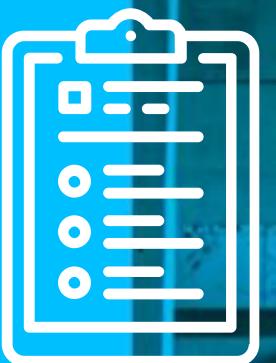


# OVA 3.0: Graphs

**CS3102 EDA**



# Índice

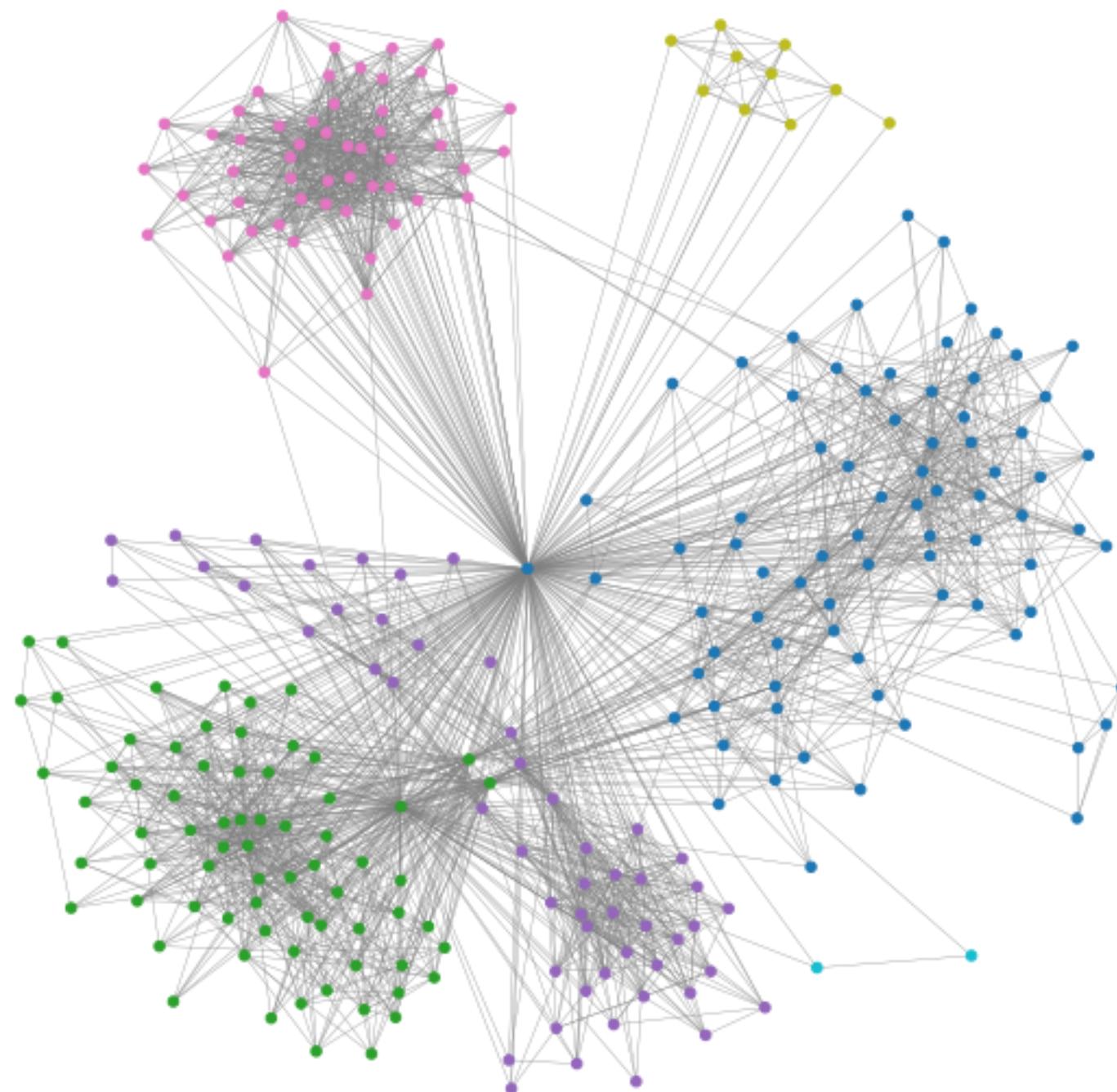
1. SparseMap
2. t-SNE
3. UMAP
4. Autoencoder

# 1. Graph

$$G = (V, E)$$

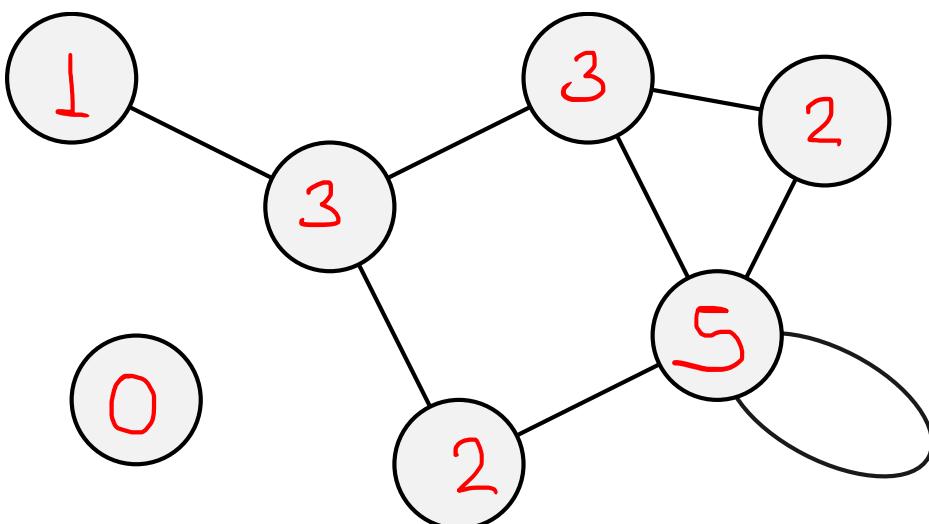
↓      ↓  
Vertices    Aristas

# Graph

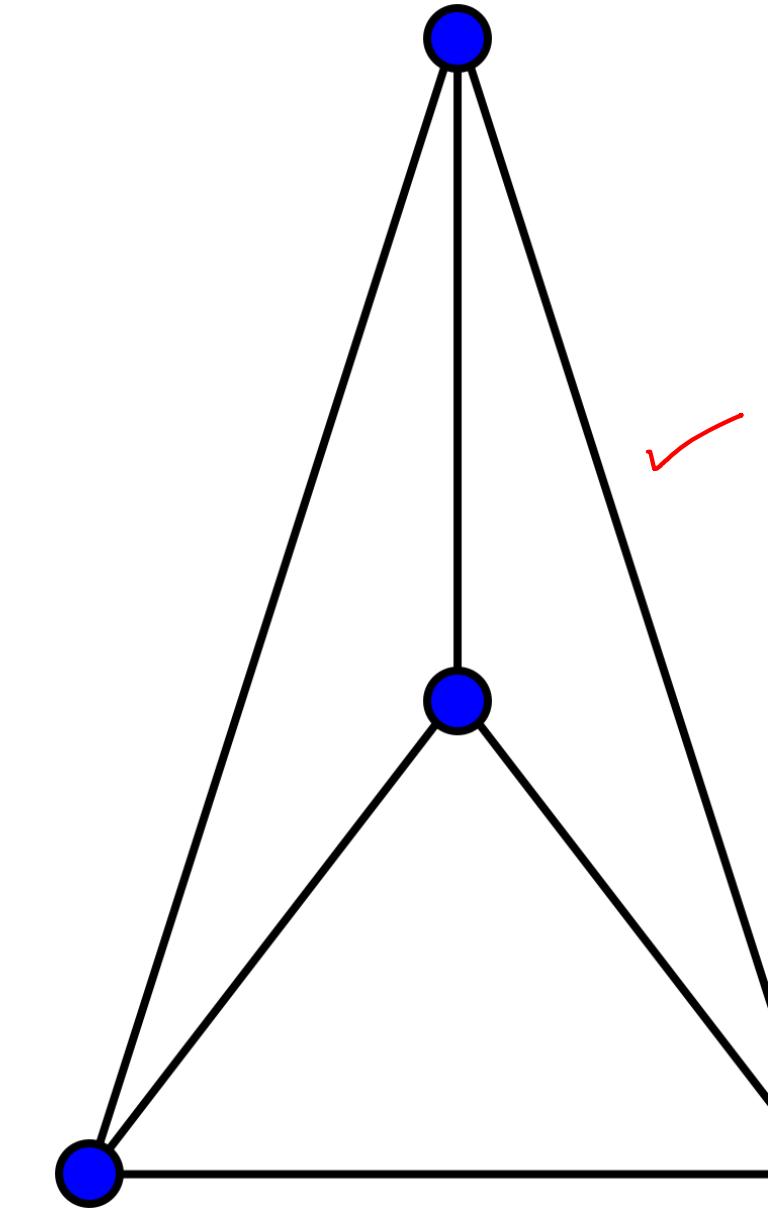
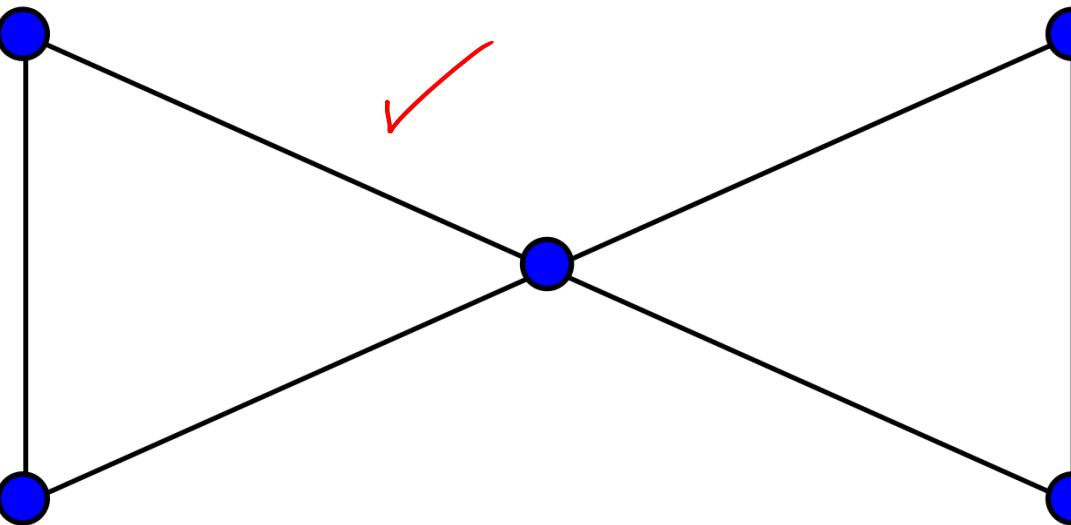
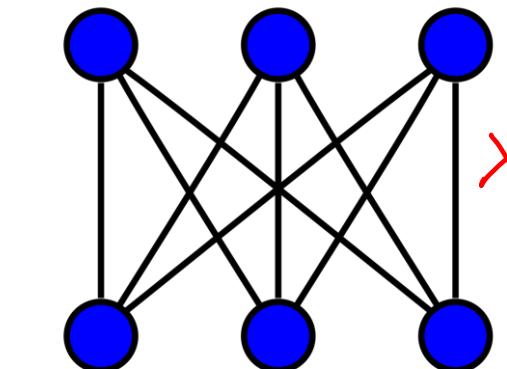
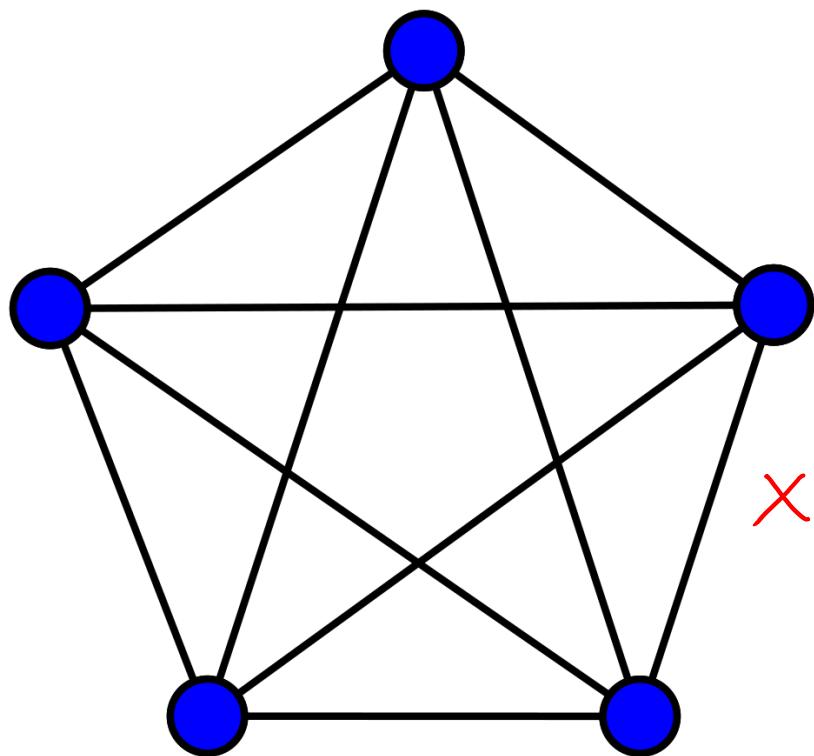


# Graph

## Grado del grafo



# Planar graph



# Adjacency Matrix

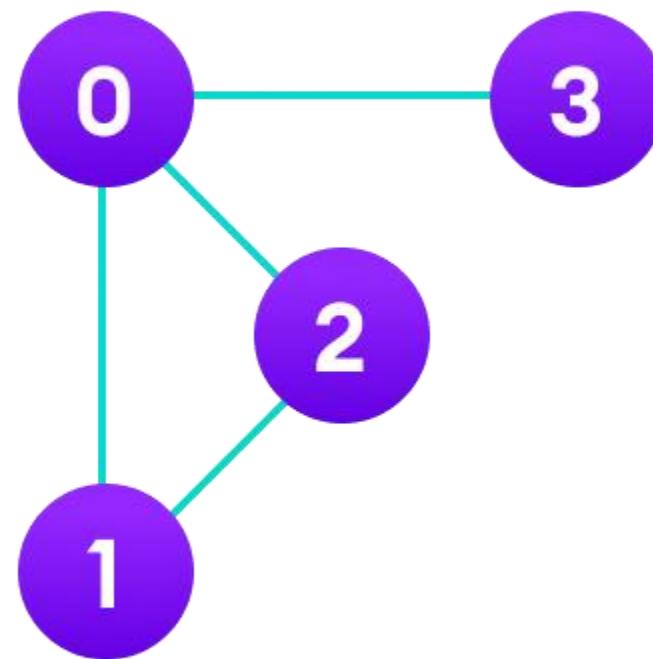


Diagram illustrating the construction of an adjacency matrix from a graph. The graph has 4 nodes (0, 1, 2, 3). The adjacency matrix is a 4x4 grid where rows and columns are indexed by node labels.

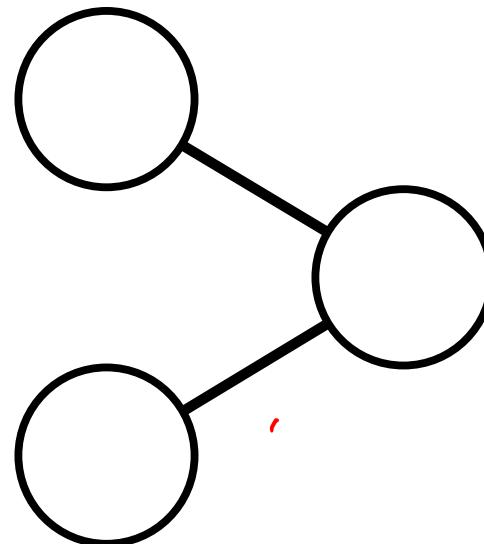
Row index:  $i$  (horizontal arrow)

Column index:  $j$  (vertical arrow)

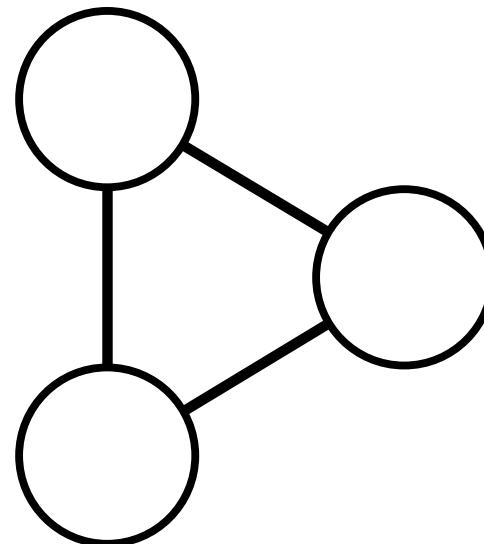
	0	1	2	3
0	0	1	1	1
1	1	0	1	0
2	1	1	0	0
3	1	0	0	0

# Triplet node

Un **triplet** es un conjunto de tres nodos conectados por dos (**open triplet**) o tres (**closed triplet**) aristas.



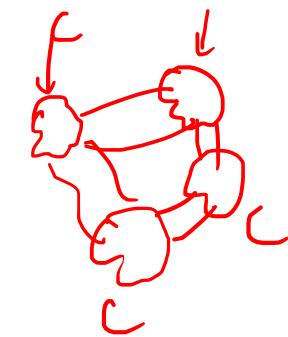
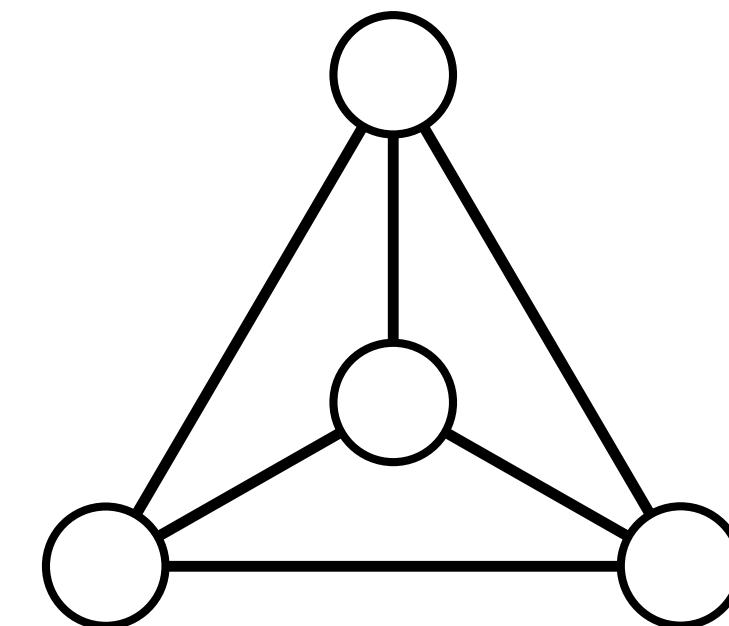
Open triplet



Closed triplet

# clique

Un **clique** es un conjunto (o subconjunto) de nodos completamente conectados.



# Coeficiente de agrupamiento local

Cuantifica que tan cerca están los vecinos de un nodo  $i$  de ser un **clique**.

$$C_i = \frac{\text{Número pares de vecinos de } i \text{ que están conectados}}{\text{Número total de pares de vecinos de } i}$$



$$C_i = \frac{1}{k_i(k_i - 1)} \sum_{j,k} A_{ij} A_{jk} A_{ki}$$

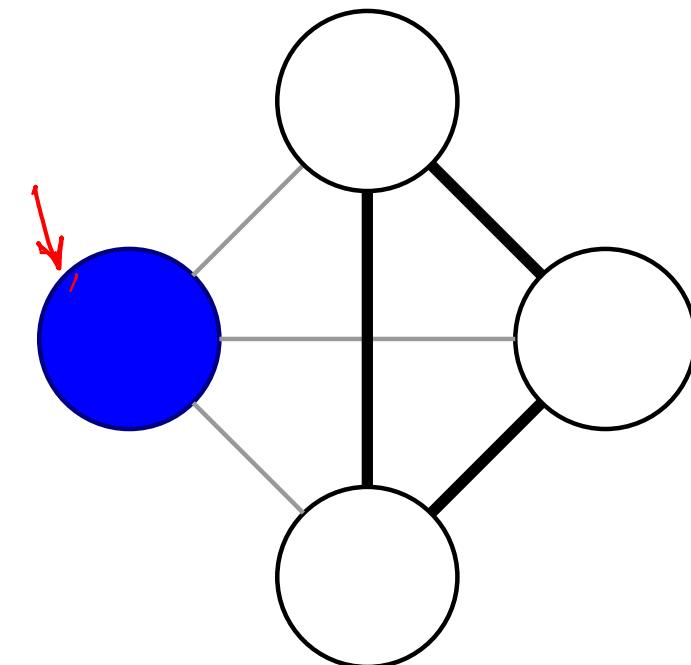
$$k_i = \sum_j A_{ij}$$

Si  $k = 0$  o  $1$ ,  $C_i = 0$

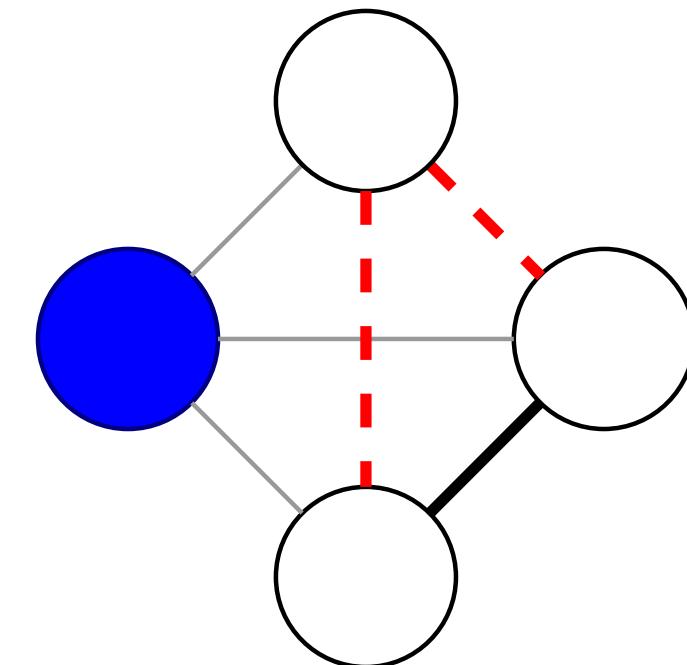
# Coeficiente de agrupamiento local

Número de posibles pares de nodos:

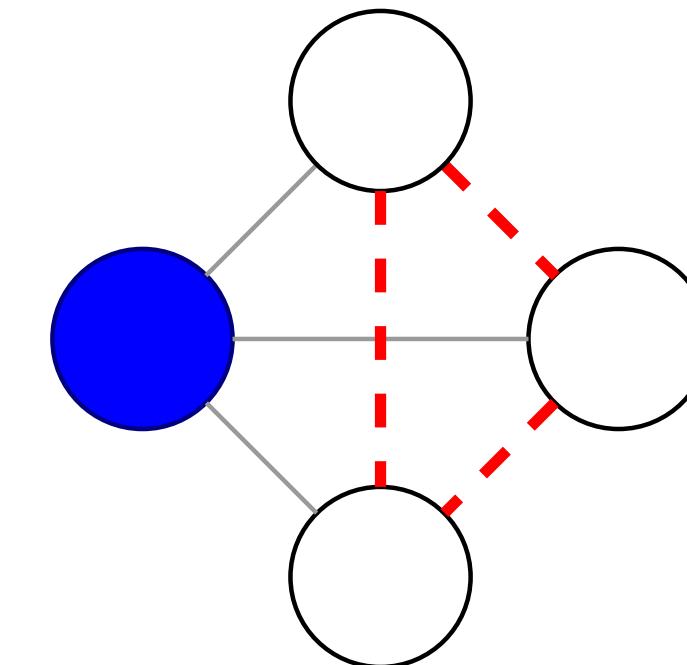
$$\boxed{\binom{3}{2}} = \frac{3(3 - 1)}{2} = 3$$



$$C_i = 1 = \frac{3}{3}$$



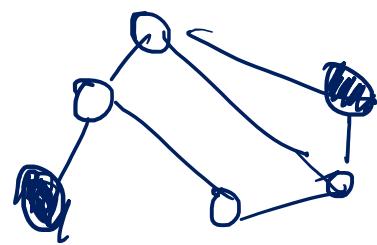
$$C_i = \frac{1}{3}$$



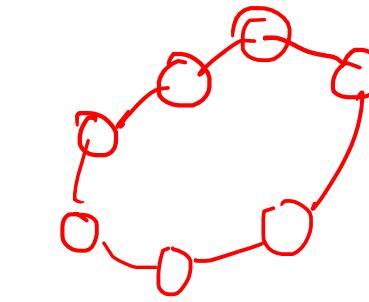
$$\underline{C_i = 0}$$

# Coeficiente de agrupamiento global

Percolación



$$C = \frac{\text{Número de } closed \text{ } triplets}{\text{Número total de } triplets}$$



$$C = \frac{\sum_{i,j,k} A_{ij}A_{jk}A_{ki}}{\sum_i k_i(k_i - 1)}$$

$$k_i = \sum_j A_{ij}$$

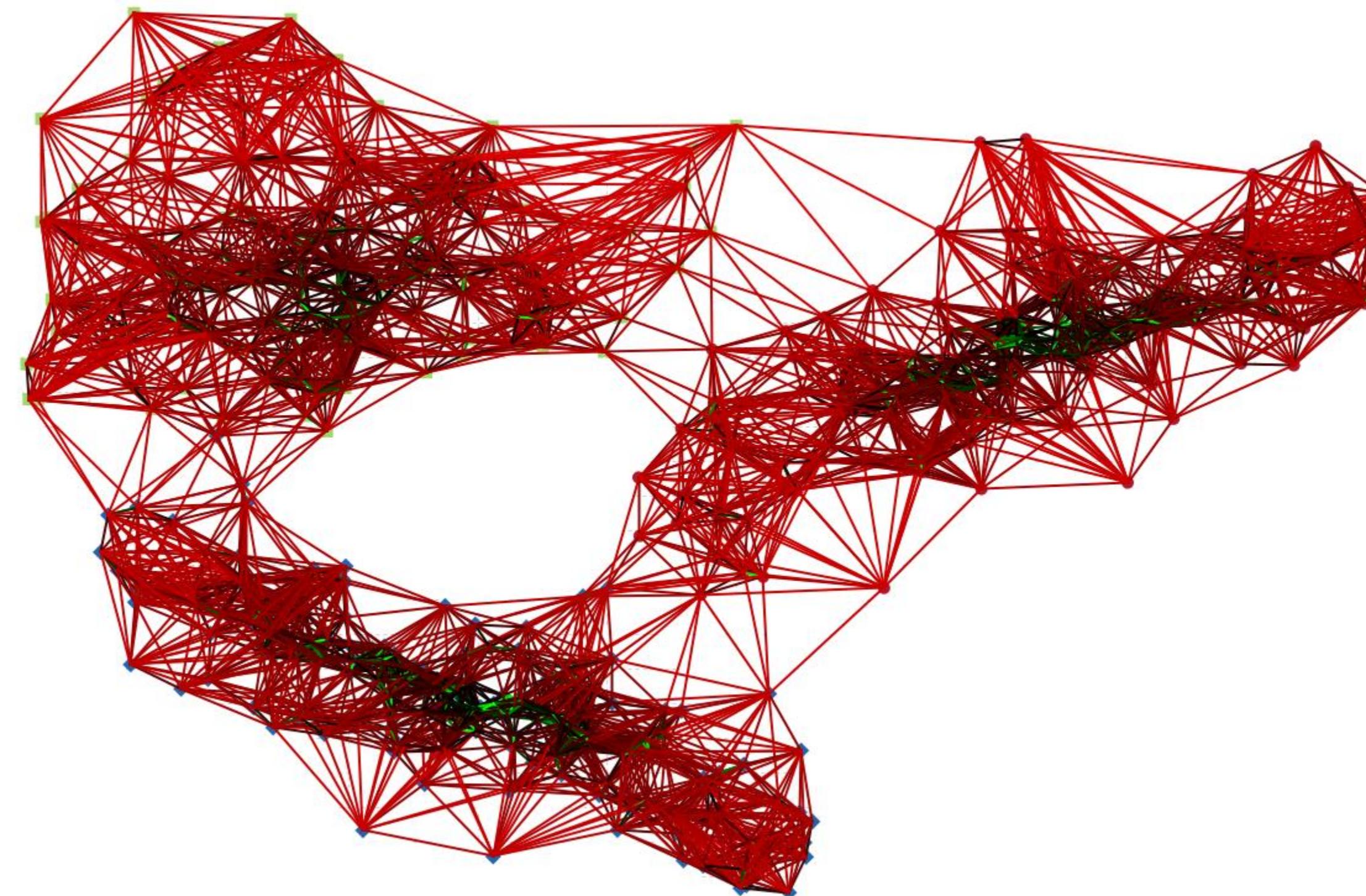
Si  $\sum_i k_i(k_i - 1) = 0, C_i = 0$

---

# 2. Nearest Neighbor Graph

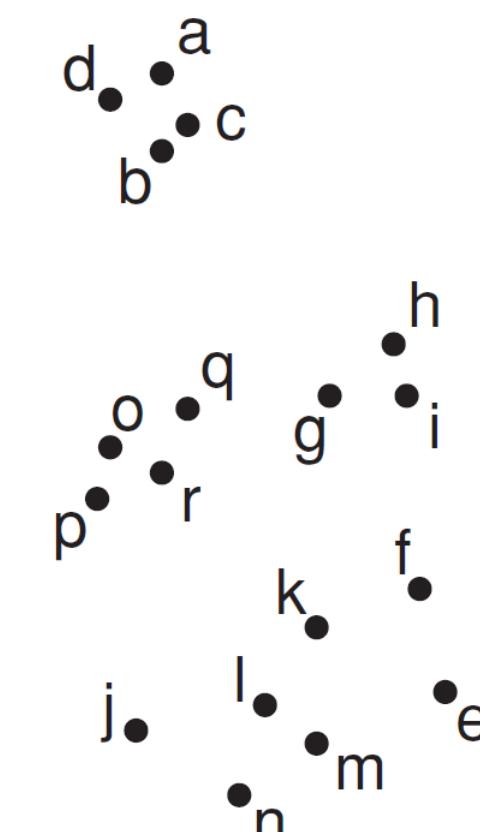
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# **Nearest Neighbor Graph**

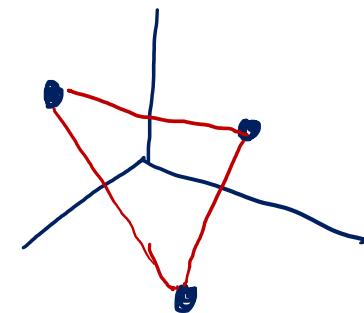


# Nearest Neighbor Graph

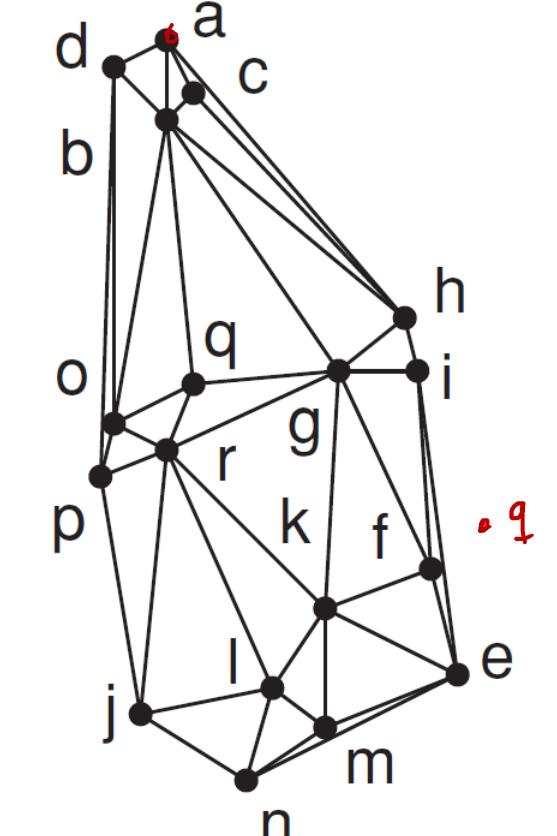
Object	a	b	c	d	e	f	g	h	i	j	k	l	m	n	o	p	q	r
a	0	75	56	56	660	559	352	346	393	638	558	621	667	704	366	417	326	387
b	75	0	35	71	593	493	288	293	336	563	486	547	594	629	292	343	251	313
c	56	35	0	79	604	503	296	292	338	590	503	567	613	652	321	373	275	338
d	56	71	79	0	660	562	358	363	407	613	550	606	656	686	337	388	309	366
e	660	593	604	660	0	103	309	341	290	302	140	175	135	224	403	386	372	348
f	559	493	503	562	103	0	207	239	188	307	107	188	180	266	330	325	285	274
g	352	288	296	358	309	207	0	80	75	375	225	306	338	397	218	246	138	179
h	346	293	292	363	341	239	80	0	52	451	285	372	395	462	293	324	210	257
i	393	336	338	407	290	188	75	52	0	418	241	330	349	420	292	316	213	249
j	638	563	590	613	302	307	375	451	418	0	202	127	175	118	276	228	316	251
k	558	486	503	550	140	107	225	285	241	202	0	90	112	179	266	247	247	212
l	621	547	567	606	175	188	306	372	330	127	90	0	63	91	292	258	297	246
m	667	594	613	656	135	180	338	395	349	175	112	63	0	90	350	319	348	302
n	704	629	652	686	224	266	397	462	420	118	179	91	90	0	360	319	378	321
o	366	292	321	337	403	330	218	293	292	276	266	292	350	360	0	52	84	56
p	417	343	373	388	386	325	246	324	316	228	247	258	319	319	52	0	124	67
q	326	251	275	309	372	285	138	210	213	316	247	297	348	378	84	124	0	67
r	387	313	338	366	348	274	179	257	249	251	212	246	302	321	56	67	67	0



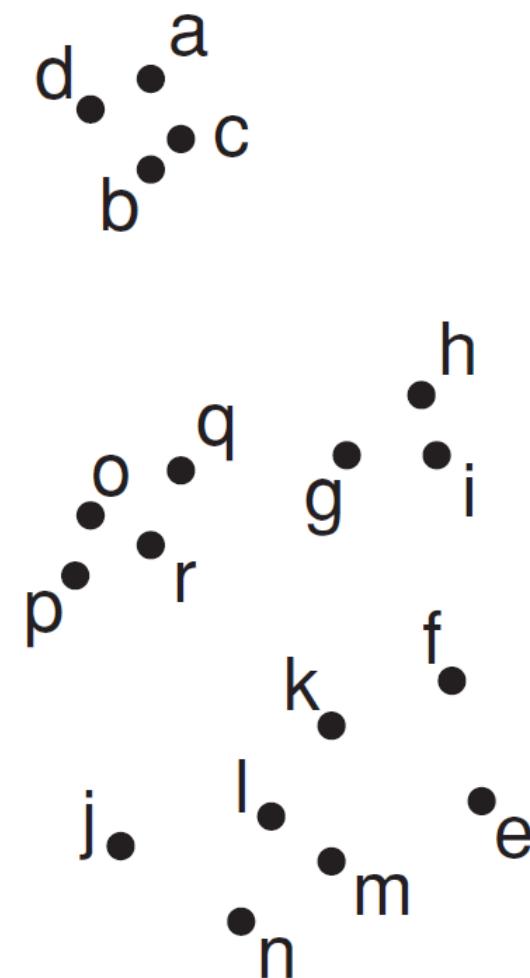
# Nearest Neighbor Graph



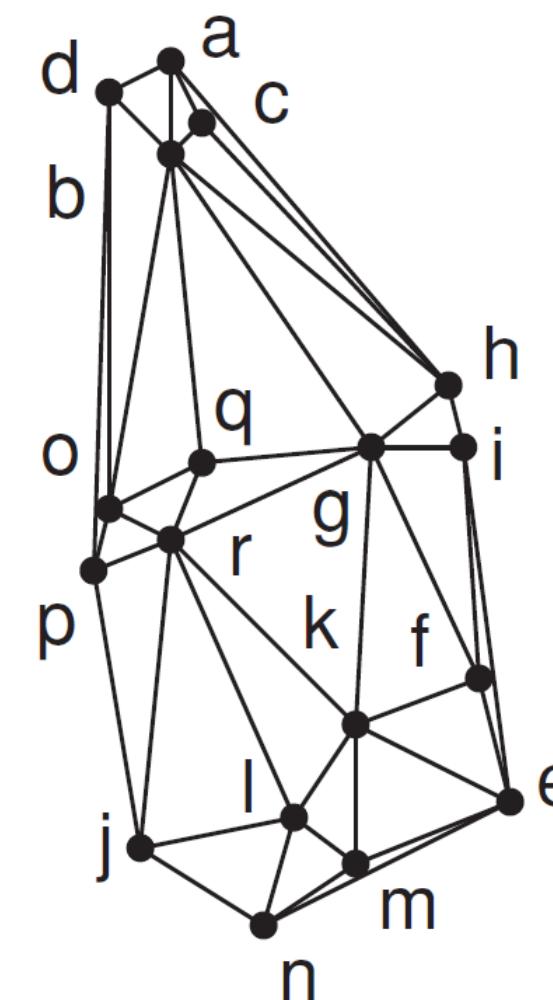
Object	a	b	c	d	e	f	g	h	i	j	k	l	m	n	o	p	q	r
a	0	75	56	56	660	559	352	346	393	638	558	621	667	704	366	417	326	387
b	75	0	35	71	593	493	288	293	336	563	486	547	594	629	292	343	251	313
c	56	35	0	79	604	503	296	292	338	590	503	567	613	652	321	373	275	338
d	56	71	79	0	660	562	358	363	407	613	550	606	656	686	337	388	309	366
e	660	593	604	660	0	103	309	341	290	302	140	175	135	224	403	386	372	348
f	559	493	503	562	103	0	207	239	188	307	107	188	180	266	330	325	285	274
g	352	288	296	358	309	207	0	80	75	375	225	306	338	397	218	246	138	179
h	346	293	292	363	341	239	80	0	52	451	285	372	395	462	293	324	210	257
i	393	336	338	407	290	188	75	52	0	418	241	330	349	420	292	316	213	249
j	638	563	590	613	302	307	375	451	418	0	202	127	175	118	276	228	316	251
k	558	486	503	550	140	107	225	285	241	202	0	90	112	179	266	247	247	212
l	621	547	567	606	175	188	306	372	330	127	90	0	63	91	292	258	297	246
m	667	594	613	656	135	180	338	395	349	175	112	63	0	90	350	319	348	302
n	704	629	652	686	224	266	397	462	420	118	179	91	90	0	360	319	378	321
o	366	292	321	337	403	330	218	293	292	276	266	292	350	360	0	52	84	56
p	417	343	373	388	386	325	246	324	316	228	247	258	319	319	52	0	124	67
q	326	251	275	309	372	285	138	210	213	316	247	297	348	378	84	124	0	67
r	387	313	338	366	348	274	179	257	249	251	212	246	302	321	56	67	67	0



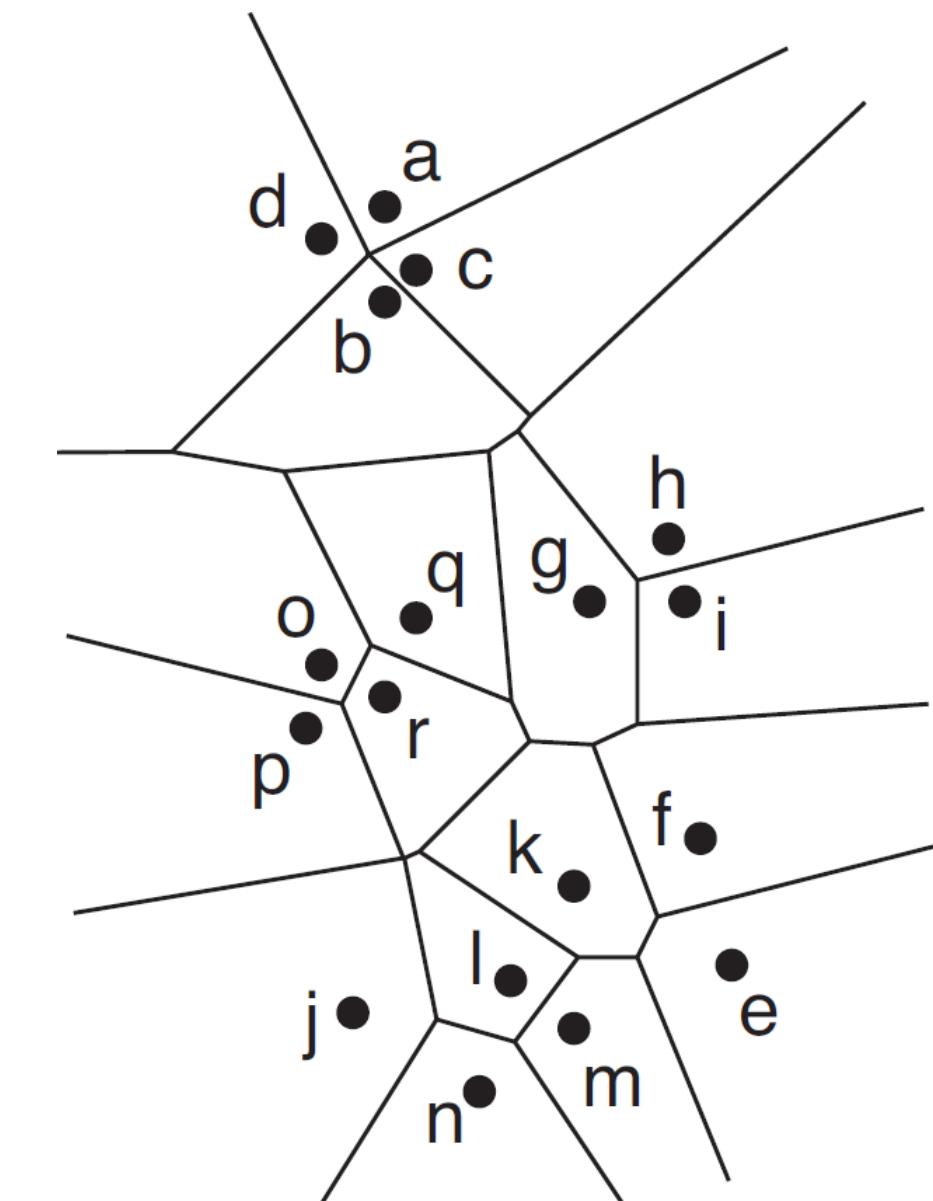
# **Nearest Neighbor Graph**



Datos

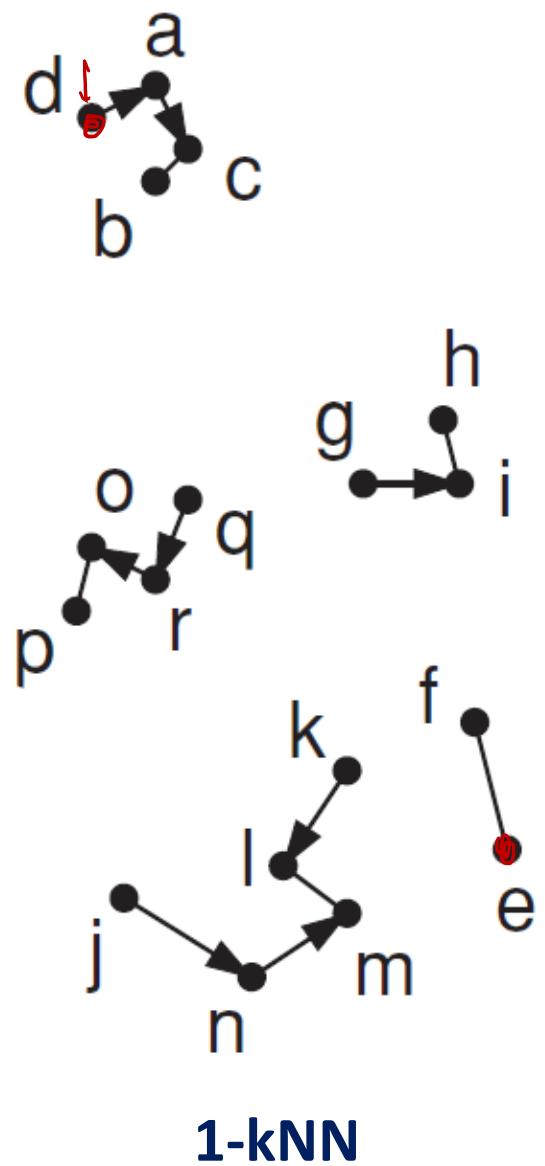


Delaunay graph

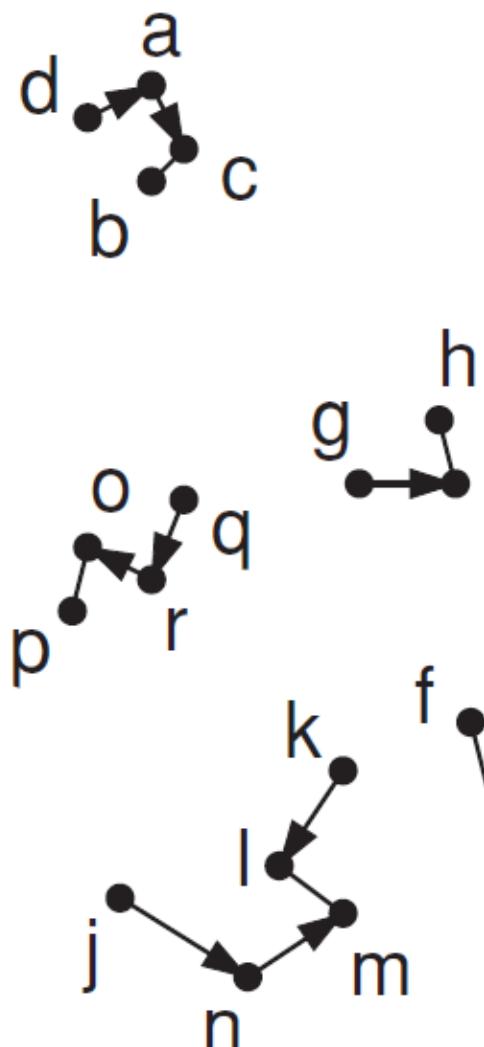


Voronoi

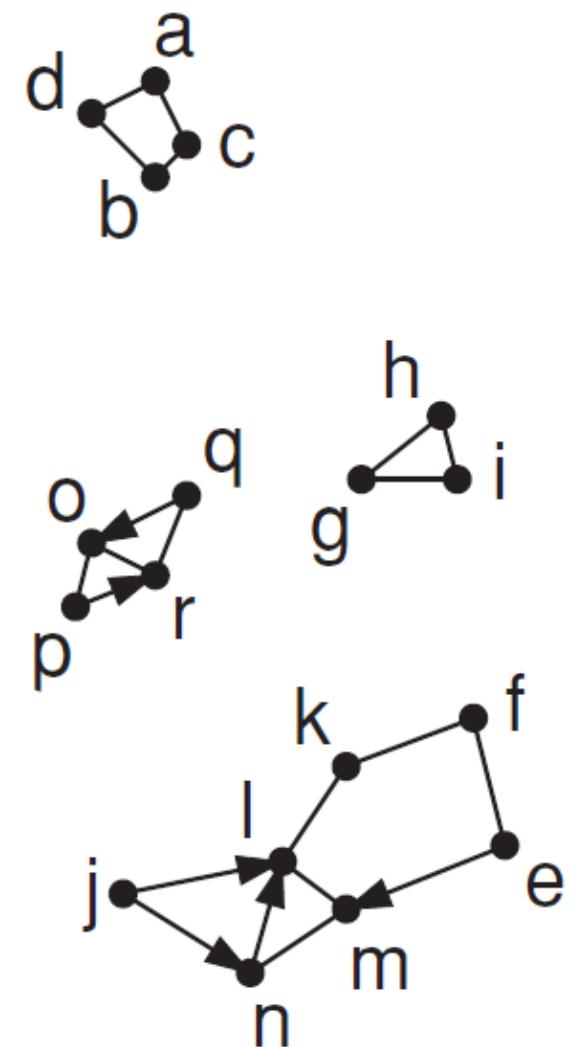
# **Nearest Neighbor** Graph



# **Nearest Neighbor Graph**

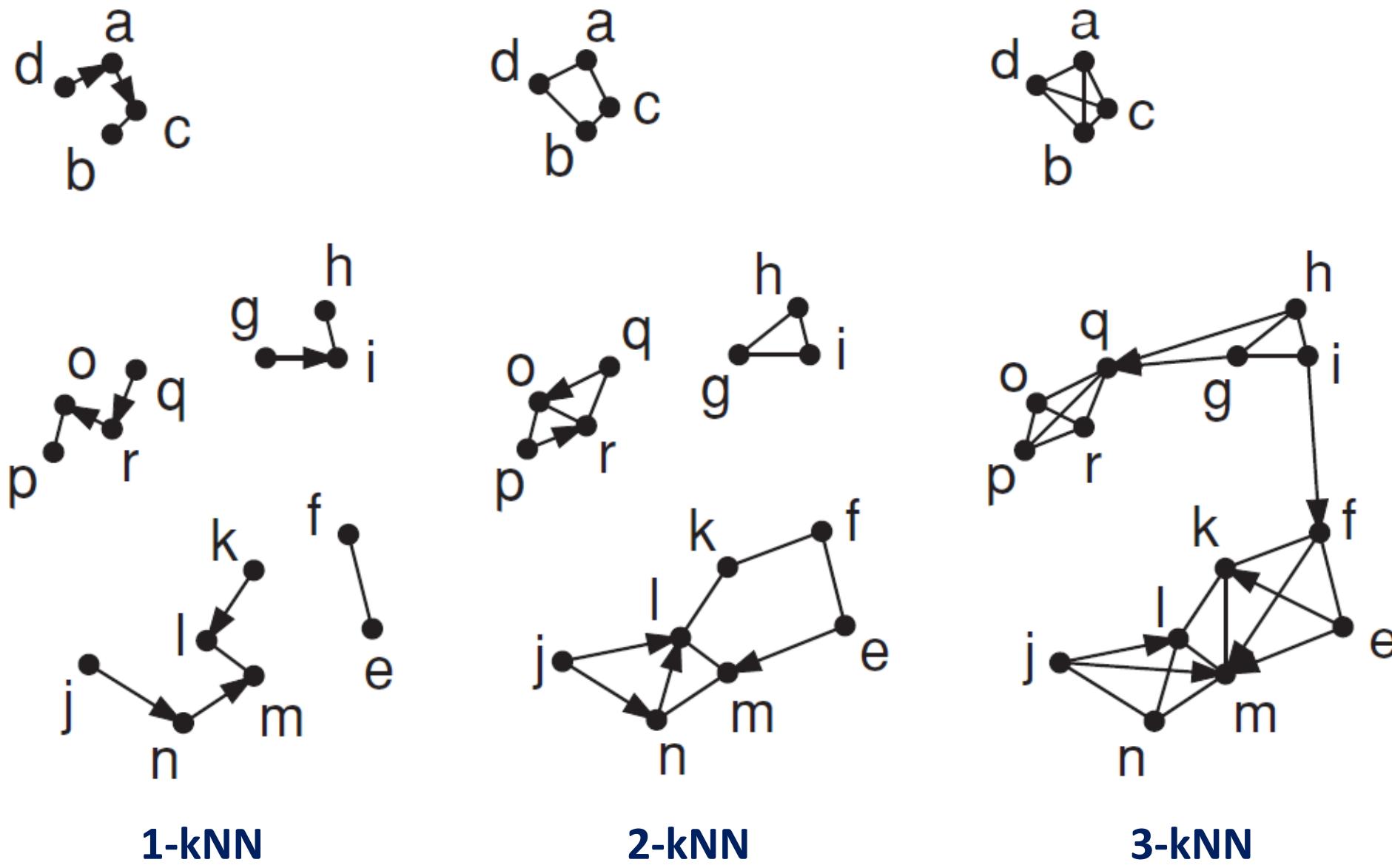


**1-kNN**



**2-kNN**

# **Nearest Neighbor Graph**

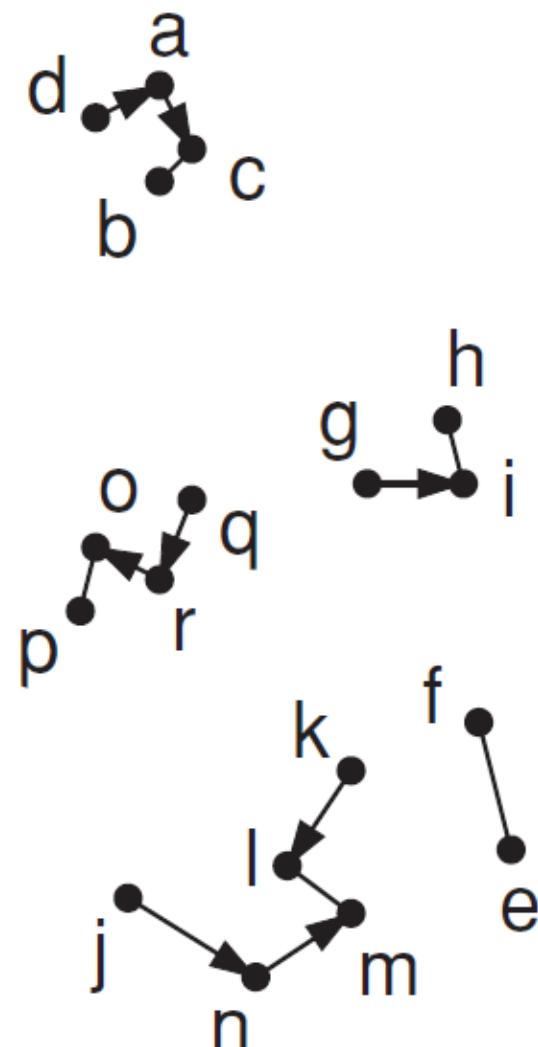


**1-kNN**

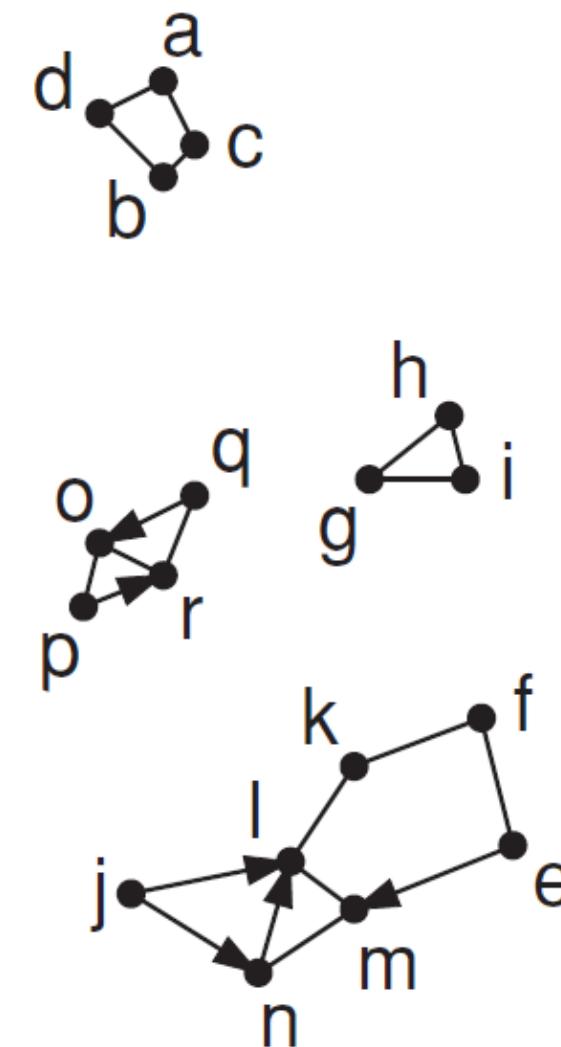
**2-kNN**

**3-kNN**

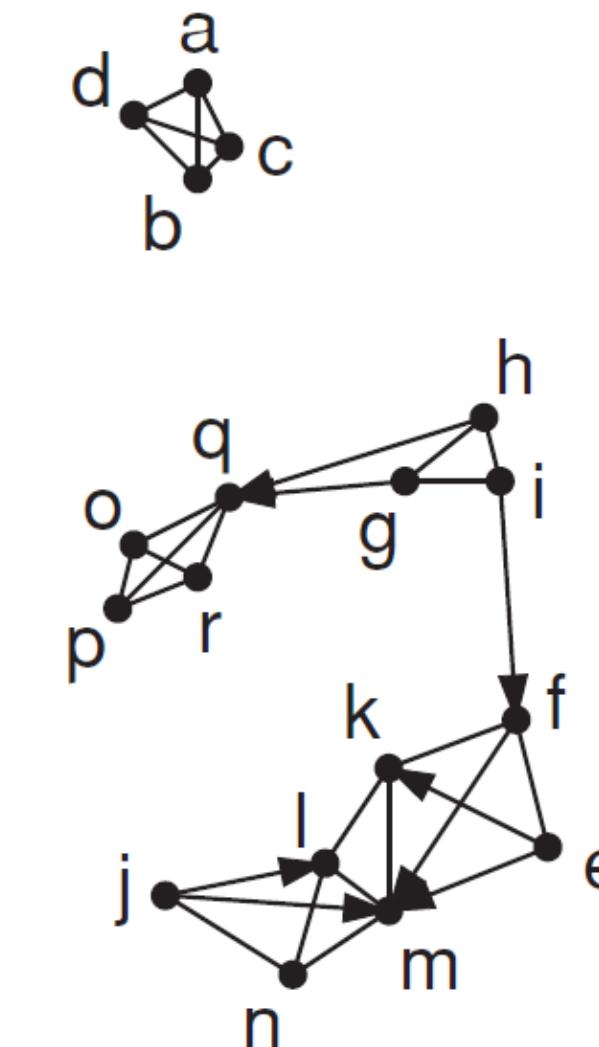
# **Nearest Neighbor Graph**



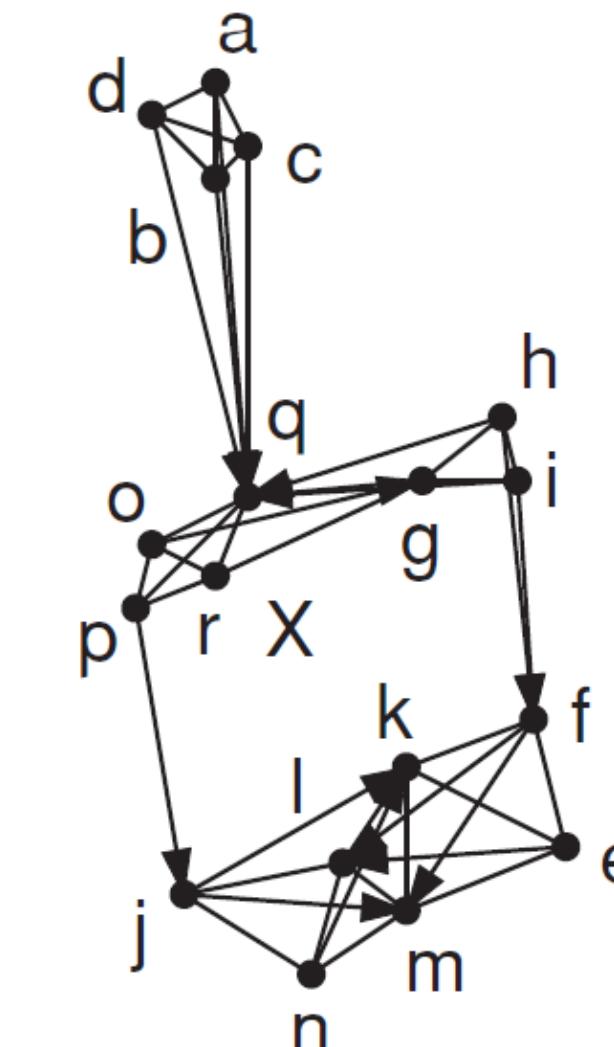
**1-kNN**



**2-kNN**

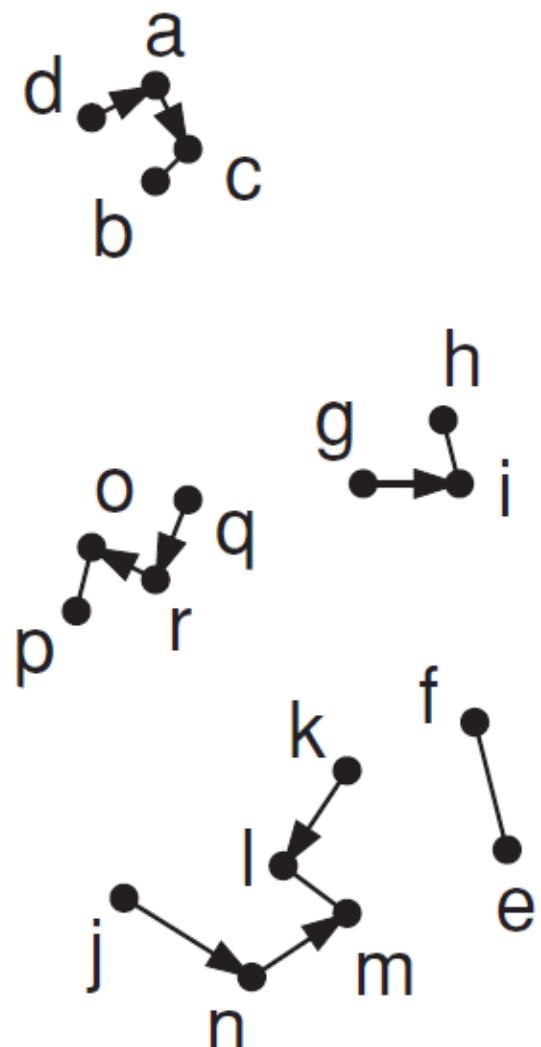


**3-kNN**

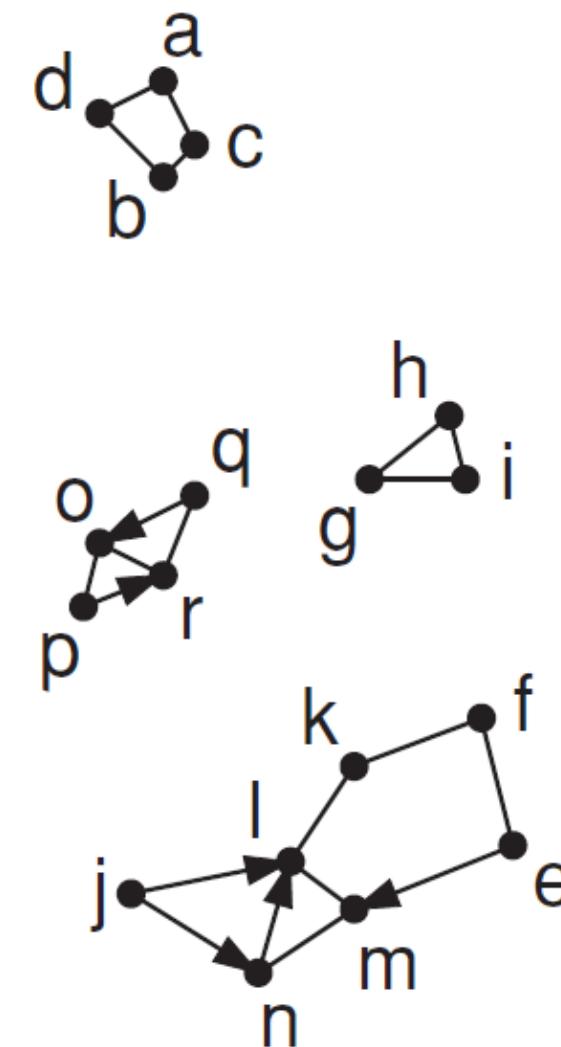


**4-kNN**

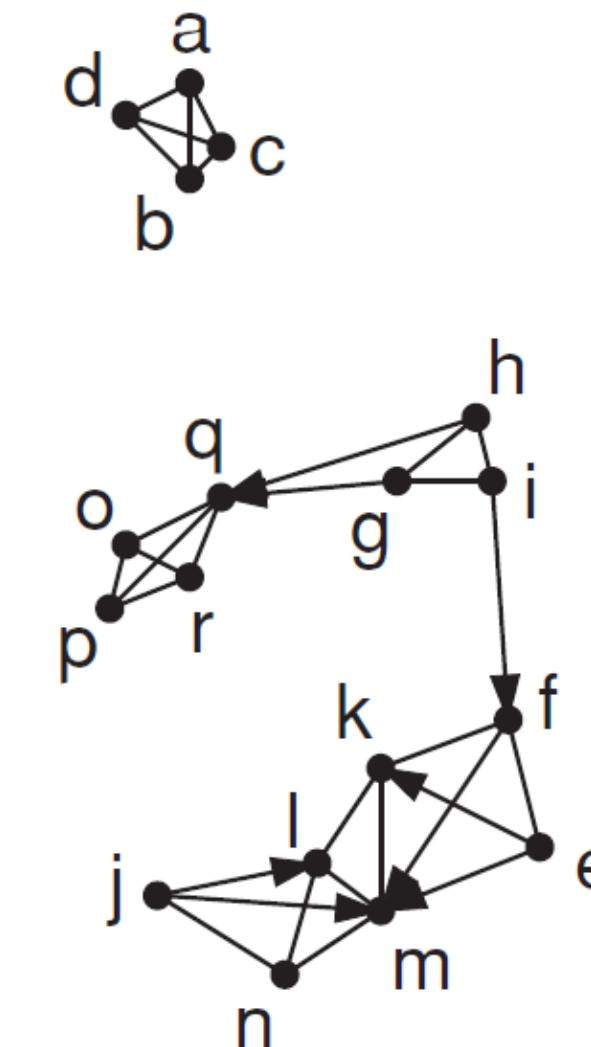
# **Nearest Neighbor Graph**



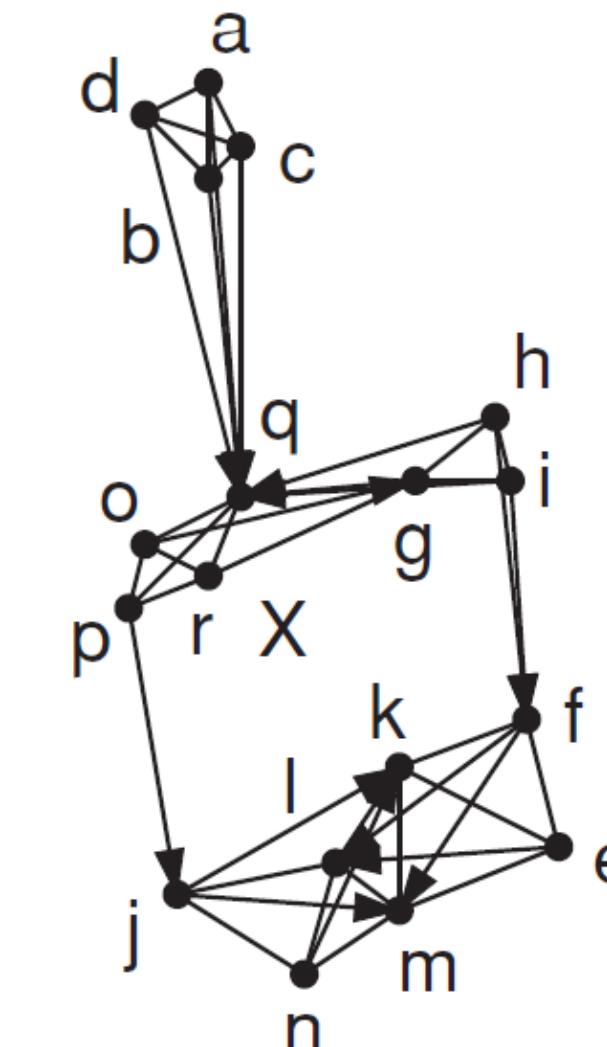
**1-kNN**



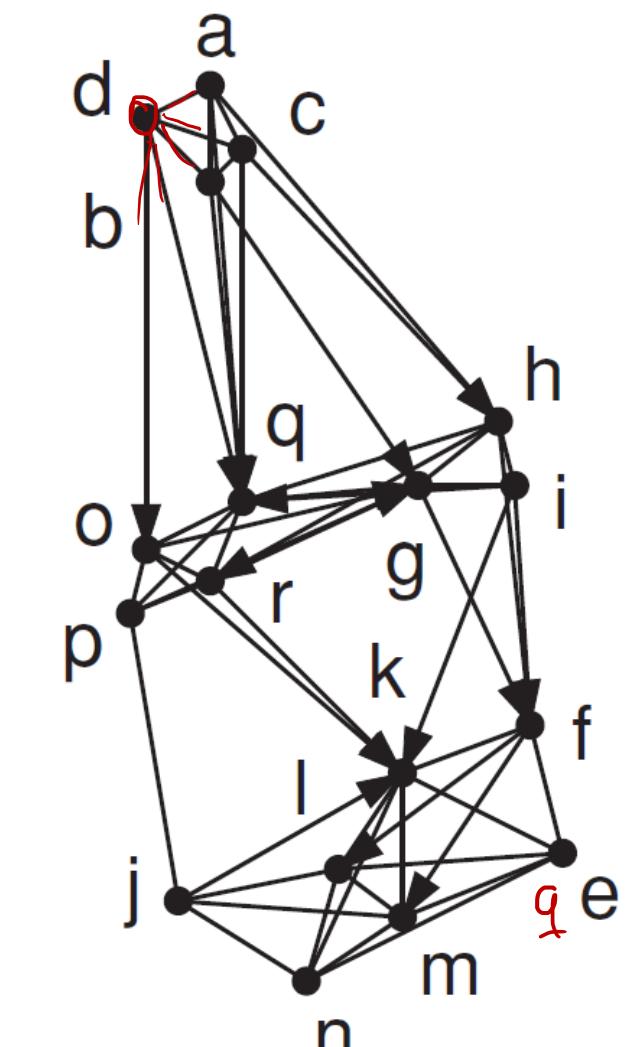
**2-kNN**



**3-kNN**



**4-kNN**



**5-kNN**

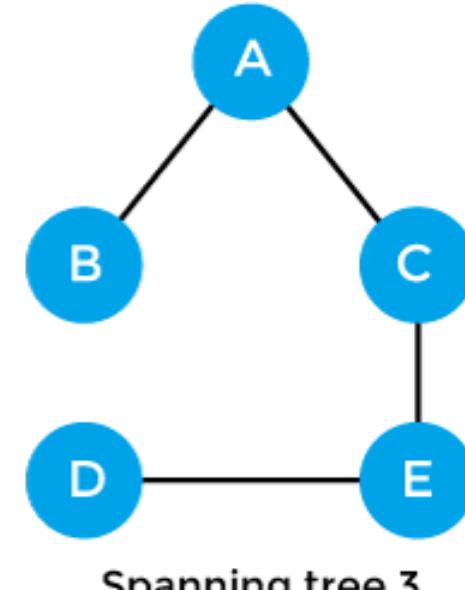
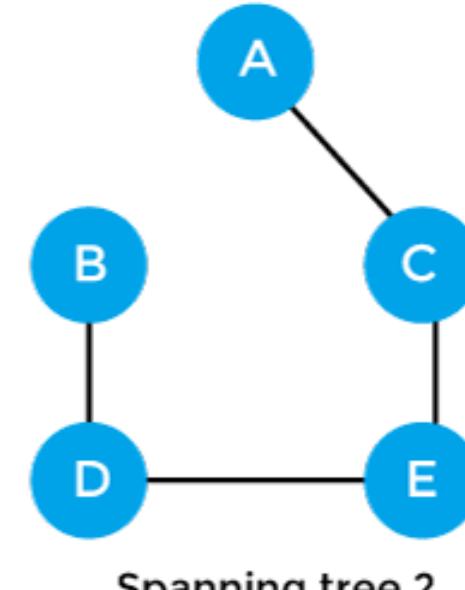
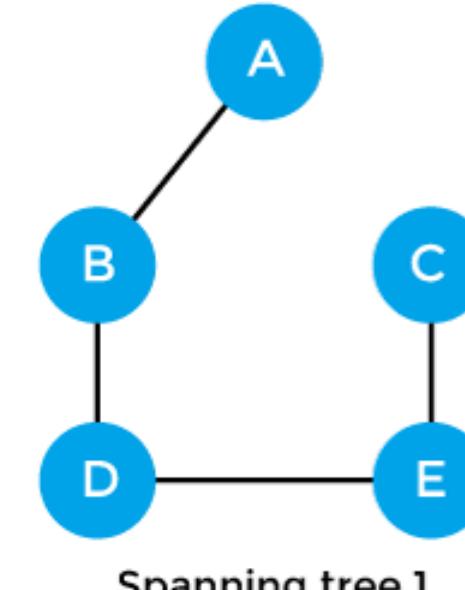
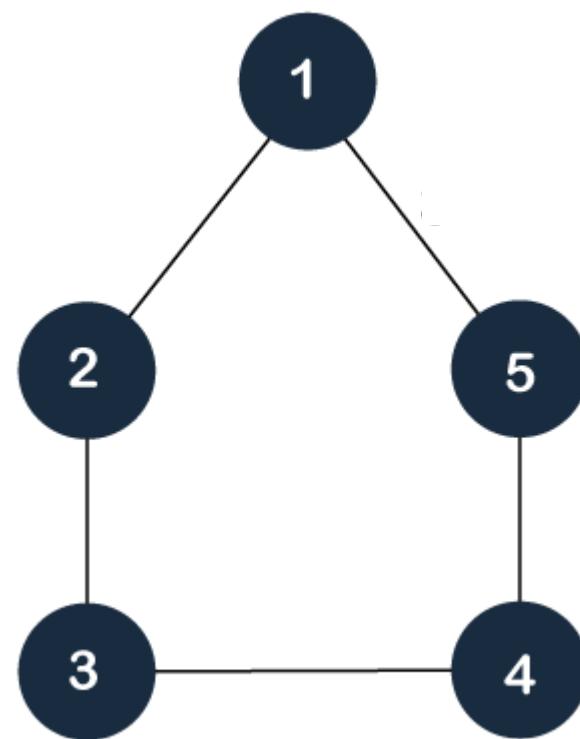
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# 3. Minimum spanning tree

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# ***Spanning tree***

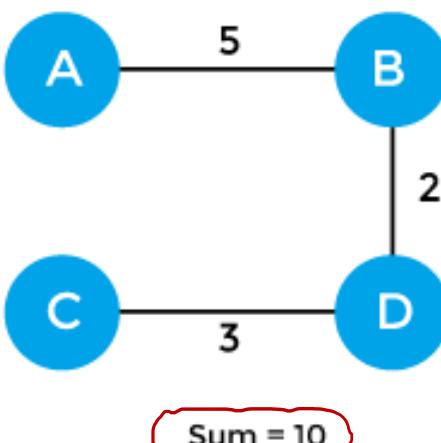
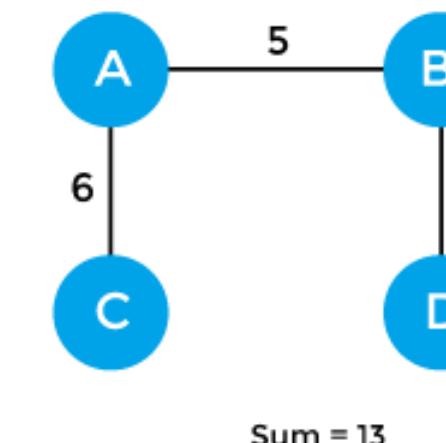
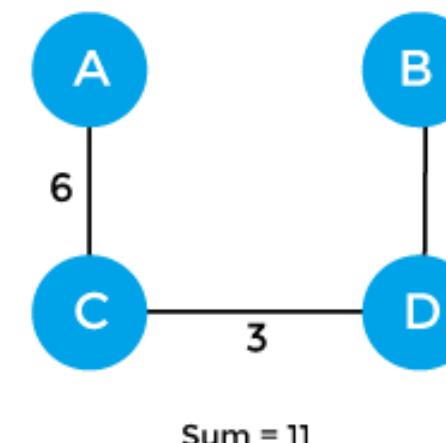
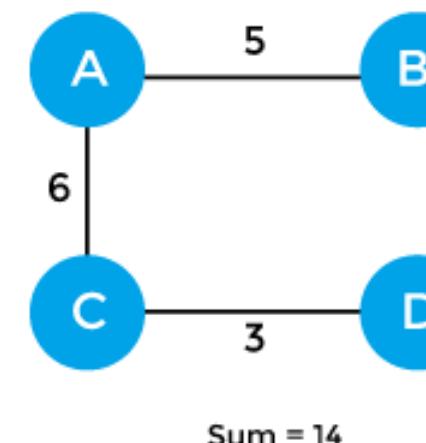
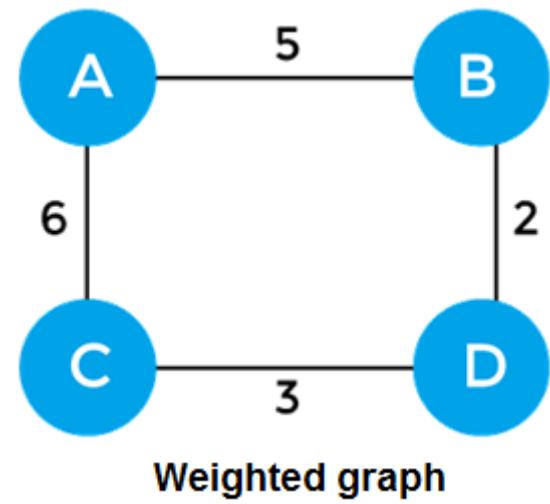
Dado un *connected undirected graph*  $G = (V, E)$ , un *spanning tree* es un árbol  $T = (V, E')$  con  $E' \subseteq E$ .



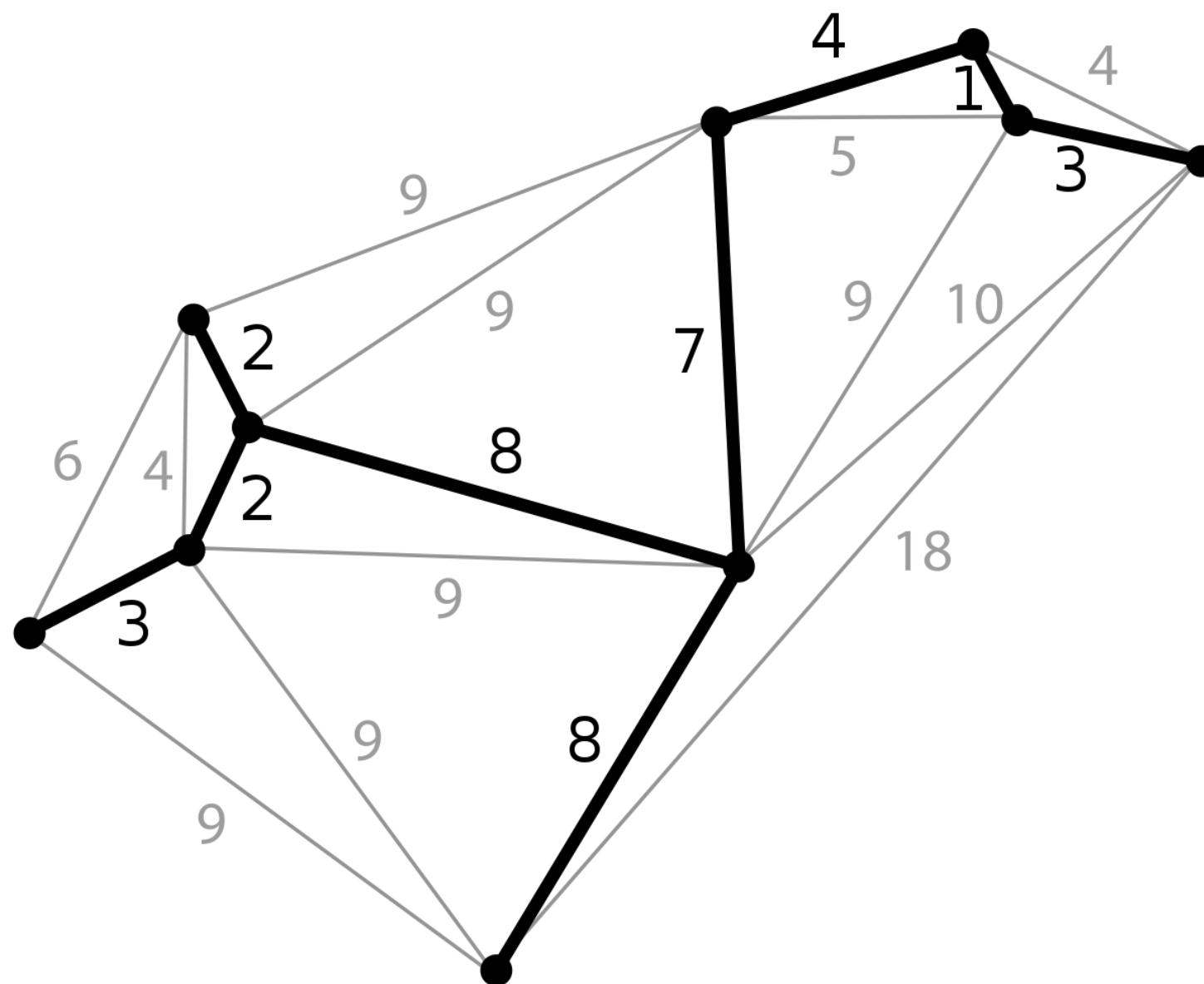
# **Minimum spanning tree**

Dado un *connected, undirected weighted graph*  $G = (V, E, \omega)$ , el *minimum (weight) spanning tree (MST)* es un *spanning tree* de mínimo *weight*, donde el *weight* de un árbol es definidos como:

$$\omega(T) = \sum_{e \in E(T)} \omega(e)$$

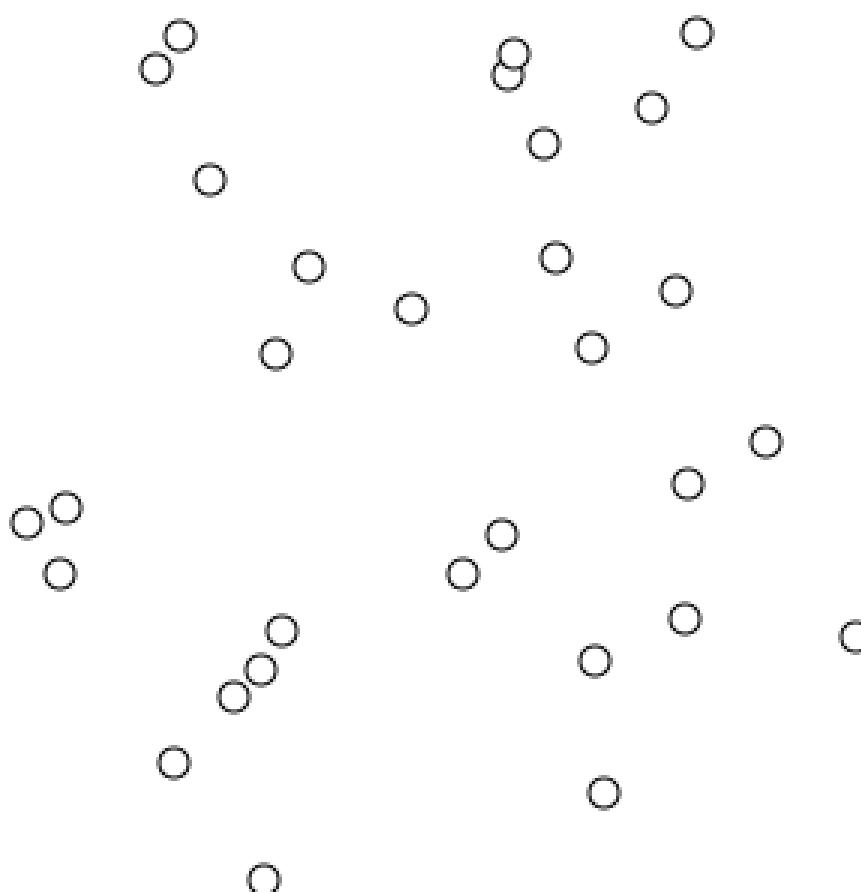


# **Minimum** spanning tree

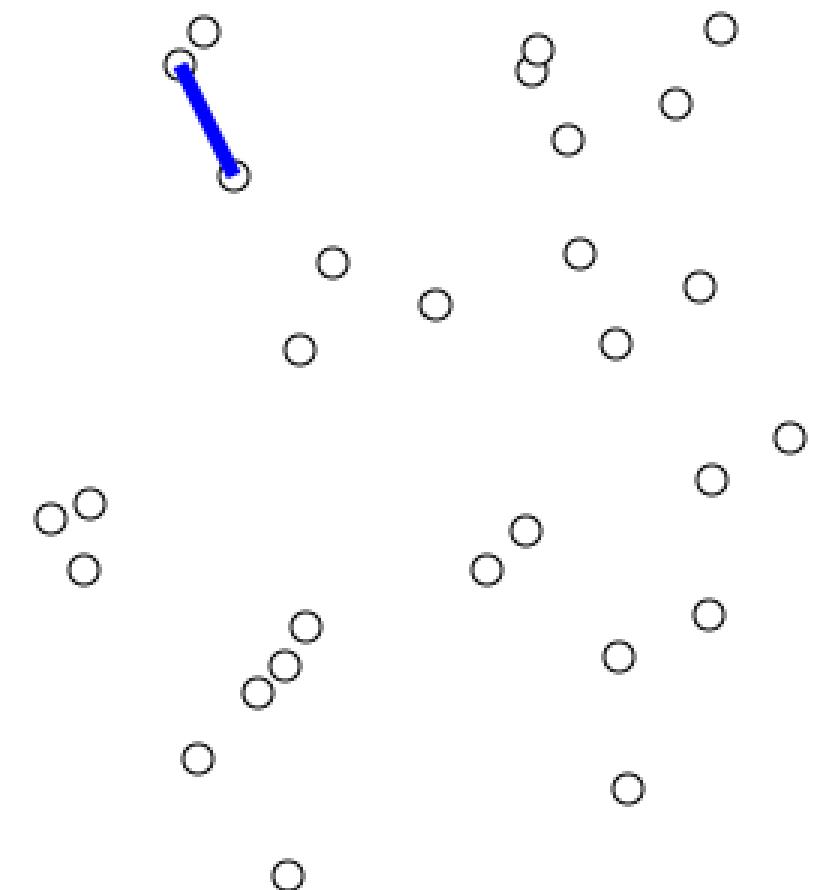


# **Kruskal's algorithm**

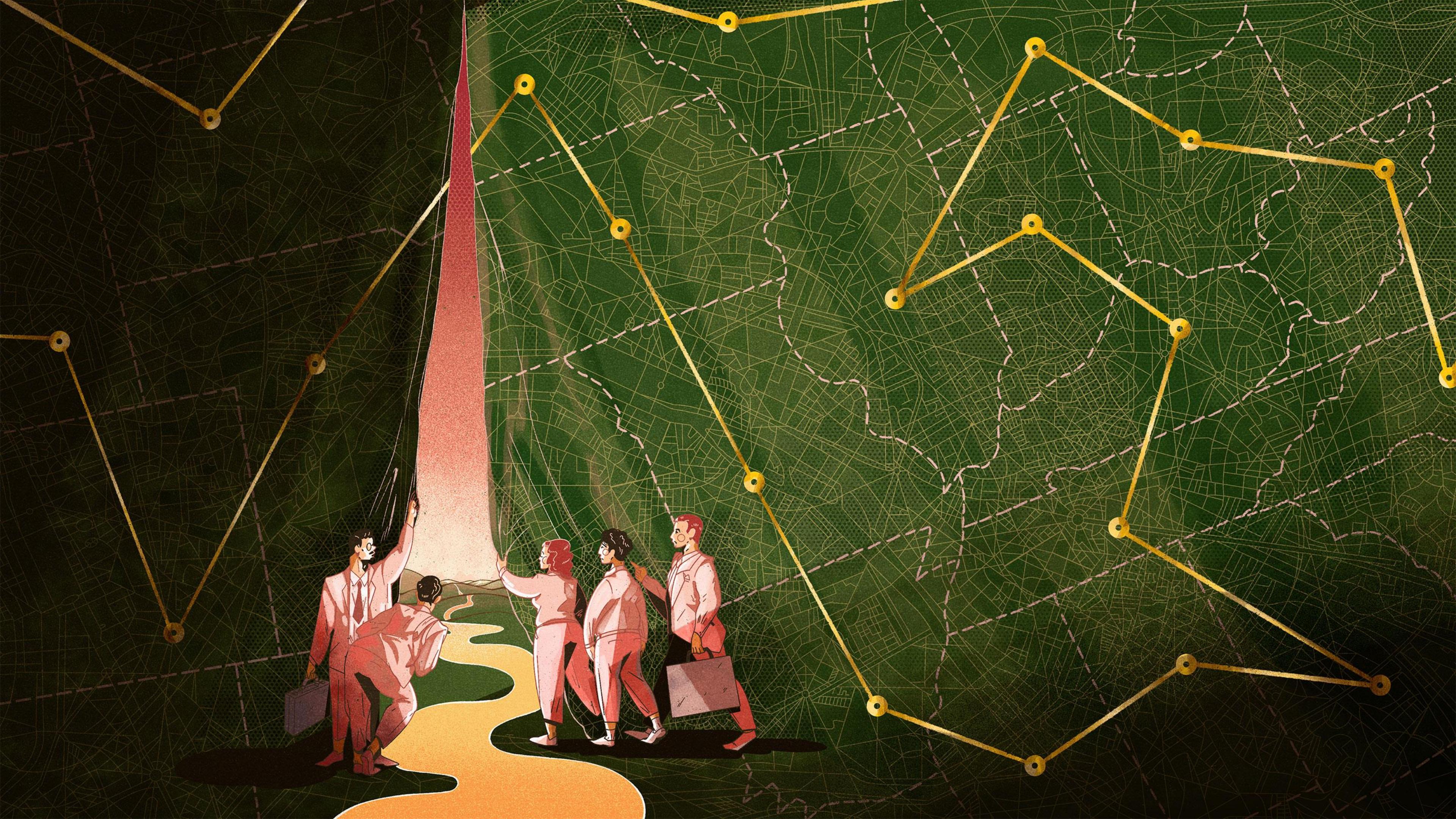
1. Ordena todos los edges de menor a mayor.
2. Agregue el edge más pequeño al *spanning tree* final. Si agregar el edge crea un ciclo, pase al siguiente edge.
3. Siga agregando todos los edges hasta que todos los nodos formen parte del tree.



# **Prim's algorithm**



1. Elija y visite un nodo arbitrario.
2. De todos los bordes visitados, elija el más pequeño y agregue el edge al árbol.
3. Siga agregando edges, hasta que se visiten todos los nodos.

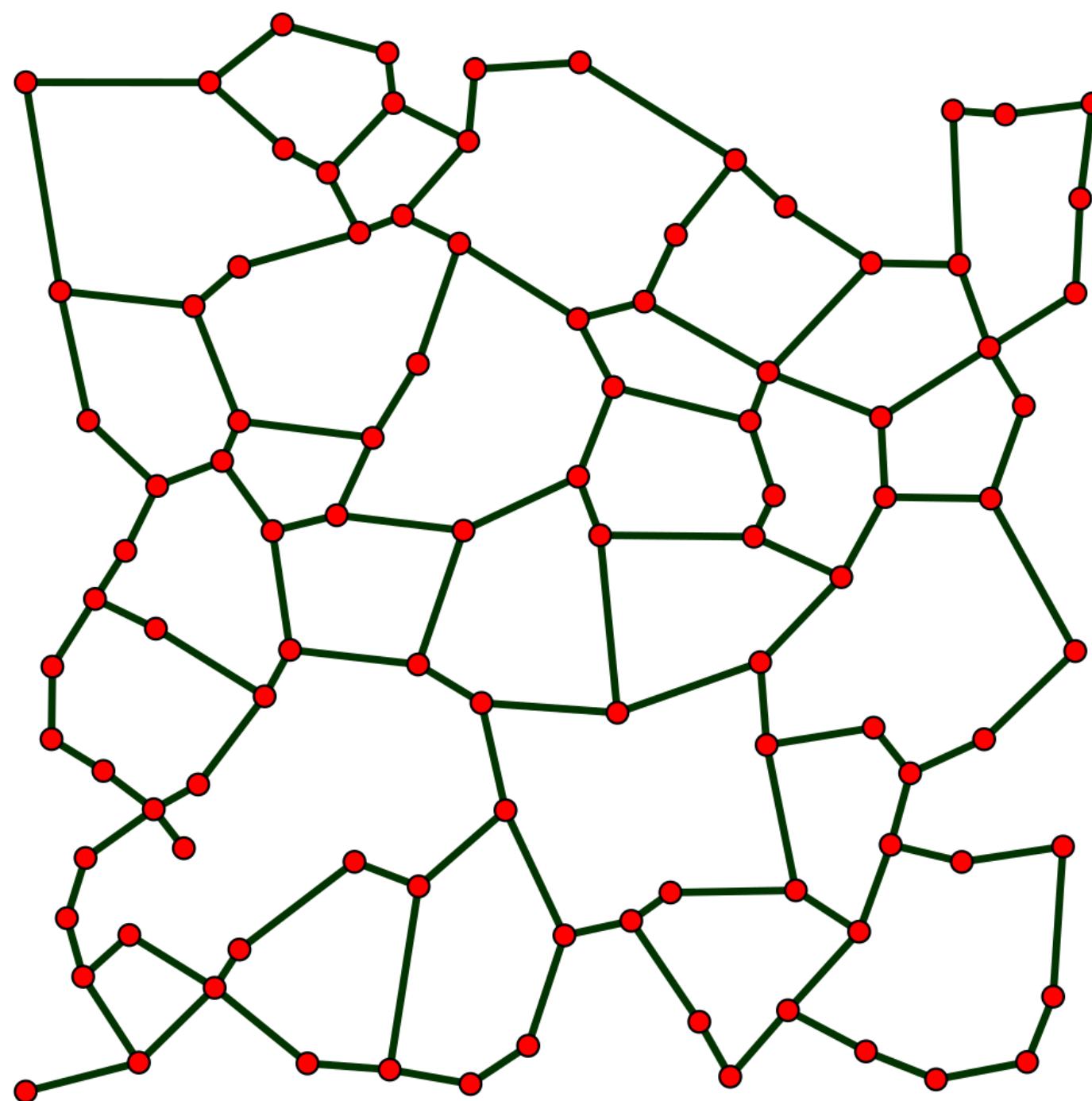


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# 4 Relative neighborhood graph

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# Relative neighborhood graph (RNG)



Conexo  $\approx$  Navegable

Planar

$d(u, v) \leq d(p, u)$   
 $d(u, v) \leq d(p, v)$

$d(u, v) \leq \max\{d(p, u), d(p, v)\}$

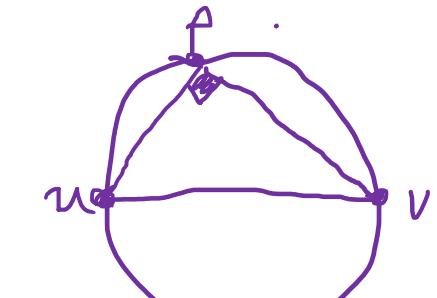
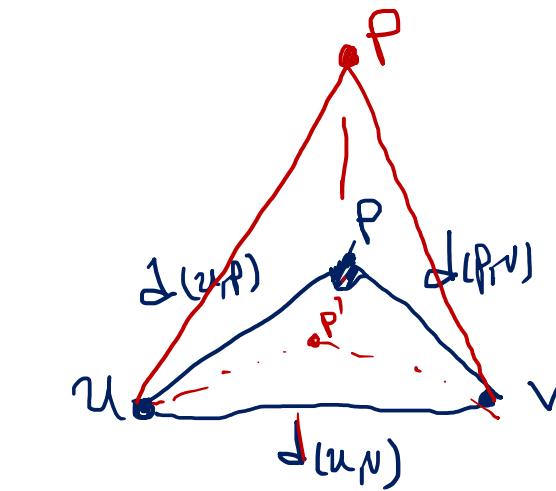
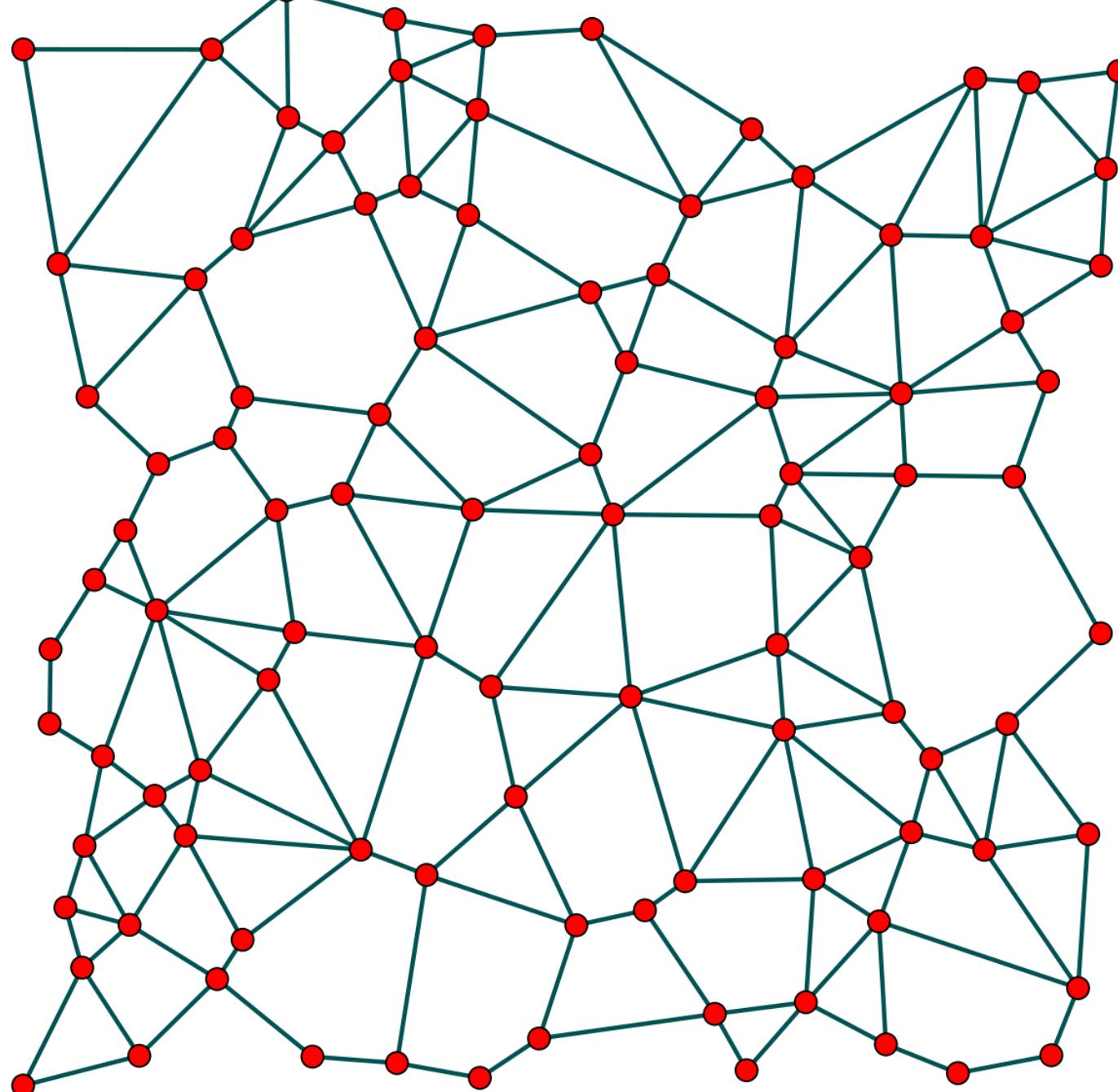
$l(n_1, n_2) \leq 2 d_2(n_1, n_2)$

---

# 5. Grafos graph

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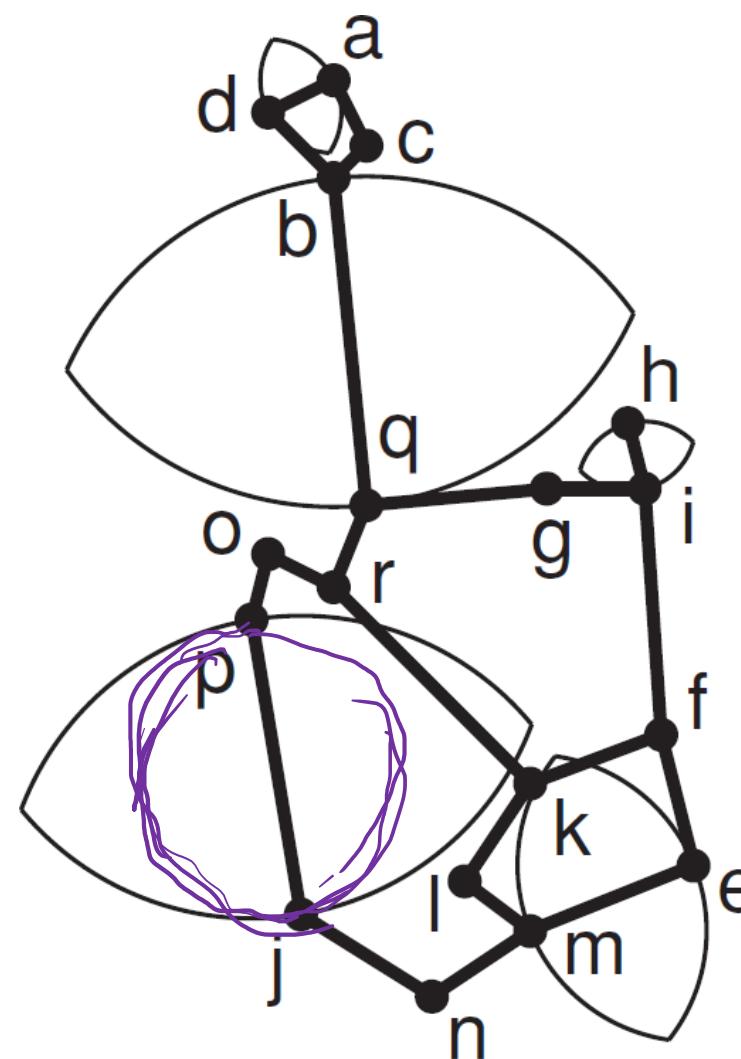
# Gabriel graph (GG)



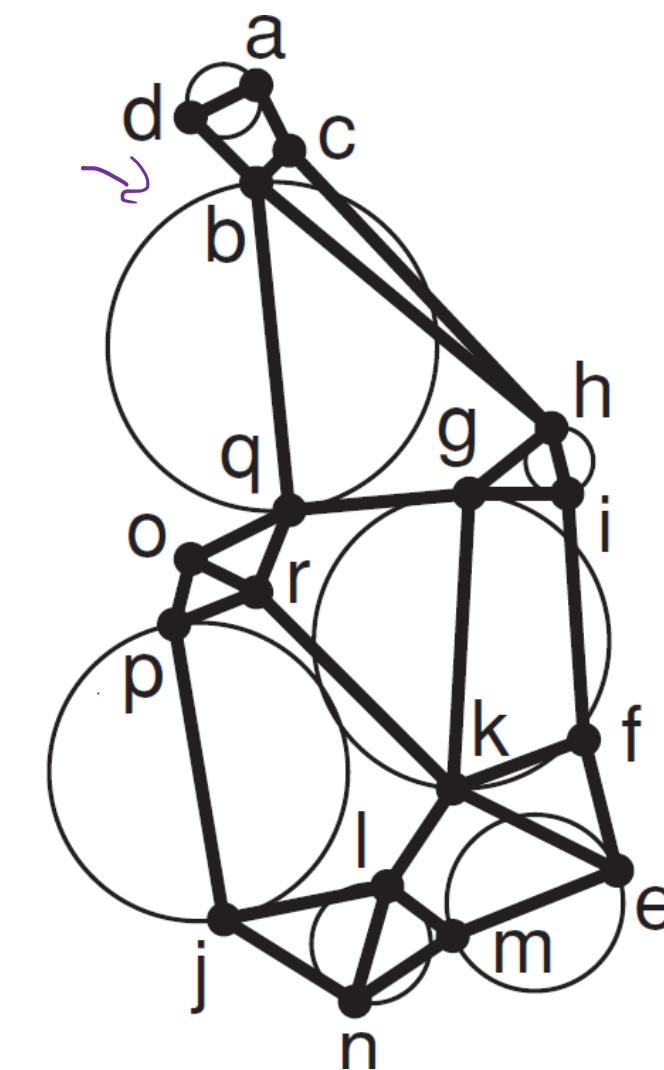
$$d(u, v)^2 \leq d(u, p)^2 + d(p, v)^2$$

Plano  
Convexo

# Gabriel graph

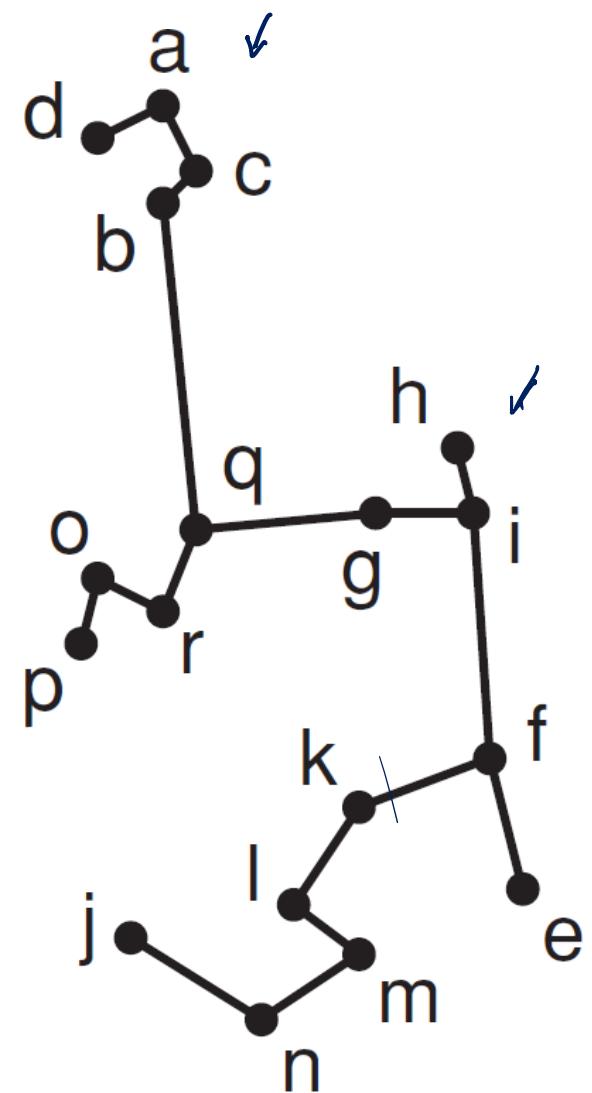


# Relative neighborhood graph (RNG)

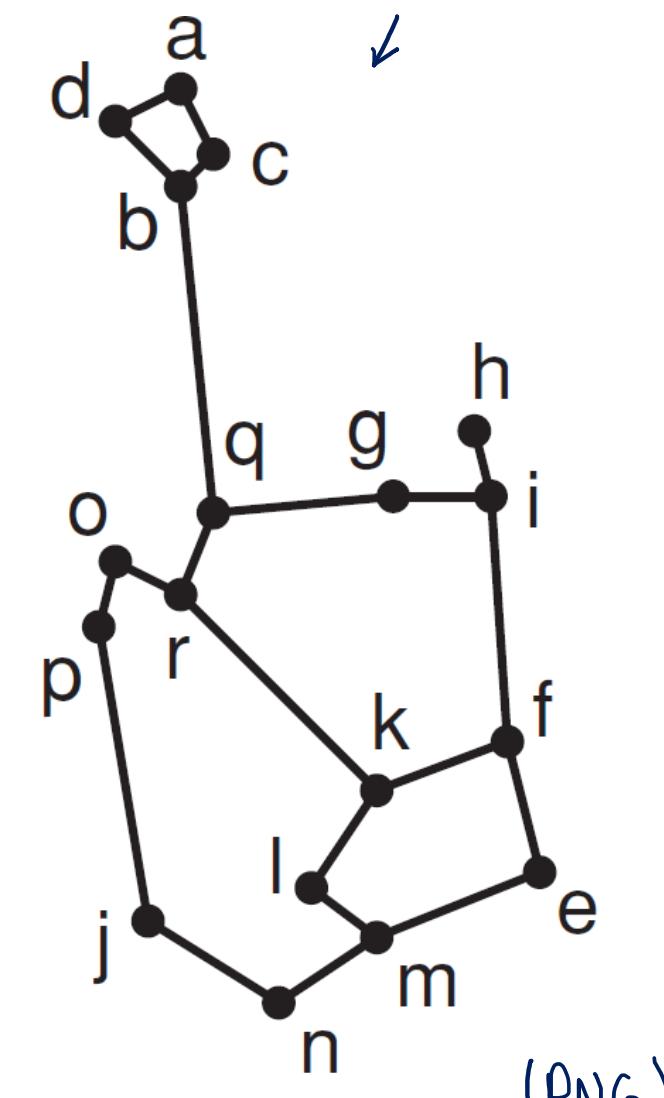


# Gabriel graph (GG)

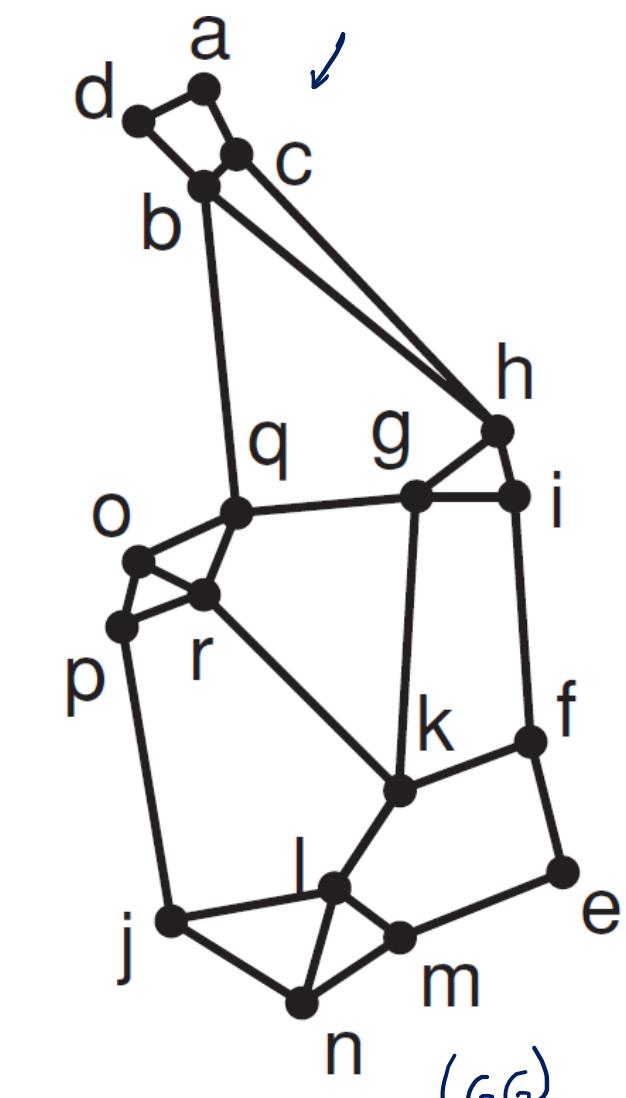
# Gabriel graph



Minimal spanning tree

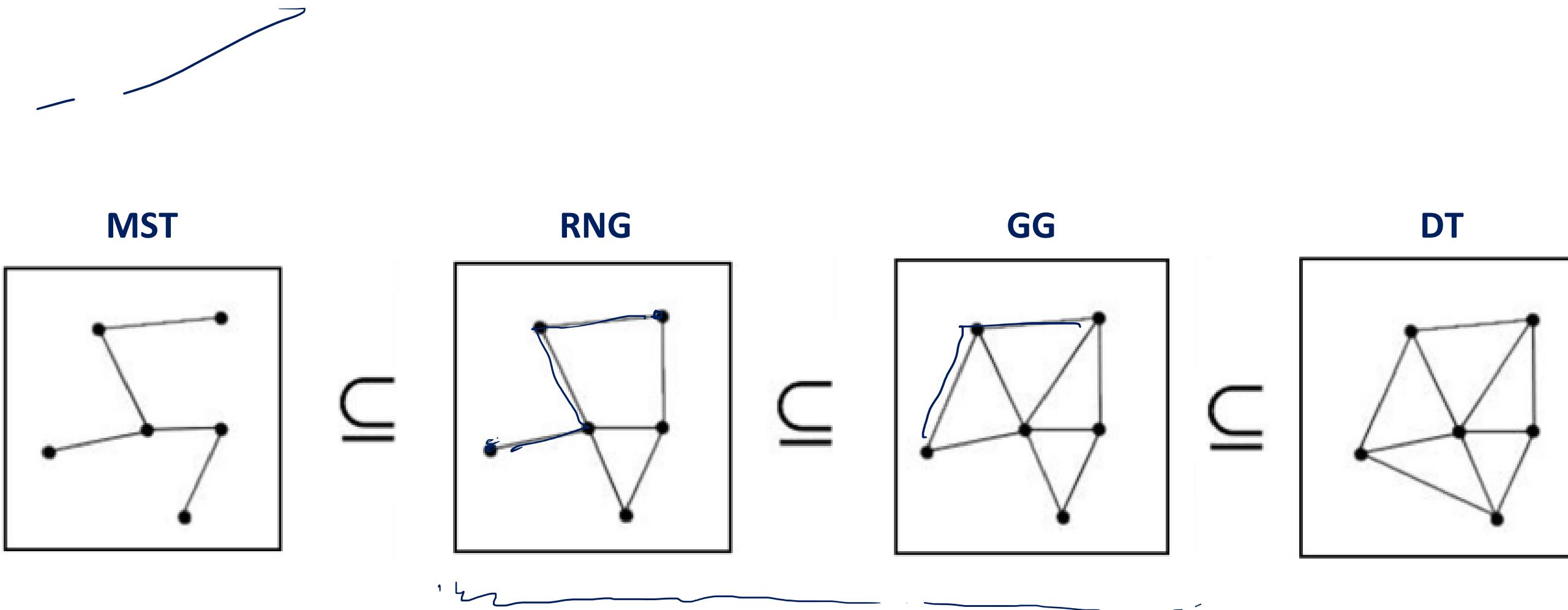


Relative neighborhood graph



Gabriel graph

# Gabriel graph

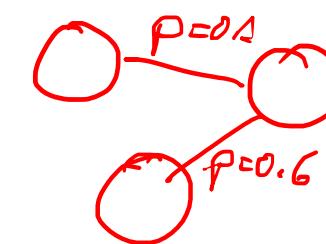


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# 6. Grafos aleatorios

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# Grafo aleatorio



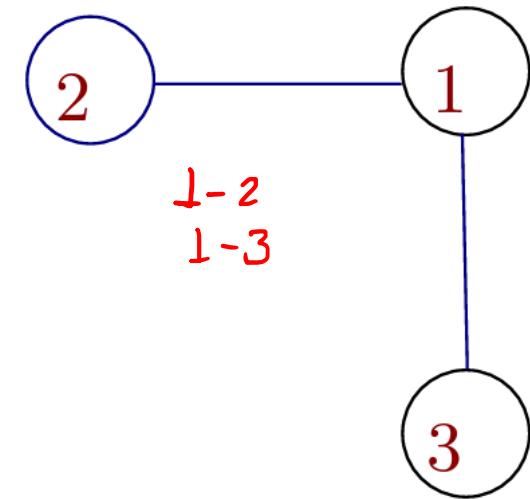
## Uniform random graph

Grafos con exactamente  $m$  aristas

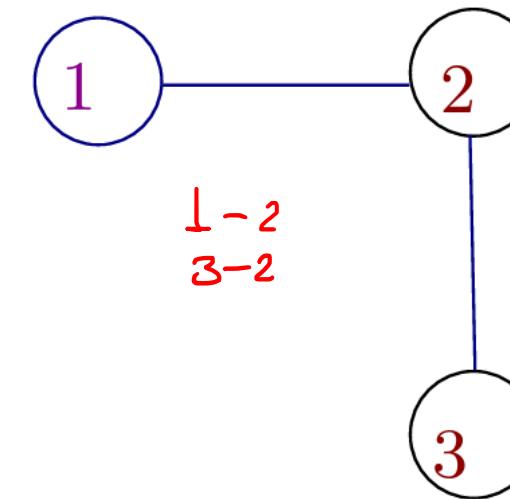
$n$ : nodos

$m=2$

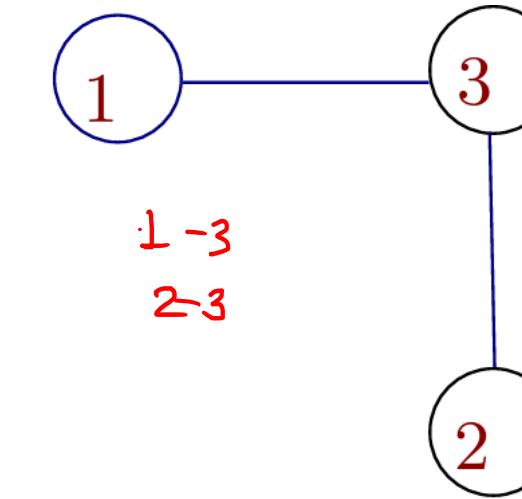
$$\frac{1}{\binom{n}{2}^m}$$



Probability  $\frac{1}{3}$



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Probability  $\frac{1}{3}$

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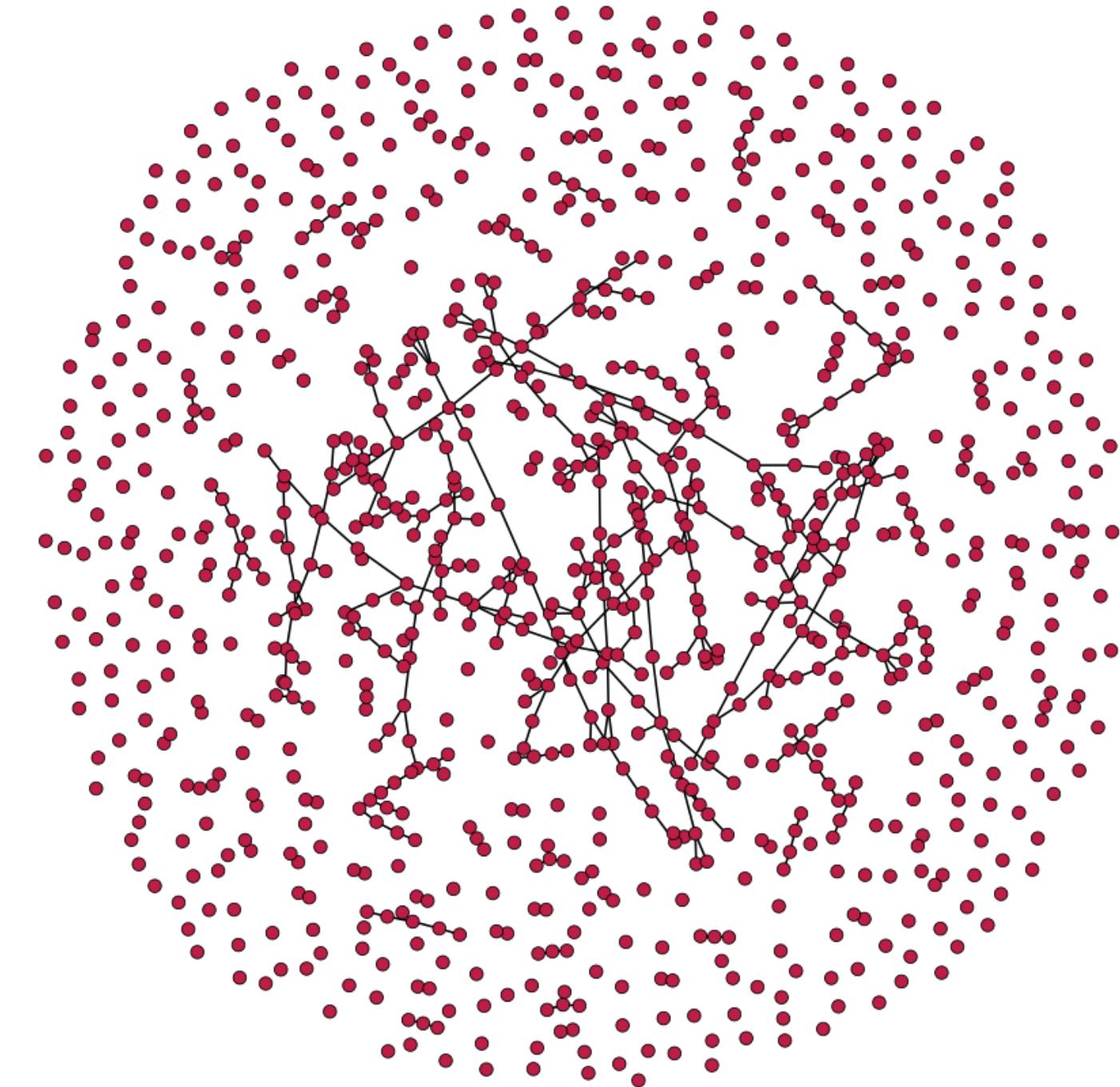
Percolación

**Modelo de Erdős–Rényi**       $G(n, m)$

Random binomial graphs

Si cada par de nodos tiene probabilidad  $p$  de estar conectados, entonces, la probabilidad de obtener un grafo de  $n$  nodos y  $m$  aristas:

$$p^m(1 - p)^{\binom{n}{2} - m}$$





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