

Compact representation of distances in a graph : a tour around 2-hop labelings

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The beginning of the story

SODA 2017 :

- **Chepoi, Dragan, Vaxès** : Core congestion is inherent in **hyperbolic networks**.
- **Kosowski, V.** : Beyond highway dimension : small **distance labels** using tree skeletons.

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Encoding distances in a graph

We are given a (weighted) (di-) graph $G = (V, E)$ with n nodes and m edges.

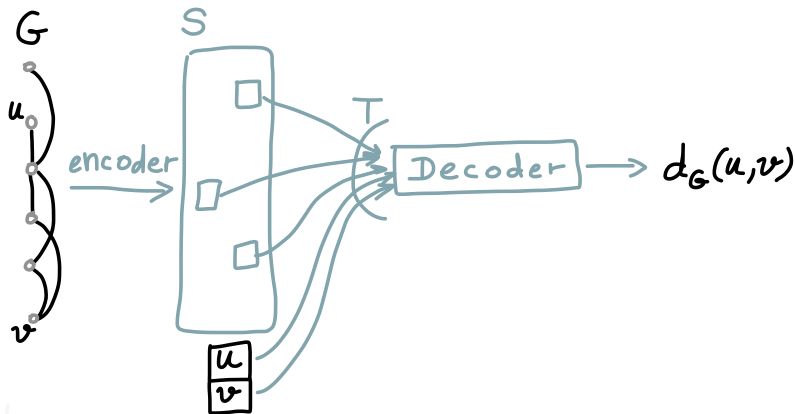
Make any useful pre-computation to answer efficiently online distance queries : what is distance $d(u_1, v_1)$?, $d(u_2, v_2)$?, $d(u_3, v_3)$?, ...

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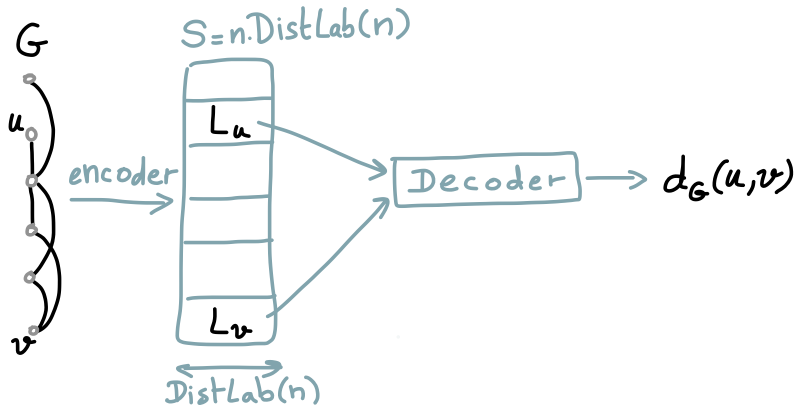
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Encoding a graph metric : distance oracles



Encoding a graph metric : distance labelings



Encoding a graph metric : 2-hop labelings

A 2-hop labelings is a very simple kind of distance labeling.

The main idea is to associate a set $H_u \subseteq V$ of "hubs" to each node u and to store the distances $d(u, v)$ for all $v \in H_u$.

Also known as hub labeling, or landmark labeling.

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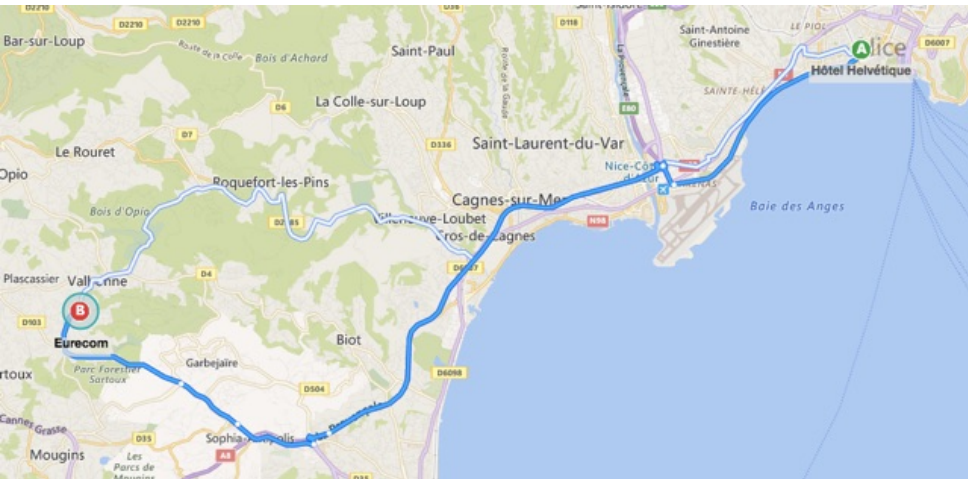
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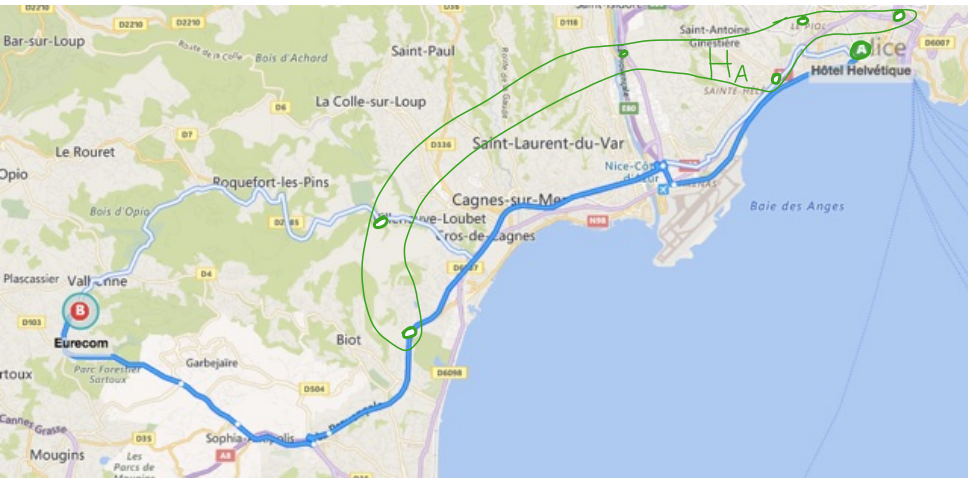
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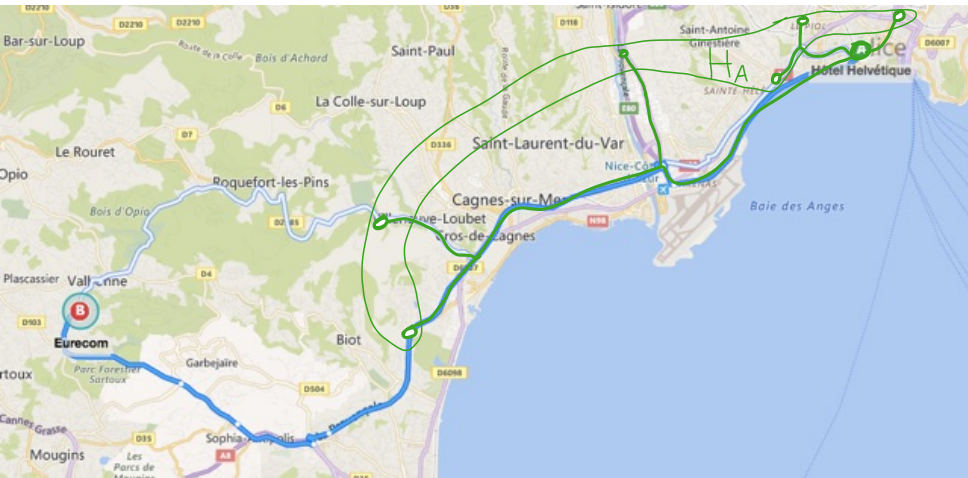
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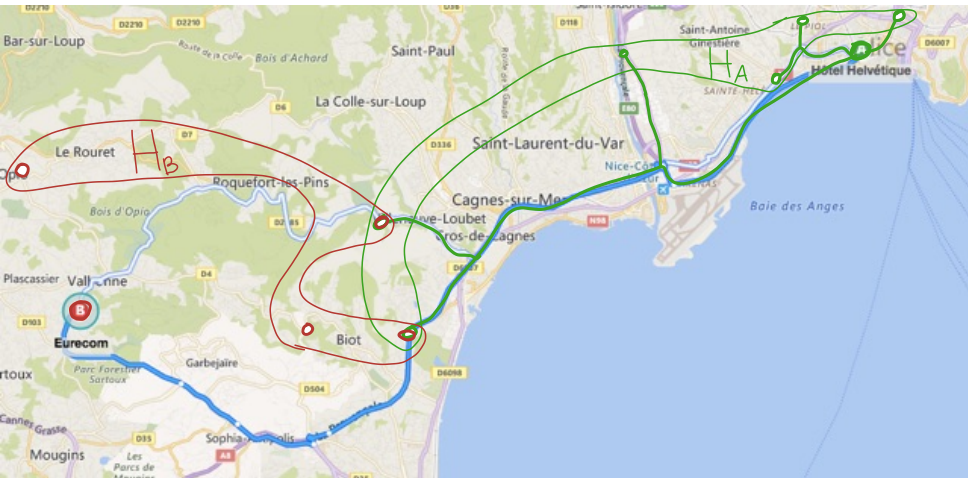
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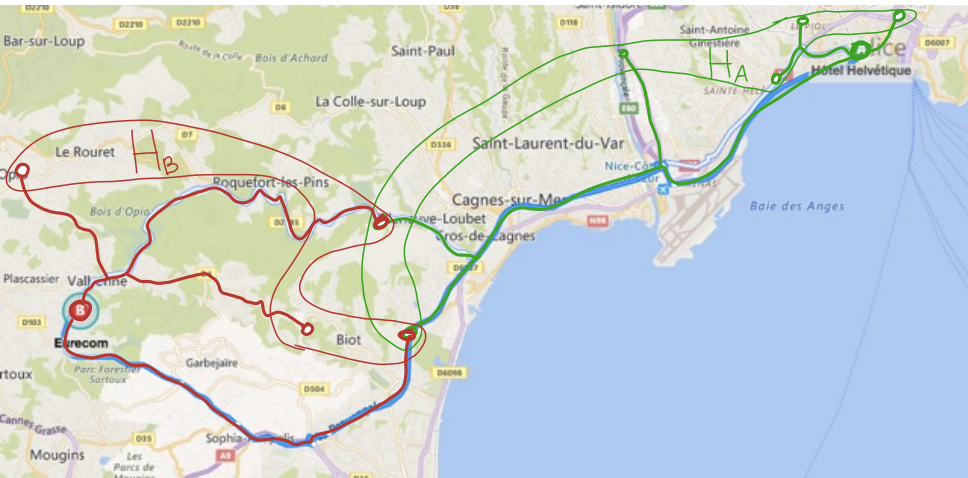
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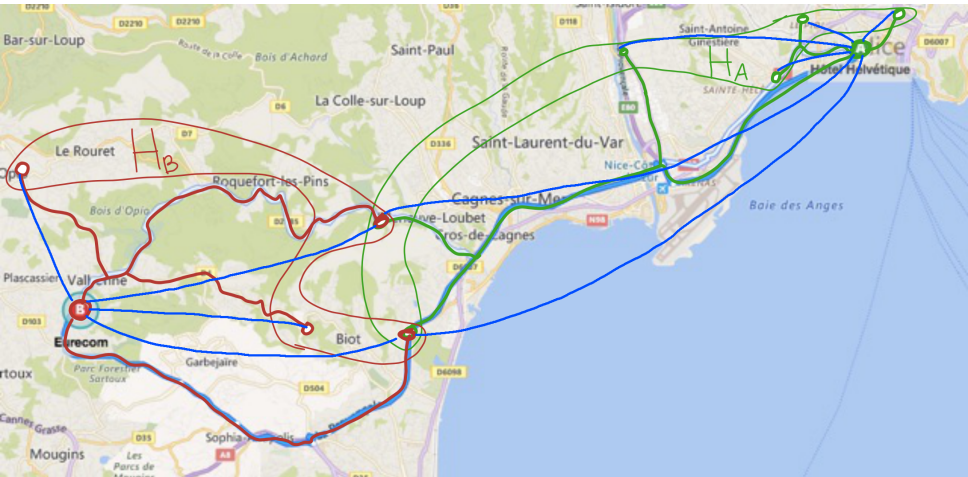
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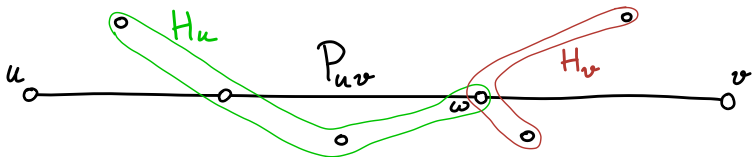
2-hop labeling



Hub sets

Covering property :

A collection of hub sets $H_u \subseteq V$ for all $u \in V$ is said to **cover** graph G if for all u, v , there exists $w \in H_u \cap H_v$ with $d(u, v) = d(u, w) + d(w, v)$.



Distance labels : $L_u = \{(w, d(u, w)) : w \in H_u\}$

Distance query : $\text{Dist}(L_u, L_v) = \min_{w \in H_u \cap H_v} d(u, w) + d(w, v)$

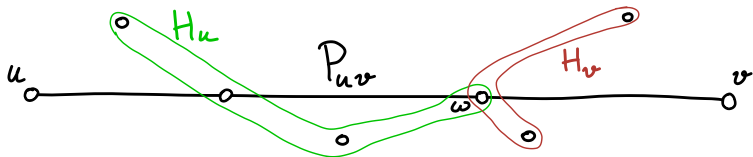
Introduced by [Gavoille et al. '04; Cohen et al. 2003],
applied to road networks [Abraham et al. 2010-2013],
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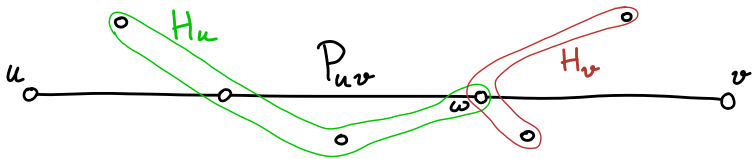
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Equivalently, for all u, v , $H_u \cap H_v \cap I(u, v) \neq \emptyset$ where the **interval** $I(u, v)$ is the union of shortest paths from u to v .

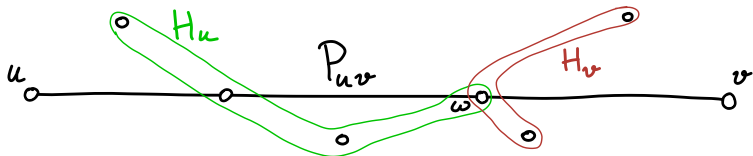
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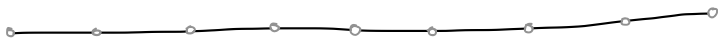


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This results in **covering hub sets** of **size $O(\log n)$** .

A similar construction works for **trees** and **bounded-treewidth graphs**.

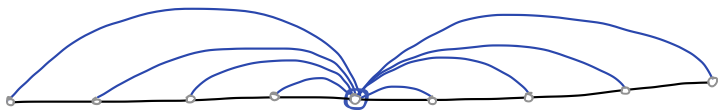
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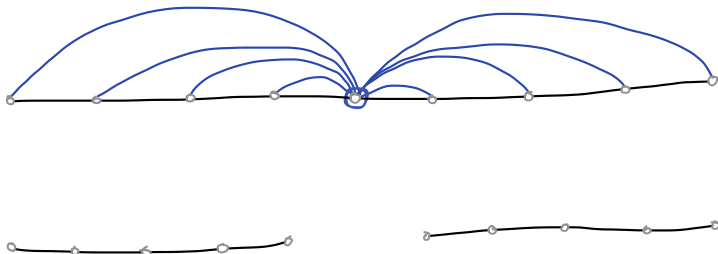
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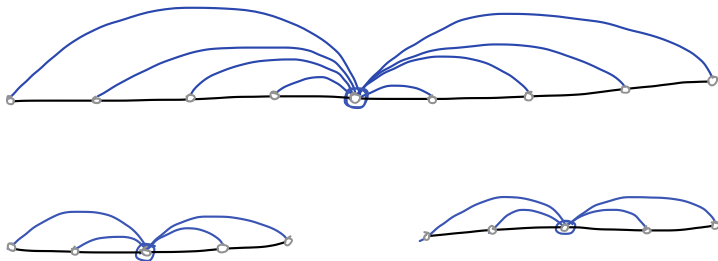
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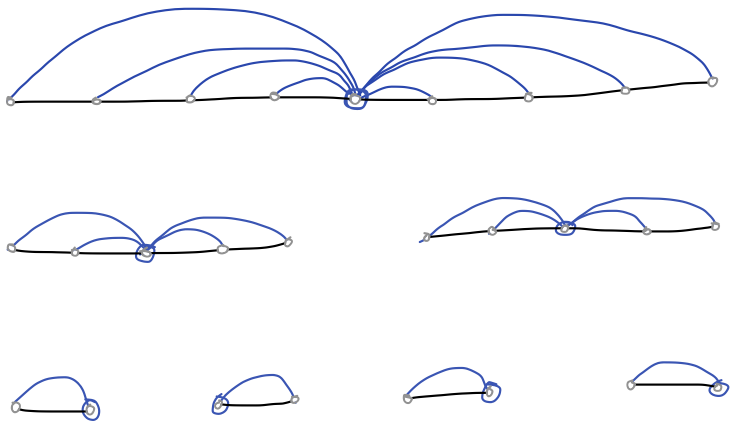
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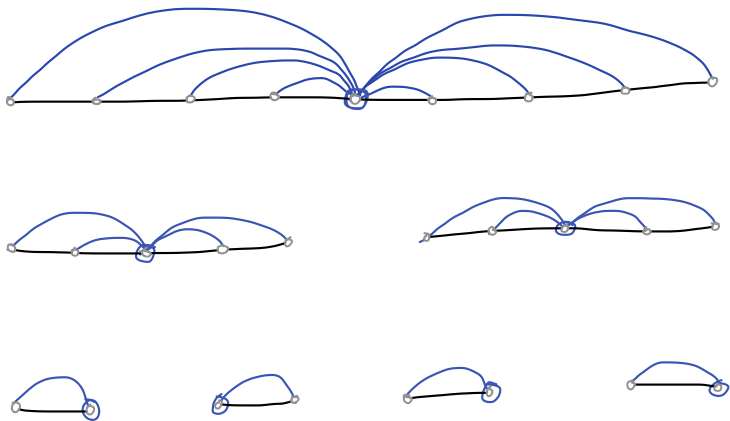


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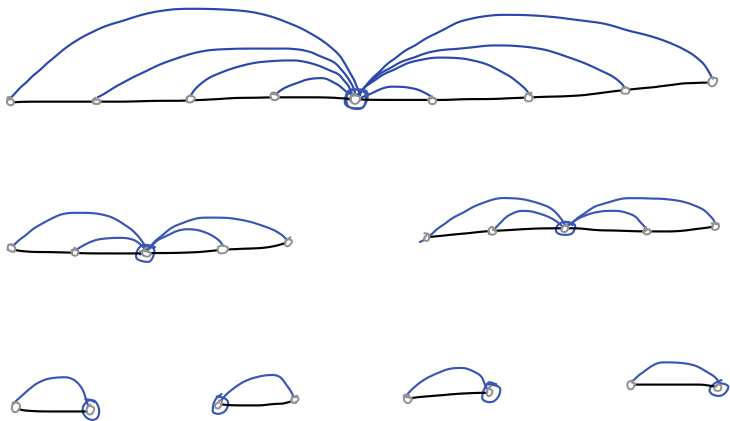


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What **graphs** do have **small hubsets**?

No hope for **dense graphs** :

- **average hub-set size** is at least $\frac{m}{2n}$ as :
- for each **edge** $uv \in E$, we must have $u \in H_v$ or $v \in H_u$.

Planar graphs have covering hub sets of **size** $O(\sqrt{n})$, with a best known lower bound of $\Omega(n^{1/3})$ (unweighted). [Gavoille, Peleg, Pérennes, Raz '04].

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Part I : Do sparse graphs have covering hub sets with $o(n)$ size?

Can we have **sublinear size** for **sparse graphs** ($m = O(n)$)?

Or even **constant degree** graphs?

Best known **upper bound** is $O\left(\frac{n}{\log n}\right)$. [Alstrup, Dahlgaard, Beck, Knudsen, Porah '16] [Gawrychowski, Kosowski, Uznanski '16]

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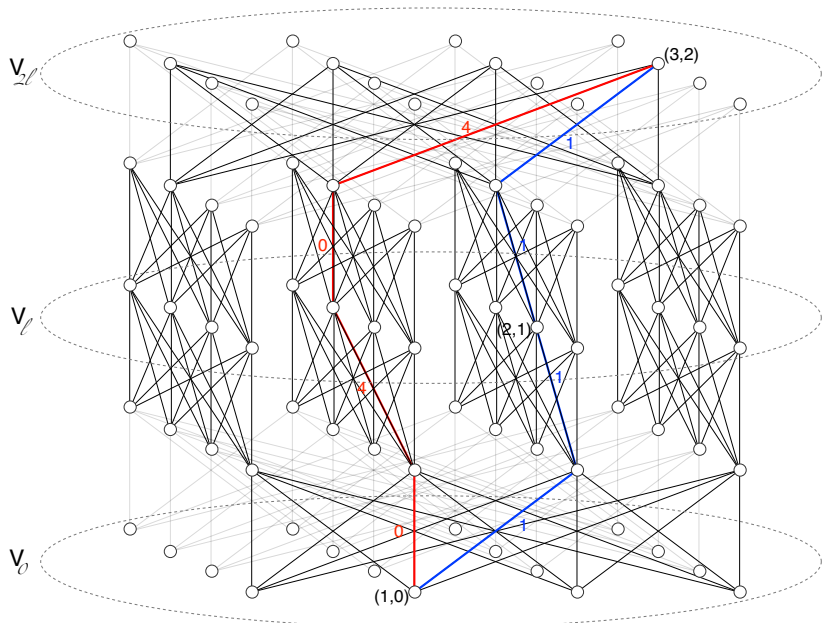
Theorem (Kosowski, Uznański, V. '19)

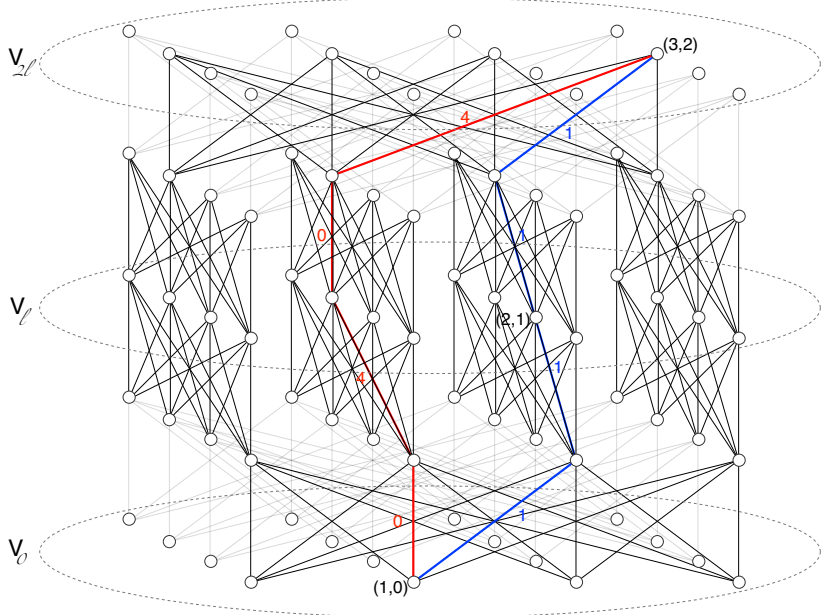
(1) There exists graphs of **degree at most 3** where any collection of **covering hub sets** has **average size** $\frac{n}{2^{O(\sqrt{\log n})}}$.

(2) Any graph has a collection of **hub sets** of $O\left(\frac{n}{\text{RS}(n)^{1/7}}\right)$ **size**

where $2^{\Omega(\log^* n)} \leq \text{RS}(n) \leq 2^{O(\sqrt{\log n})}$ is a number related to Ruzsa-Szemerédi graphs.

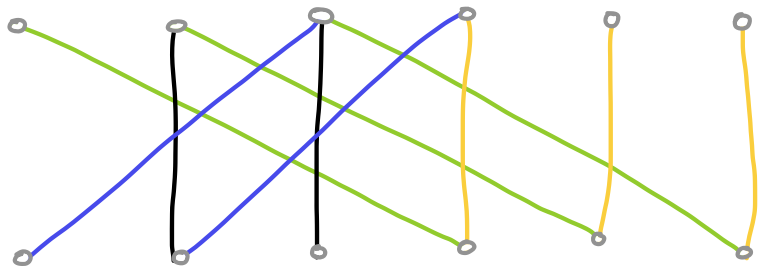
Proof : cov. hub sets of this graph have size $\frac{n}{2^{O(\sqrt{\log n})}}$





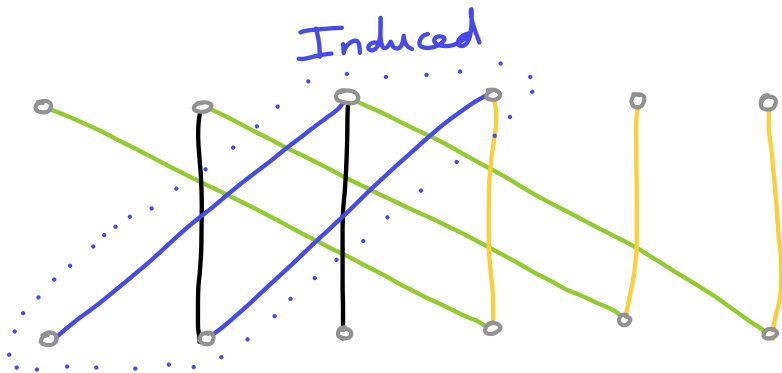
Each V_i is a regular $2l \times \dots \times 2l$ lattice of dim. $l \approx 2\sqrt{\log n}$ (here $l = 2$).
 Edges from V_{i-1} to V_i connect nodes differing on i th coordinate.

Ruzsa-Szemerédi



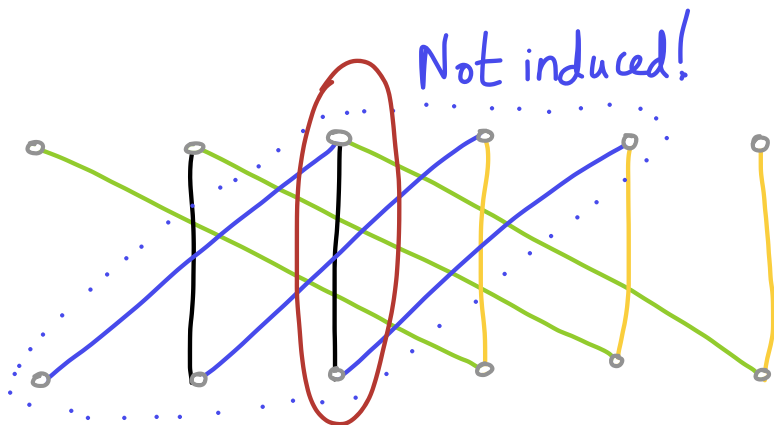
A graph is an **RS-graph** if it can be decomposed into n induced matchings.

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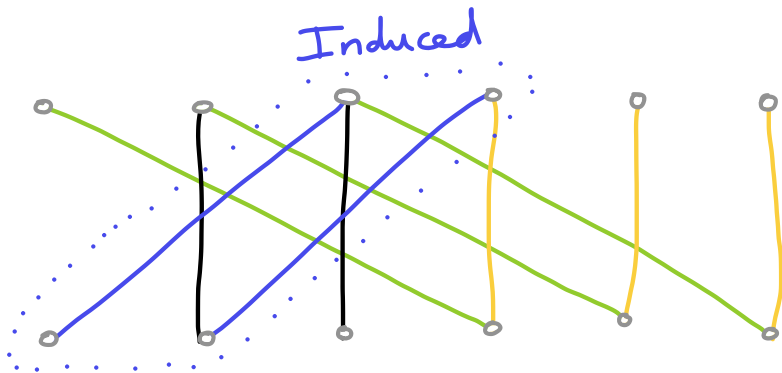
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What are the **densest RS-graphs**?

Theorem ([Ruzsa, Szemerédi '78])

Any **RS-graph** has at most $\frac{n^2}{2^{O(\log^* n)}}$ edges.

(Using dense subsets of $\{1, \dots, n\}$ with no arithmetic triples [Behrend '46] after [Erdős and Turán '36].)

Define **RS(n)** is the largest integer such that there exists an **RS-graph** with n nodes and $\frac{n^2}{\text{RS}(n)}$ edges.

$$2^{\Omega(\log^* n)} \leq \text{RS}(n) \leq 2^{O(\sqrt{\log n})}$$

[Ruzsa, Szemerédi '78] [Elkin '10] [Fox '11]

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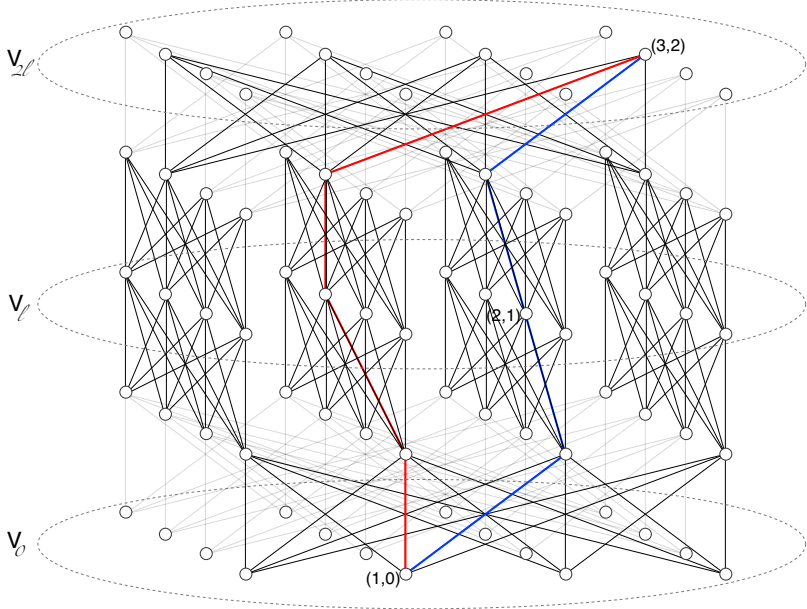
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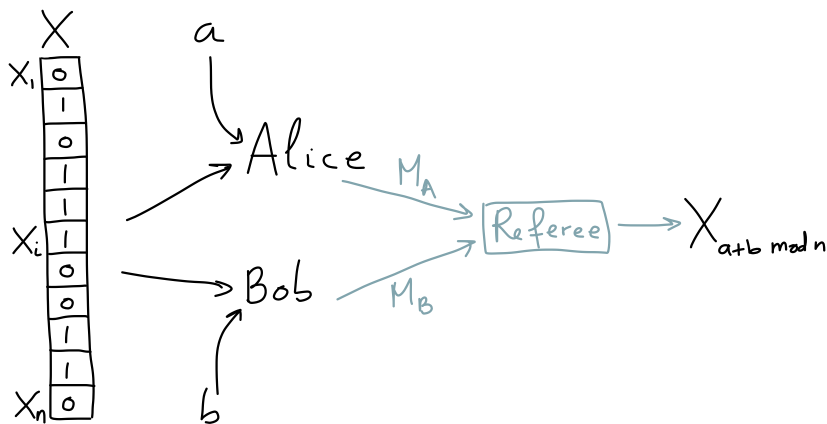
$$G_y^D = \{x_0 z_{2l} \mid y = \frac{x+z}{2} \text{ and } d_G(x, z) = D\} \quad \exists D \text{ s.t. } |\cup_y G_y^D| \geq \frac{n^2}{2^{O(\sqrt{\log n})}}$$

Converse

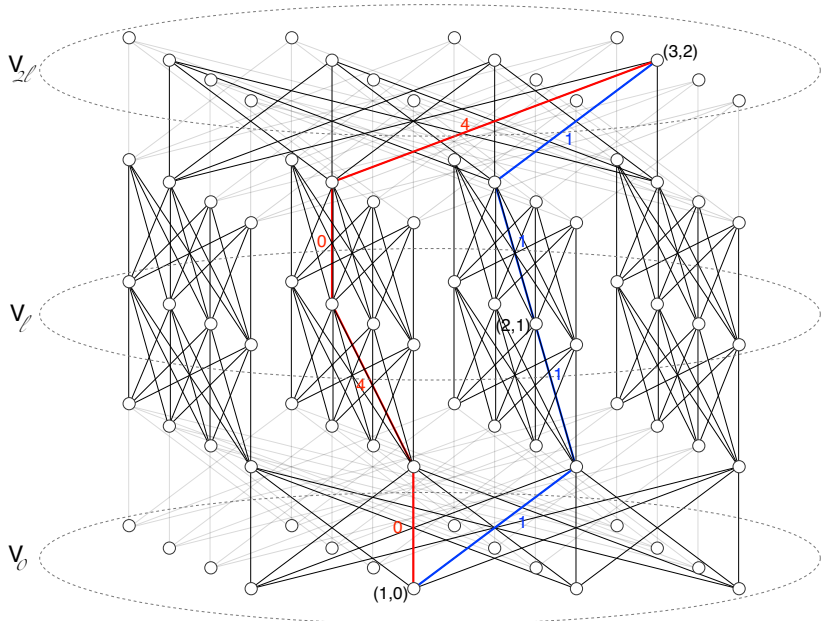
Any cst. deg. graph G has **hub sets** of av. size $O\left(\frac{n}{RS(n)^{1/7}}\right)$.

Idea : use a **vertex cover** of each G_y^D ($VC \leq 2MM$).

Connection with SumIndex problem (comm. complexity)



$$\text{SUMINDEX}(n) = \min_{\text{Encoder}} \max_X |M_A| + |M_B|$$



$G_X = G \setminus \{y_\ell \mid X_y = 0\}$, send $x = 2a, L_{x_0}, z = 2b, L_{z_{2\ell}}$, check $d(x_0, z_{2\ell})$.

Part II : what about practical graphs?

Yes! practical graphs tend to have small covering hub sets.
[Akiba et al. '13] [Delling et al. 14]

What kind of property they have enables that?

Small highway dimension. [Abraham, Fiat, Goldberg, Werneck '10-13]

More generally, small skeleton dimension. [Kosowski, V. '17]

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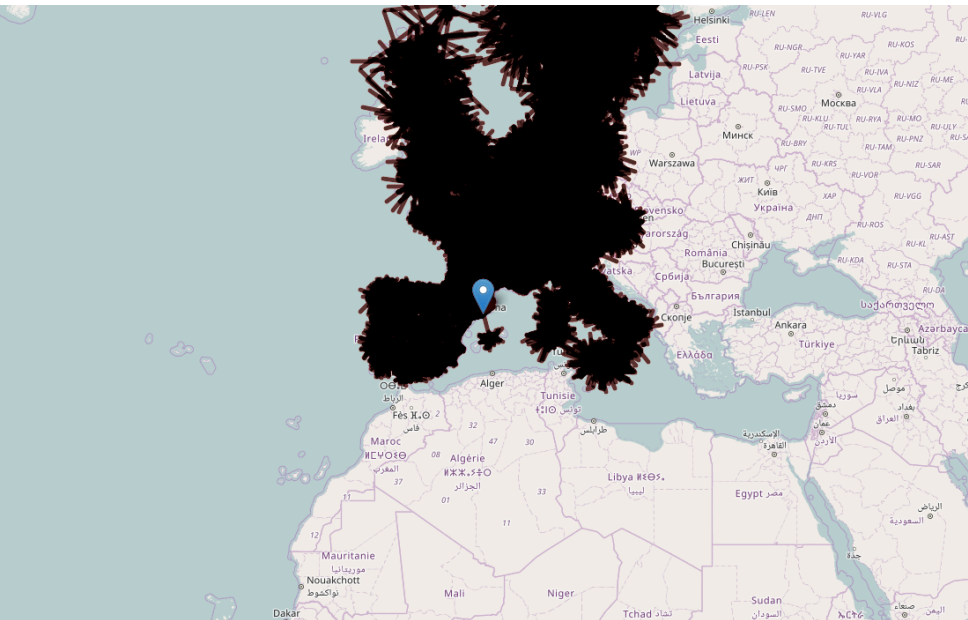
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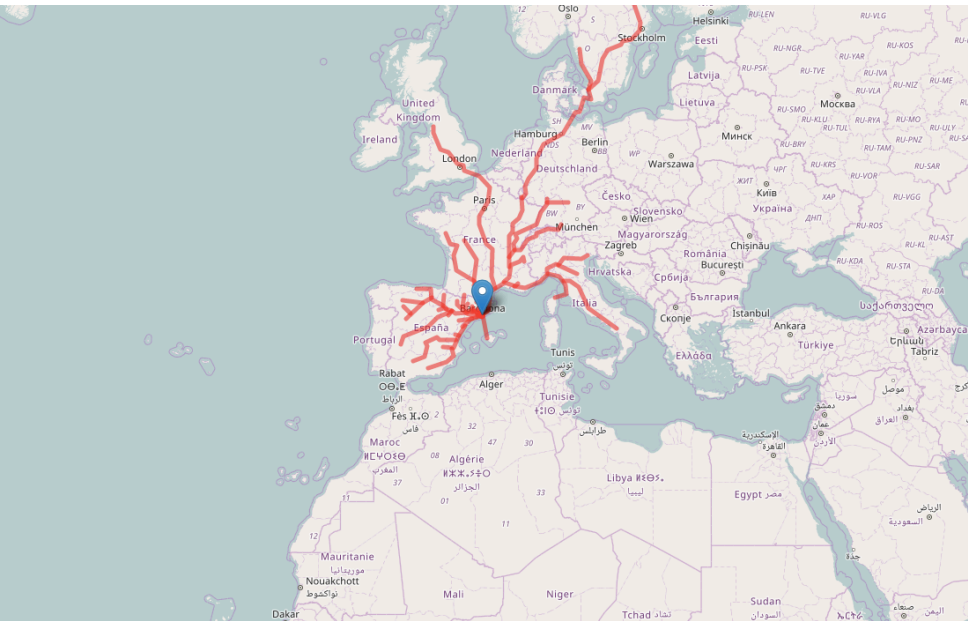
Skeleton dimension

The **skeleton dimension k** of G is the maximum “width” of a “pruned” shortest path tree.

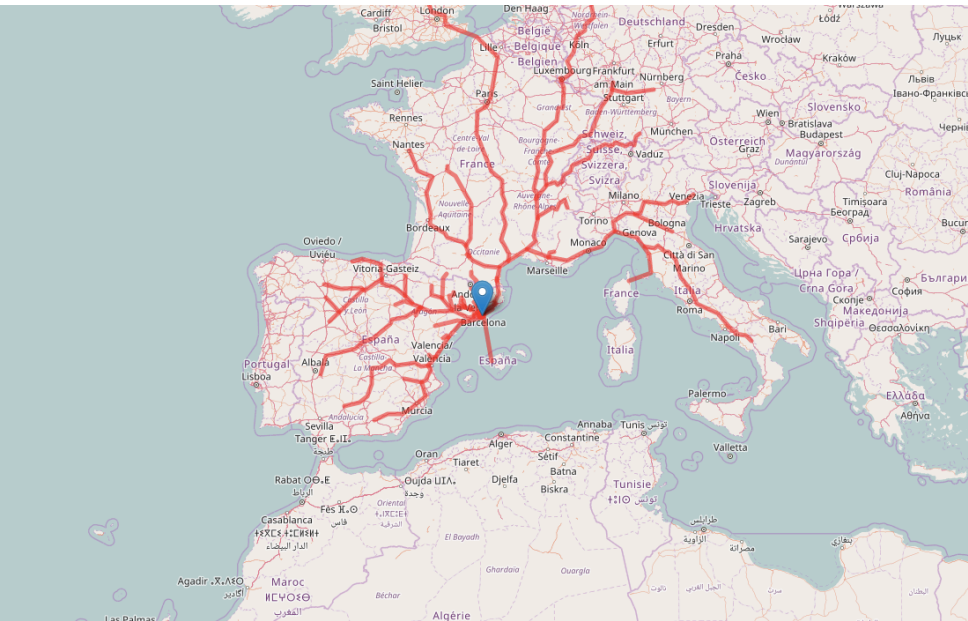
Barcelona shortest path tree



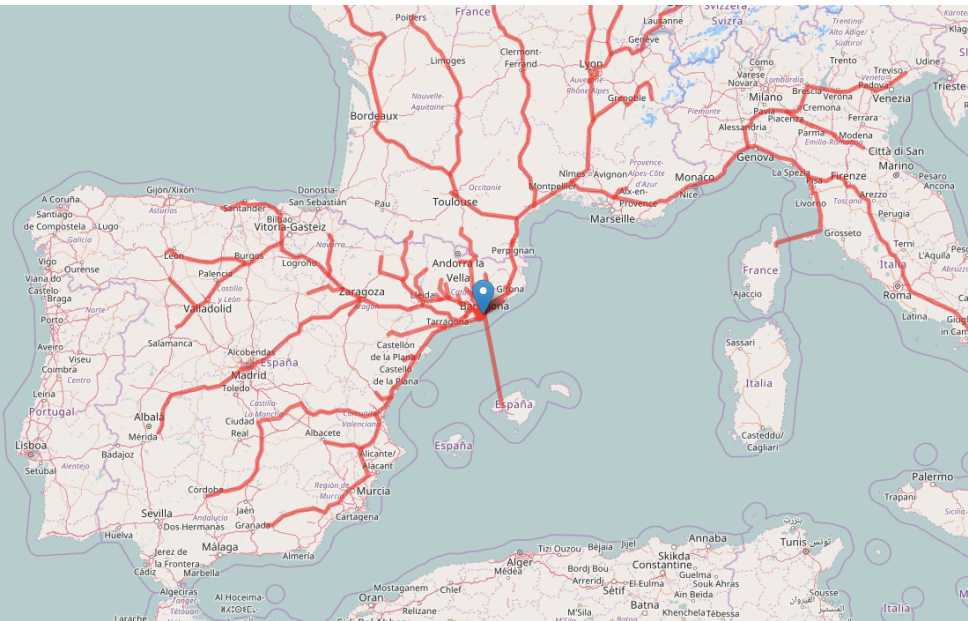
Barcelona tree skeleton : prune last third



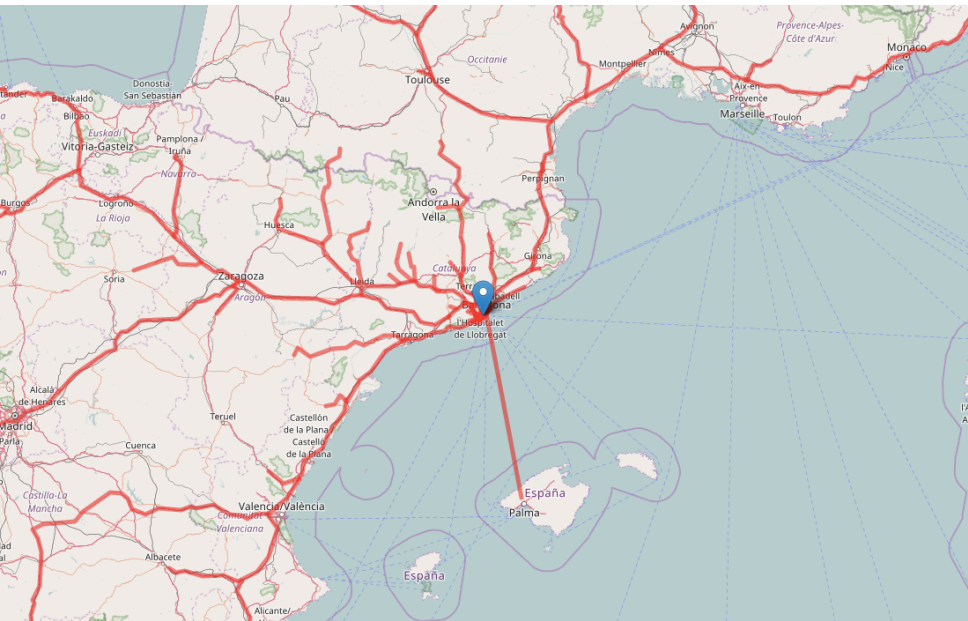
Barcelona tree skeleton : prune last third



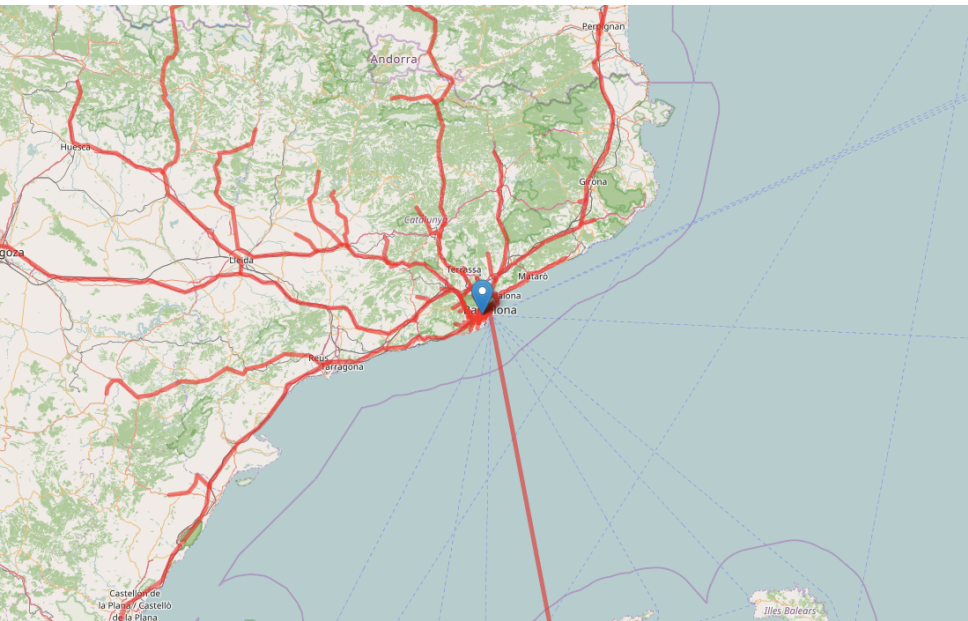
Barcelona tree skeleton : prune last third



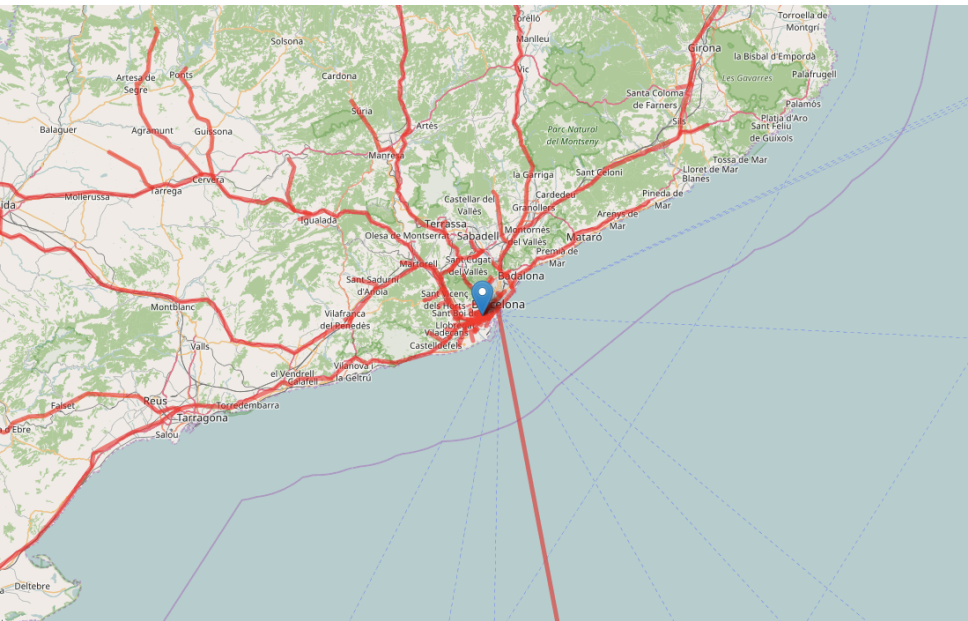
Barcelona tree skeleton : prune last third



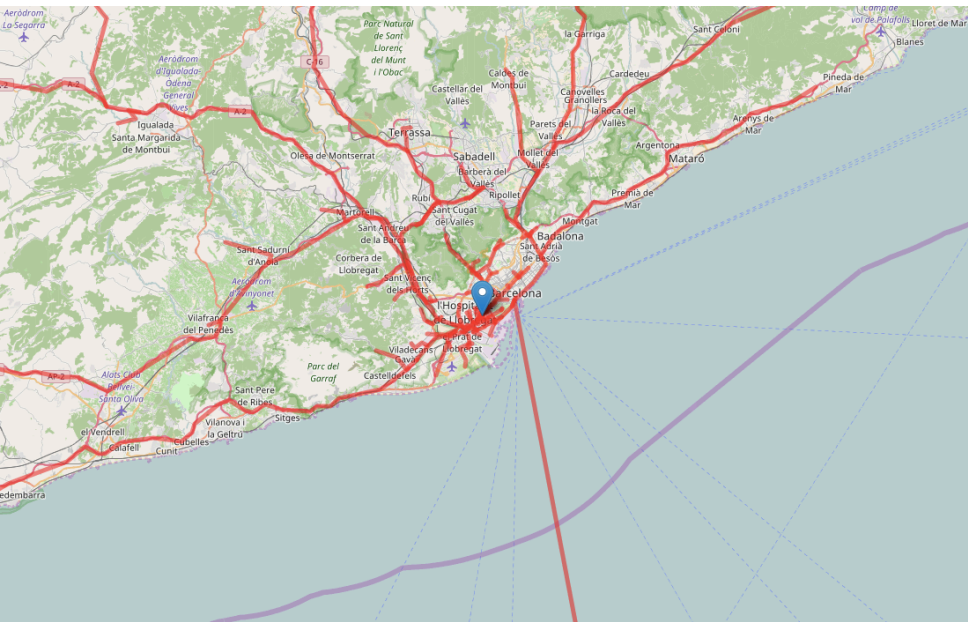
Barcelona tree skeleton : prune last third



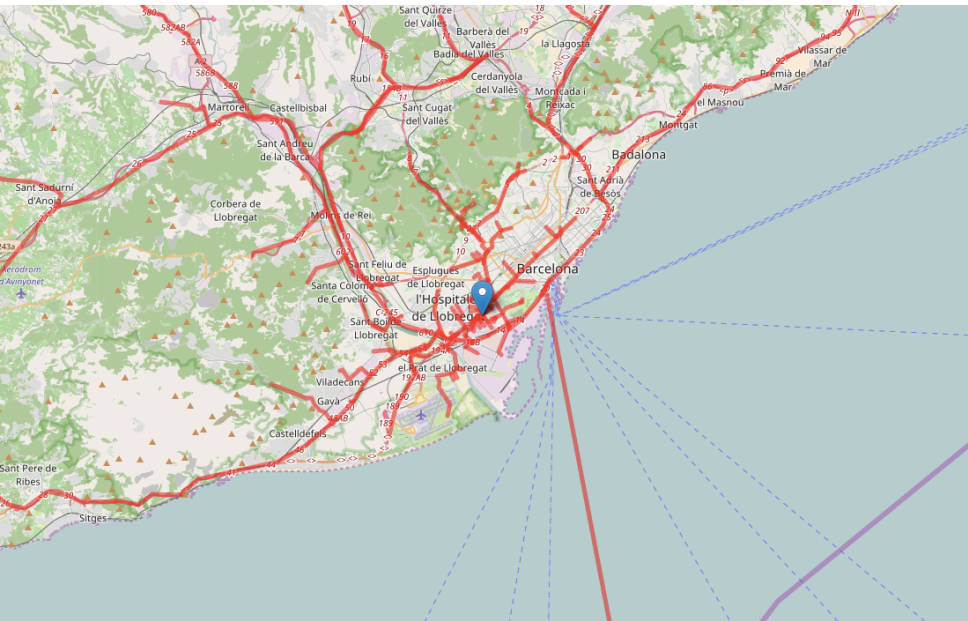
Barcelona tree skeleton : prune last third



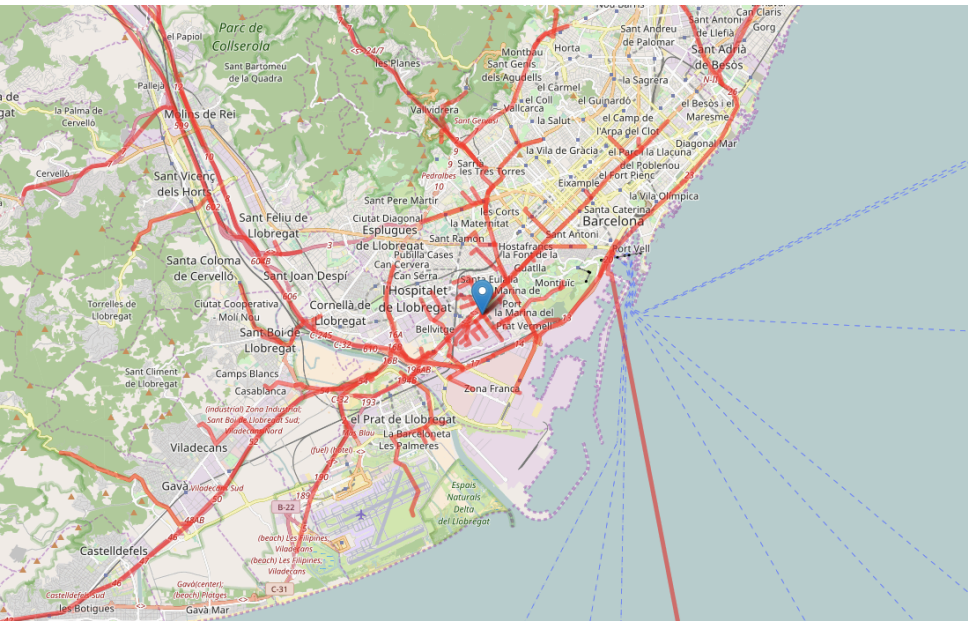
Barcelona tree skeleton : prune last third



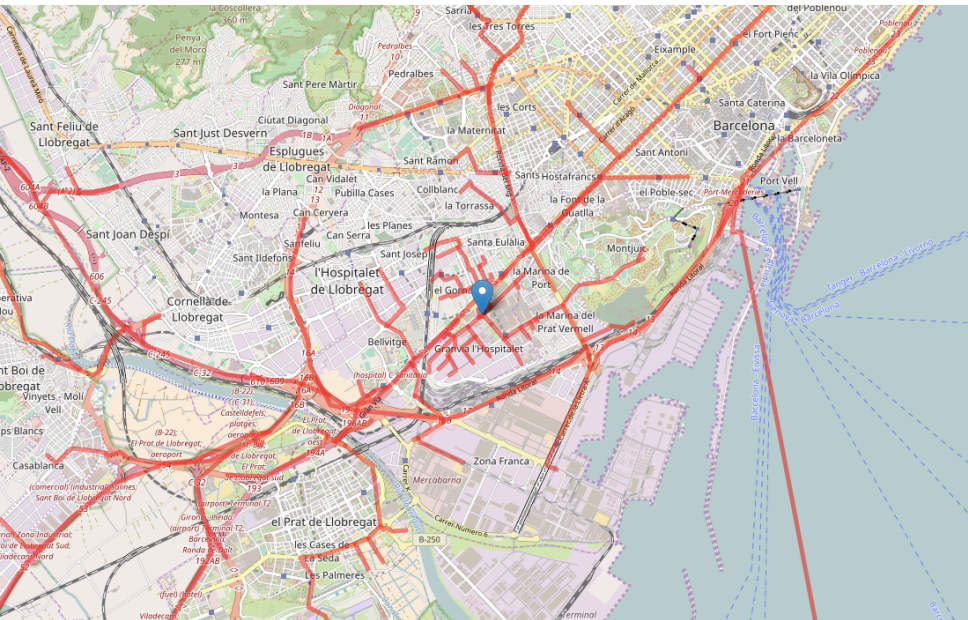
Barcelona tree skeleton : prune last third



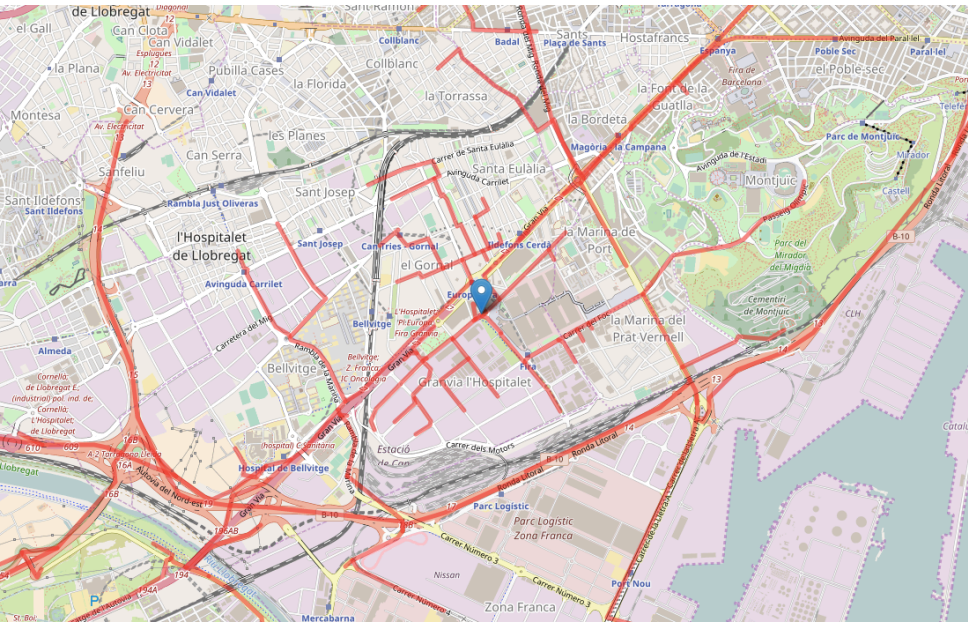
Barcelona tree skeleton : prune last third



Barcelona tree skeleton : prune last third



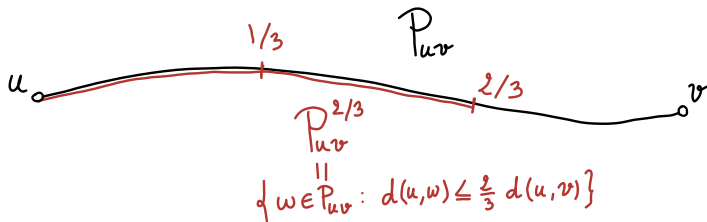
Barcelona tree skeleton : prune last third



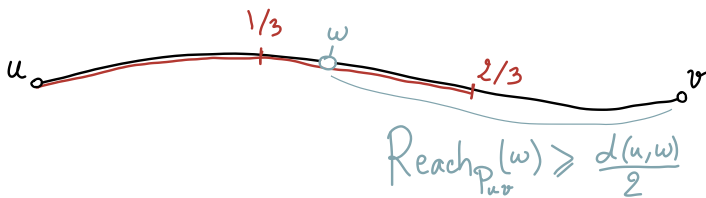
Tree skeleton



Tree skeleton

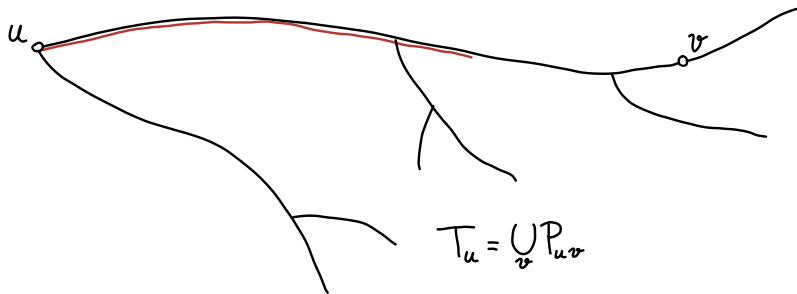


Tree skeleton

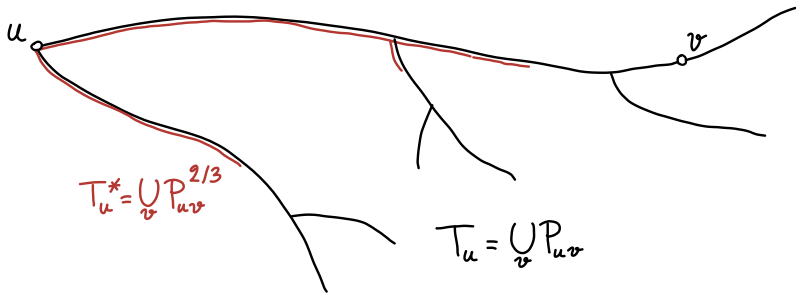


$$\text{Reach}_{P_{uv}}(w) \geq \frac{d(u,w)}{2}$$

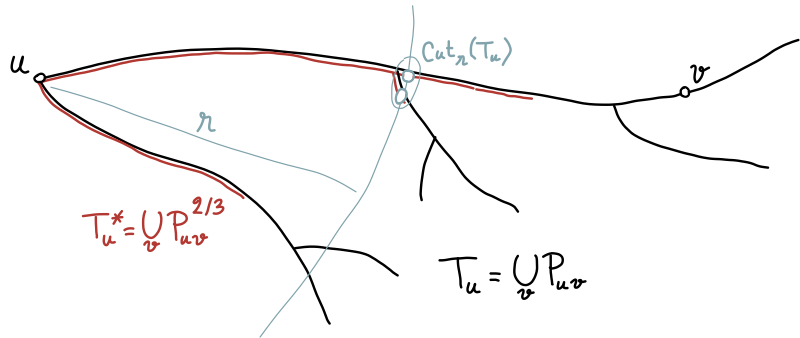
Tree skeleton



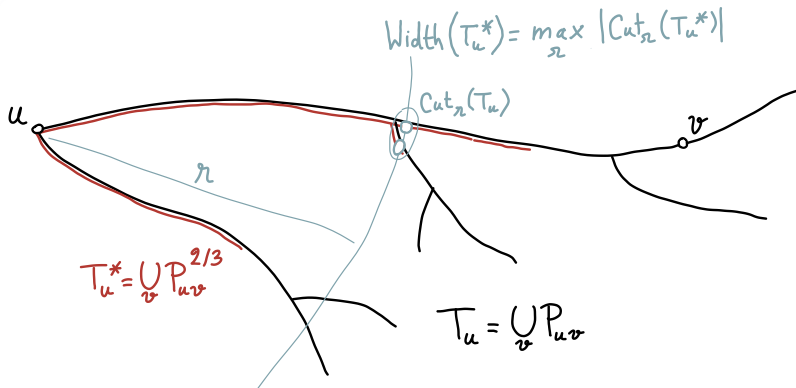
Tree skeleton



Tree skeleton

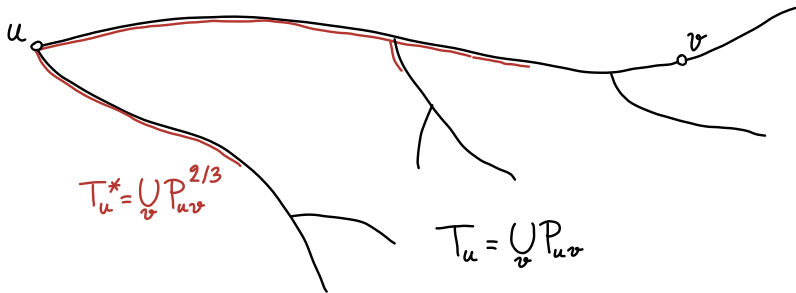


Tree skeleton



Tree skeleton

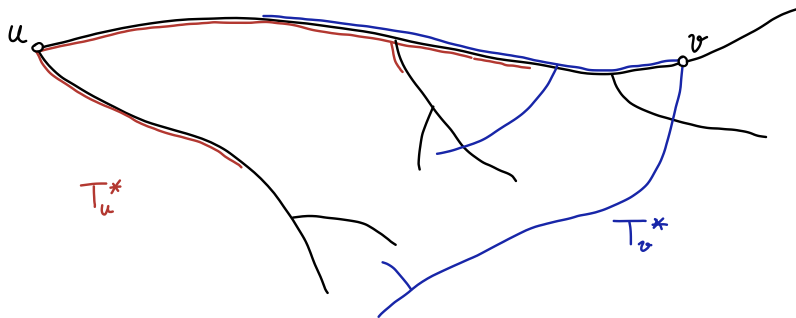
skel. dim. $k = \max_u \text{Width}(T_u^*)$



Theorem (Kosowski, V. 2017)

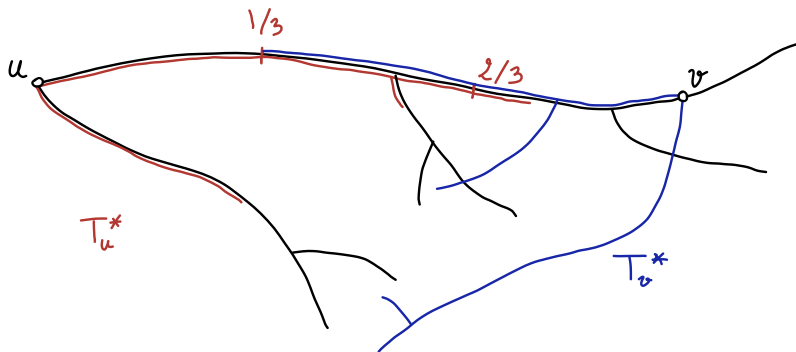
Given a graph G with skeleton dimension k and diameter D , a simple random sampling technique allows to find in polynomial time hub sets with size $O(k \log D)$ on average and maximum size $O(k \log \log k \log D)$ with high probability.

Hub set selection : random sampling



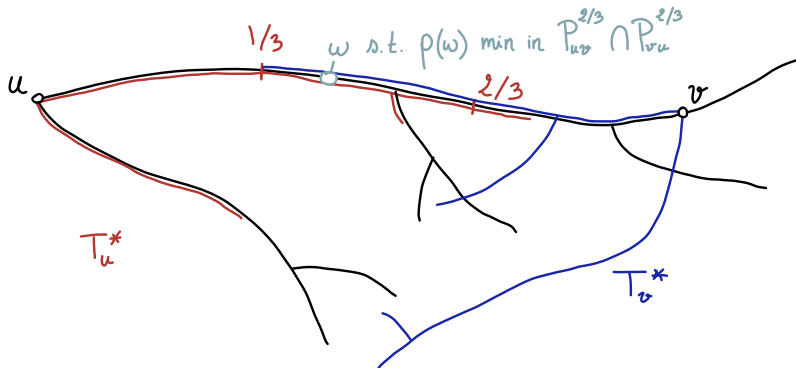
The probability to select a node x is $\propto \frac{1}{d(u,x)}$.

Hub set selection : random sampling



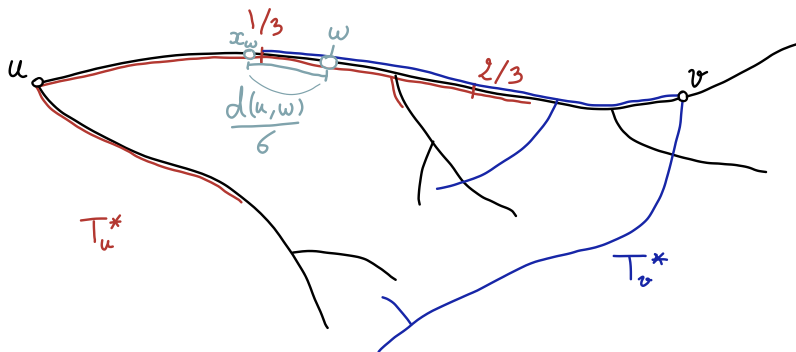
The probability to select a node x is $\propto \frac{1}{d(u,x)}$.

Hub set selection : random sampling



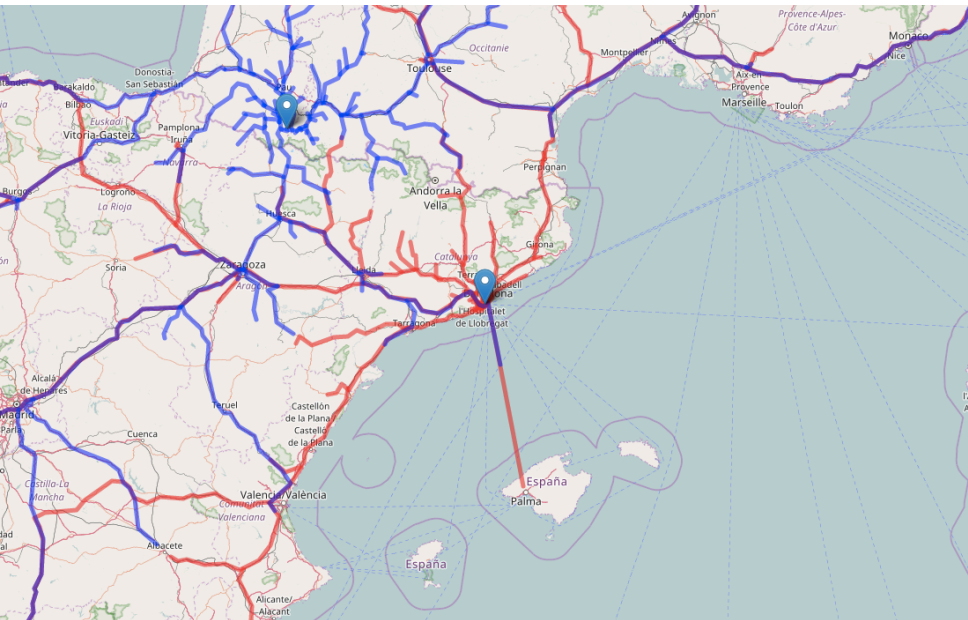
The probability to select a node x is $\propto \frac{1}{d(u,x)}$.

Hub set selection : random sampling

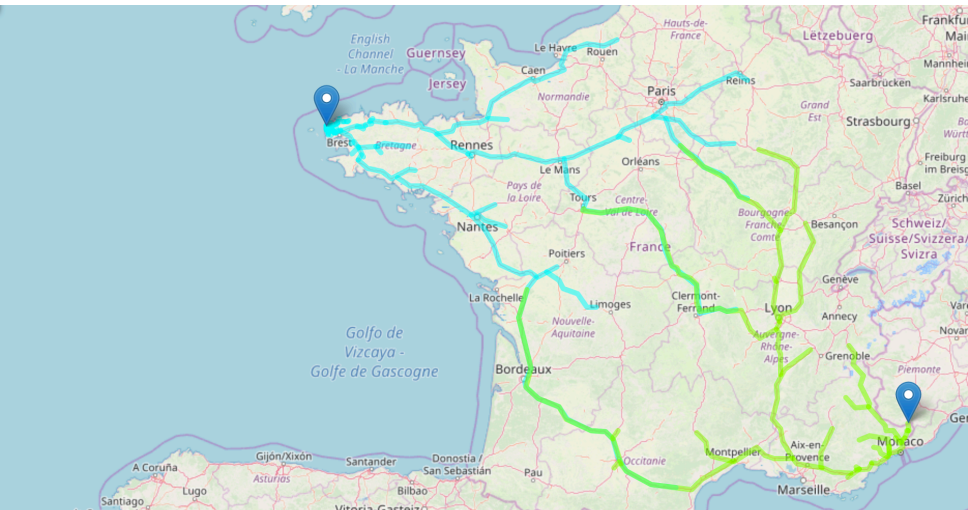


The probability to select a node x is $\propto \frac{1}{d(u,x)}$.

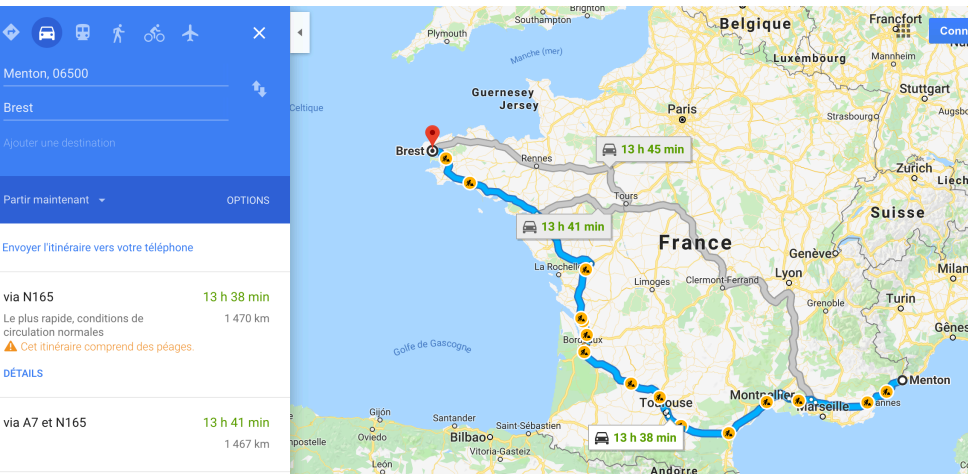
Road networks : two tree skeletons



What ...maps do?



What ...maps do?



What ...maps do?

De Menton à Brest

Options

Menton

Brest

Ajouter une destination

Partir maintenant

OK

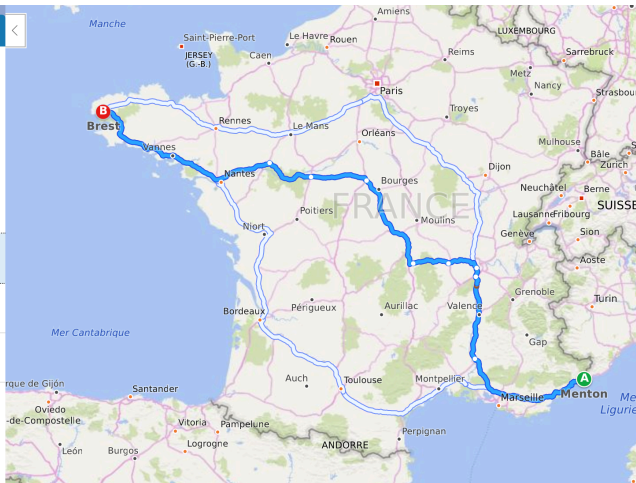
16:08 h min	Trafic modéré Par E80, E60	Retard de 2 h 44 min <i>Itinéraire avec péage</i>	1468 km
16:12 h min	Trafic modéré Par E80, E72	Retard de 2 h 43 min <i>Itinéraire avec péage</i>	1471 km
16:26 h min	Trafic modéré Par E15, E50	Retard de 2 h 39 min <i>Itinéraire avec péage</i>	1509 km

Imprimer

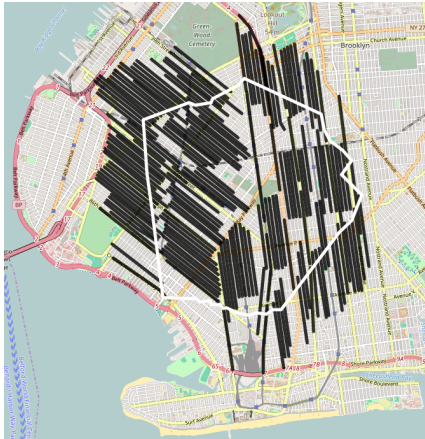
Menton

Quitter Promenade du Soleil / D6007
en direction de Traverse Saint-Michel

0,6 km



Highway vs skeleton in Brooklyn

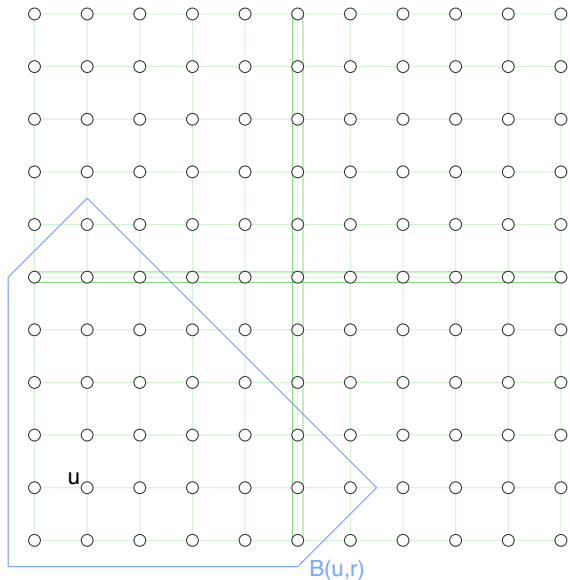


Packing of 172 paths



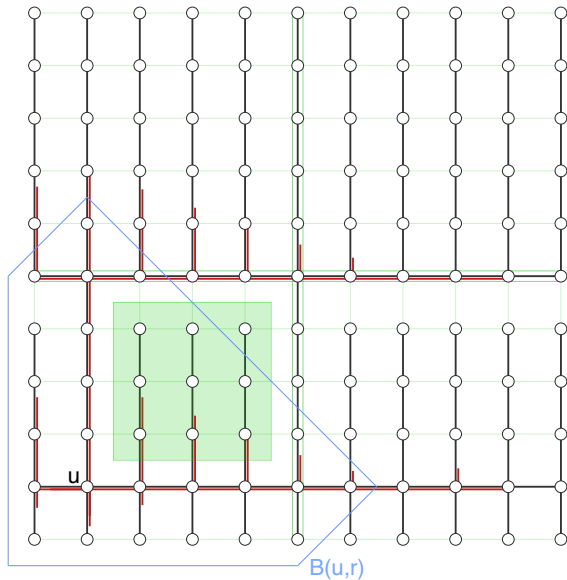
Skeleton width 48

Skeleton dimension of grids



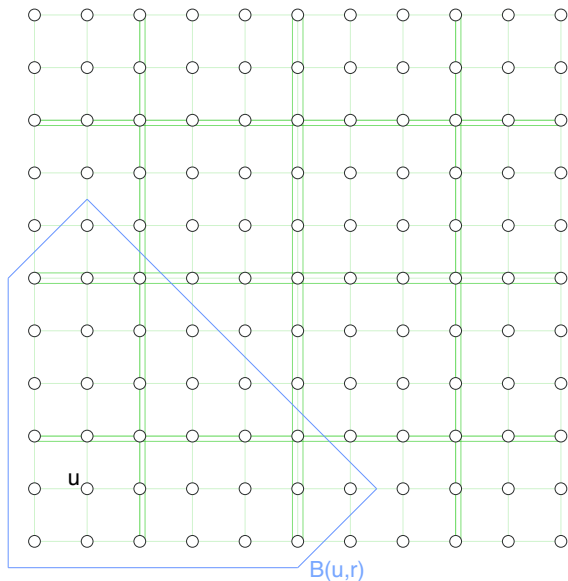
$$k = \Theta(\log n)$$

Skeleton dimension of grids



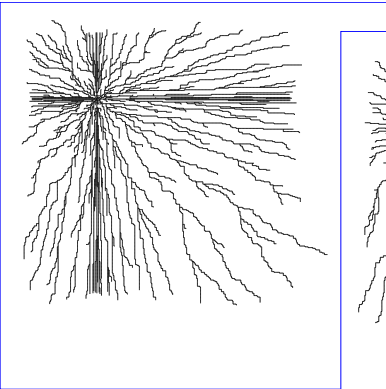
$$k = \Theta(\log n)$$

Skeleton dimension of grids

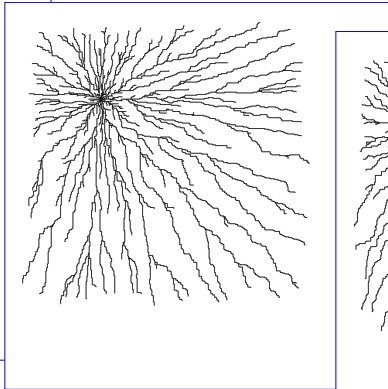


$$k = \Theta(\log n)$$

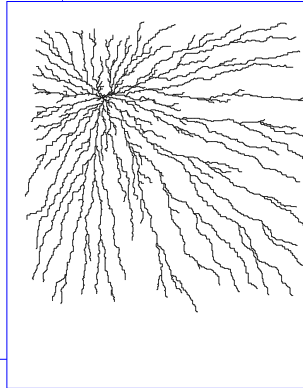
Open : random grid



$k = 70$



$k = 49$ (fpp [1, 4])



$k = 49$ (prob 2/3)

Related to **first-passage percolation** [Licea, Newman, Piza '96]
[Aldous '14].

Part III : what about 3 hops?

3-hopset of a path



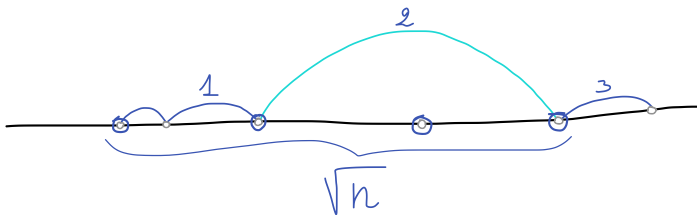
3-hopset of a path



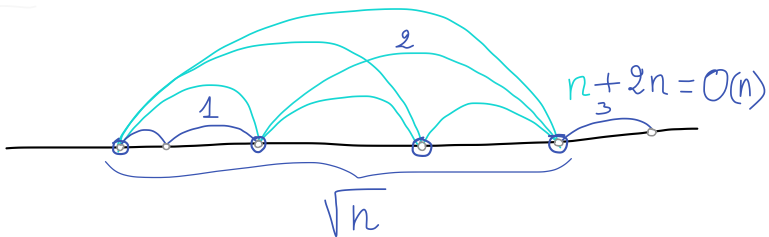
3-hopset of a path



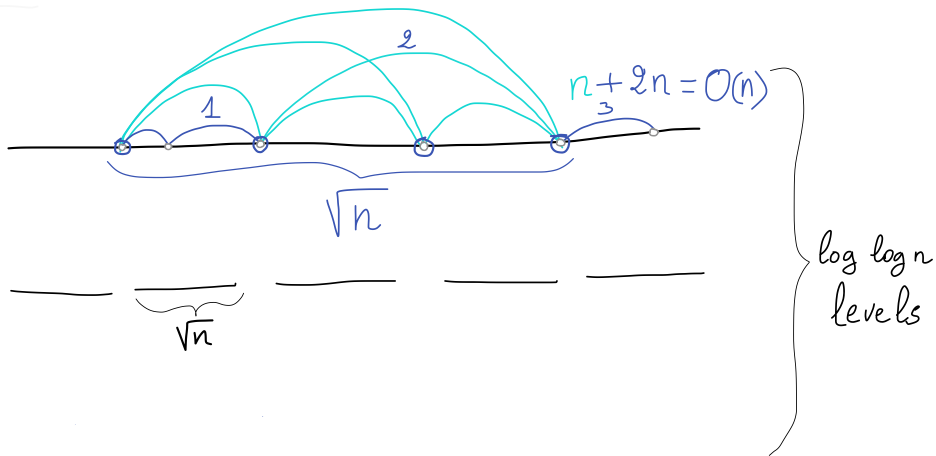
3-hopset of a path



3-hopset of a path



3-hopset of a path



3-hopset distance oracle

Store $x, d_G(u, x)$ for $x \in N_{13}(u)$ ($2 \log \log n$ per node).

Store *middle links* in a hashtable H_2 ($O(n \log \log n)$ size).

Query for $d_G(u, v)$: best 3-hop path length is

$$\min_{x \in N_{13}(u), y \in N_{13}(v), xy \in H_2} d_G(u, x) + d_G(x, y) + d_G(y, v)$$

($O((\log \log n)^2)$ time).

3-hopset distance oracle

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($O((\log \log n)^2)$ time).

Theorem (Kosowski, Gupta, V. '19)

For a unique-shortest-path graph with **skeleton dimension k** and average **link length $L \geq 1$** , there exists a randomized construction of a **3-hopset distance oracle** of size $|H| = O(nk \log k(\log \log n + \log L))$, which performs distance queries in expected time $O(k^2 \log^2 k(\log^2 \log n + \log^2 L))$.

End of the story?

What is the **skeleton dimension** of a **random grid**?

Improve lower-bounds on **sparse** graphs for **general** distance oracles.

What graphs have **covering hub sets** of size $O(1)$?

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Thanks.