 \Rightarrow 2M \leq M_1 + M_2 = T'$$

$$\Rightarrow M \leq \frac{T'}{2} \leq \frac{OPT}{2}$$

$$T \leq E = M + MST$$

$$E = M + MST \leq \frac{OPT}{2} + OPT = \frac{3}{2} OPT \quad (3)$$

(1) (3)

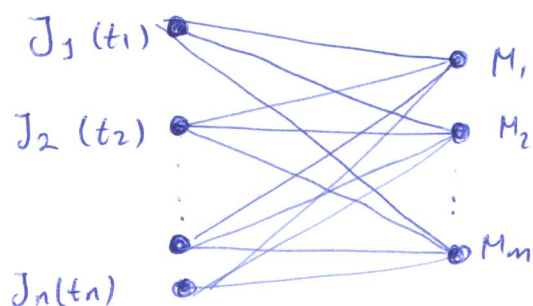
$$\Rightarrow T \leq \frac{3}{2} OPT$$

Load Balancing:

Given n jobs $J_1, \dots, J_n$ and m machines $M_1, \dots, M_m$.

Each job J_i needs time t_i to be done.

Assign jobs to machines such that ~~the total~~ the time until all jobs are finished is minimized.



First Alg. (Greedy)

for $i \leftarrow 1$ to n

 | assign J_i to M_k of minimum load

Theorem: The above alg. is a 2-approximation alg. for load balancing prob.

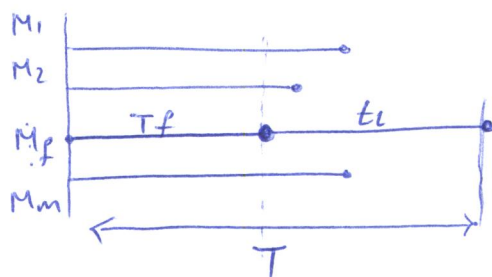
Let T be the time required by alg. and opt be the optimal time.

$$opt \geq t_{max} \text{ where } t_{max} = \max(t_i)$$

$$opt \geq \frac{1}{m} \sum_{i=1}^n t_i$$

At the end of alg., let M_f be the machine which maximizes the load.

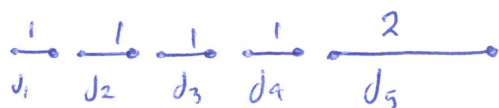
Let J_f be the last job assigned to M_f .



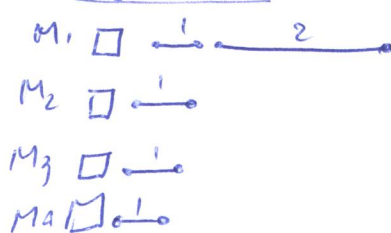
$$T = T_f + t_f \leq \frac{1}{m} \sum_{i=1}^n t_i + t_{max} \leq opt + opt$$

$$\Rightarrow T \leq 2 \cdot opt$$

How to improve:

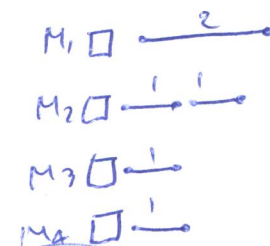


assignment 1



$$T = 3$$

assignment 2



$$T = 2$$

Observation: Its better to assign larger jobs first.

Second Alg 1.

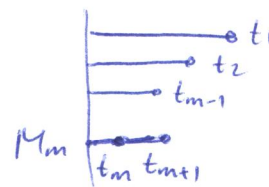
$L \leftarrow$ decreasing ordered list of jobs
 for $i \leftarrow 1$ to n
 assign $J(i)$ to M_k of minimum load

Theorem: The above alg. is a $\frac{3}{2}$ -approximation alg. for load balancing problem.

assume $t_1 \geq t_2 \geq \dots \geq t_n$

if $n \leq m$ then the alg. is optimal

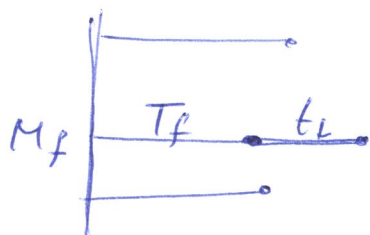
if $n > m$ then $opt \geq t_m + t_{m+1}$



Let M_f be the machine with maximum load and assume J_e is the last job assigned to M_f .



$$\begin{aligned} t_e &\leq t_m \\ t_e &\leq t_{m+1} \end{aligned} \Rightarrow 2t_e \leq t_m + t_{m+1} \Rightarrow t_e \leq \frac{t_m + t_{m+1}}{2}$$



$$T = T_f + t_e \leq \frac{1}{m} \sum_{i=1}^m t_i + \frac{t_m + t_{m+1}}{2} \leq opt + \frac{opt}{2}$$

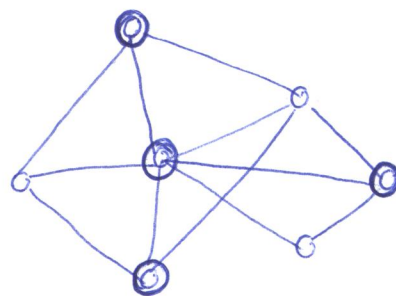
$$\Rightarrow T \leq \frac{3}{2} \cdot opt$$

Vertex-Cover Problem

⑦⑧

$G=(V,E)$, a vertex-cover is a subset $C \subseteq V$ s.t. for each edge $(a,b) \in E$, either $a \in C$ or $b \in C$ (or both)

C covers all the edges of G !!!



Vertex-Cover Problem: compute a cover C^* of minimum size.

First Alg.

```
C ← ∅
while E ≠ ∅ do
    (a,b) ← arbitrary edge in E
    C ← C ∪ {a,b}
    E ← E \ {all edges incident on a or b}
return C
```

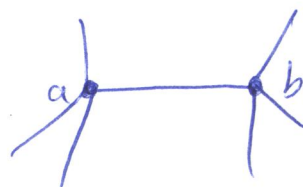
Running Time = $O(V+E)$

Theorem: The above alg. is a 2-approx alg. for vertex-cover problem.

Let M be the set of edges selected in the while loop.

Let C^* be an optimal vertex cover.

for each edge $(a,b) \in M$, C^* contains either a or b . $\Rightarrow |C^*| \geq |M|$



We add both of a and b to $C \Rightarrow |C| \leq 2|M|$

$\Rightarrow |C| \leq 2|M| \leq 2|C^*|$

$\rightarrow$ Any maximal matching in G is a 2-approx for vertex-cover problem.

Second Alg.

$C \leftarrow \emptyset$

while $E \neq \emptyset$ do

$a \leftarrow$ vertex with maximum degree in current graph

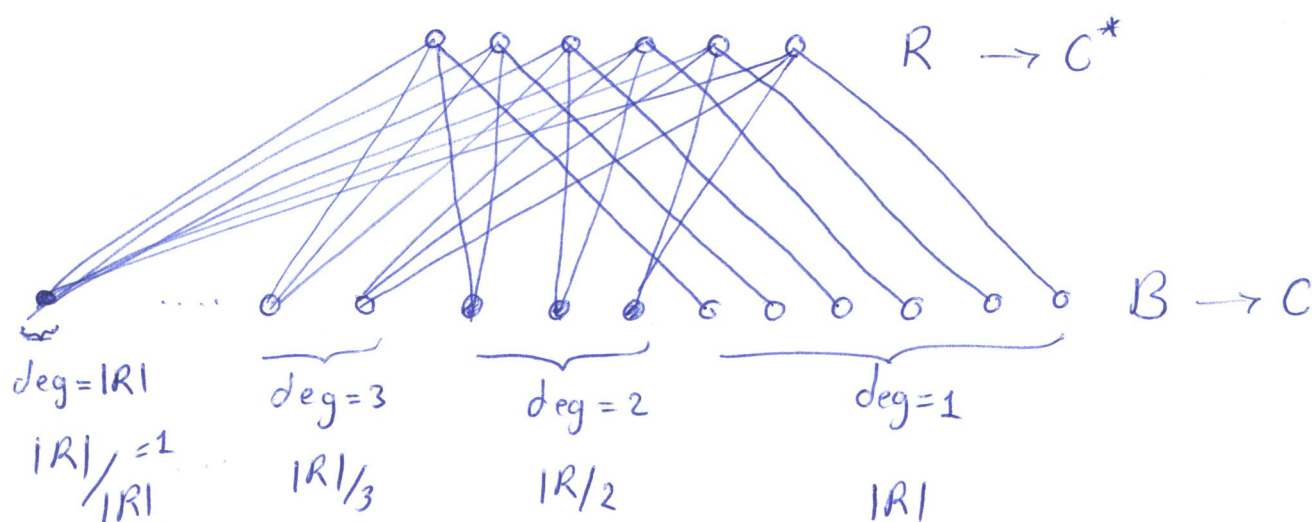
$C \leftarrow C \cup \{a\}$

$E \leftarrow E \setminus \{\text{all edges incident on } a\}$

return C .

What is the approximation ratio α ?

$$\alpha = \Omega(\log n)$$



$$|B| = \frac{|R|}{1} + \frac{|R|}{2} + \frac{|R|}{3} + \dots + \frac{|R|}{|R|} = |R| \sum_{i=1}^{|R|} \frac{1}{i} = |R| \log |R|$$

$$\begin{matrix} C = B \\ C^* = R \end{matrix} \Rightarrow \frac{|C|}{|R|} = \log |R| = \Theta(\log n)$$

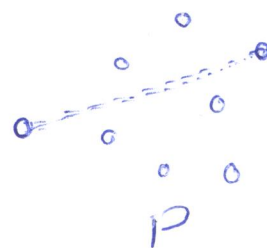
$$\Rightarrow \alpha \geq \log n$$

k-clustering:

(9)

For a point set P , diameter of P , $d(P)$, is defined as the maximum distance between any pair of points in P .

$$d(P) = \max\{|pq| : p, q \in P\}$$

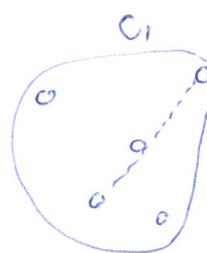
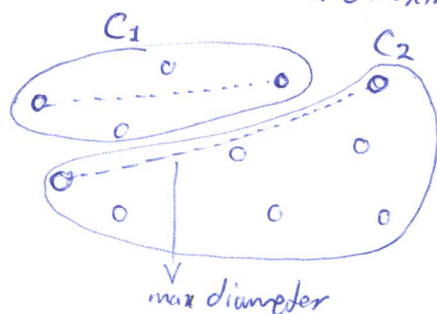


Given a point set P , we want to partition P into k clusters s.t. the diameter of clusters is minimized.

$\Rightarrow$ we want to minimize the maximum diameter.

example:

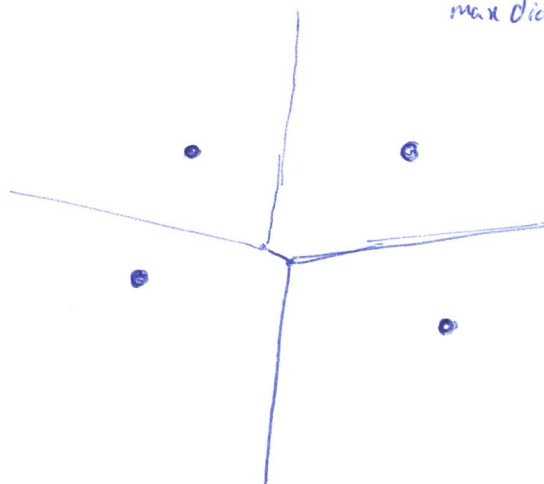
$k=3$



max diameter

Voronoi Diagram - VD

given a point set S , $VD(S)$ is defined as depicted in the picture.

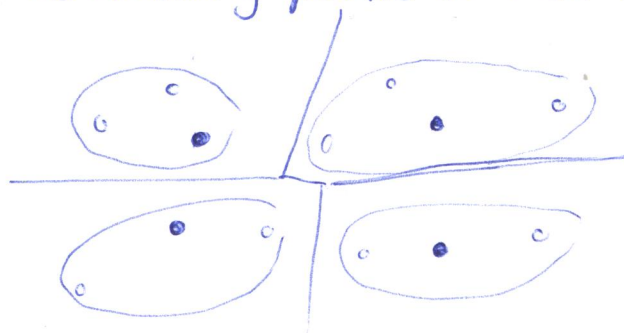


Algorithm

Idea: - pick k points of P as S

- compute $VD(S)$

- assign the remaining points to each voronoi cell



Algorithm

(10) ④

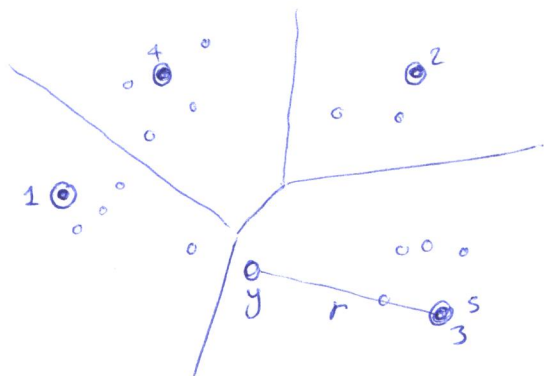
$S \leftarrow \{\text{arbitrary point of } P\}$

for $i \leftarrow 2$ to k

$x \leftarrow \text{point of } P \text{ which is farthest from } S$

$S \leftarrow S \cup \{x\}$

Assign the points in $P \setminus S$ to their closest point in S .



Theorem: The above alg. is a 2-approx alg. for the k -clustering problem.

Let y be the next element that we have chosen by repeating the for loop ($(k+1)^{\text{th}}$ element) and let r be the distance of y to its closest point s in S .

All points in cluster s are at distance at most r of s , then the diameter of s is at most $2r$.

We have $k+1$ points ~~from~~ all of them are at distance at least r from each other (in each iteration the farthest point distance is decreasing) and by pigeon hole principle two of them fall in the same cluster in OPT. So OPT has diameter at least r .