

# spanning trees that preserve network distances

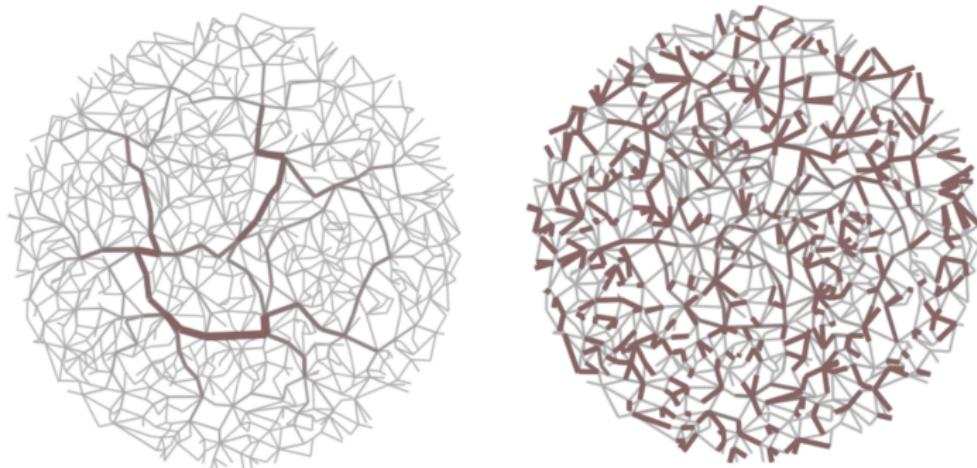
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Networks '21

# motivation

## network abstraction with backbones and skeletons

(left) high-betweenness backbone and (right) high-salience skeleton (Grady et al., 2012)



# spanning trees

## network abstraction with **spanning trees**

consider connected unweighted network on  $n$  nodes

spanning tree is **connected** with  $n$  nodes and  $n - 1$  edges

trees lack clustering  $\langle C \rangle = 0$  in contrast to convex skeletons (Šubelj, 2018)

are spanning trees also **small-world** and **scale-free**?

$\langle d \rangle \sim \log n$  in small-world networks and  $p_k \sim k^{-\gamma}$  in scale-free networks

in random trees almost surely  $\langle d \rangle \sim \sqrt{n}$  (Rényi and Szekeres, 1967)

# algorithms

## Kruskal's algorithm

1. start with forest of trees each consisting of single node
2. merge trees until only one remains (using minimum edges)

## Prim's algorithm

1. start with single tree consisting of (random) seed node
2. add one new node at each step (using minimum edge)

## breadth-first search

1. start with single tree consisting of (random) seed node
2. add new neighbors of node at each step (in breadth-first order)

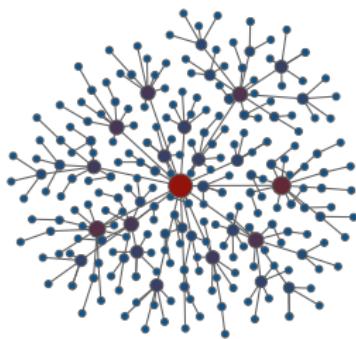
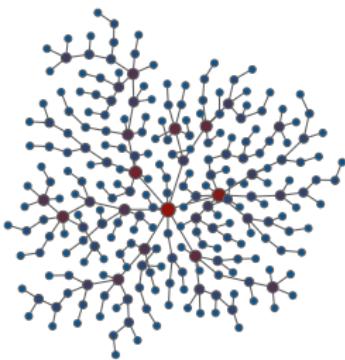
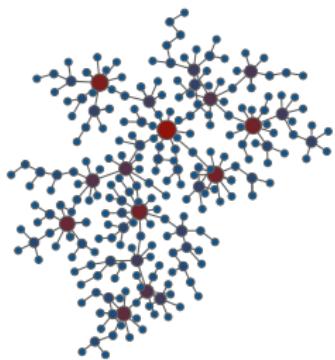
## other algorithms

depth-first search, Sollin's algorithm etc.

# wiring diagrams

## examples of spanning trees of random graph

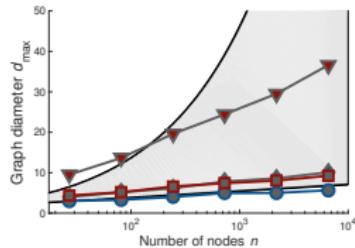
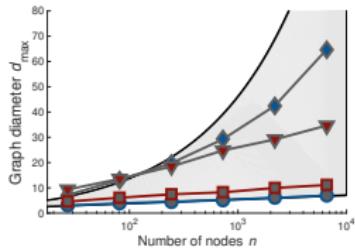
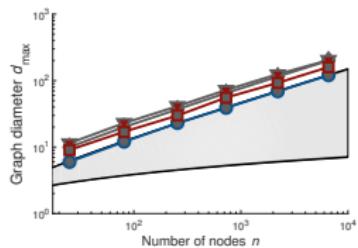
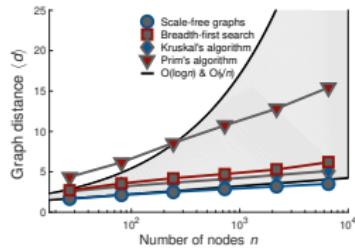
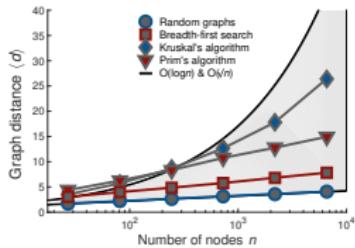
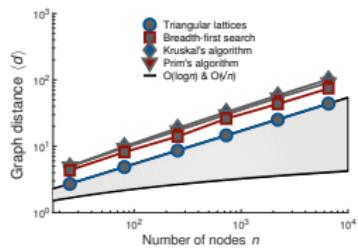
(left) Kruskal's algorithm, (middle) Prim's algorithm and (right) breadth-first search



# distance $\langle d \rangle$ and diameter $d_{max}$

only BFS retains scaling of  $\langle d \rangle$  and  $d_{max}$  in synthetic graphs

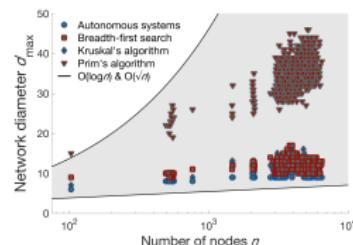
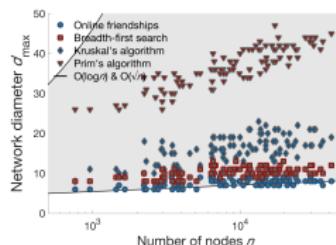
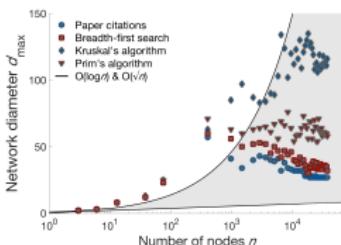
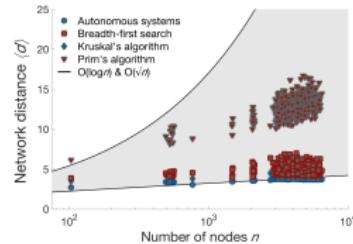
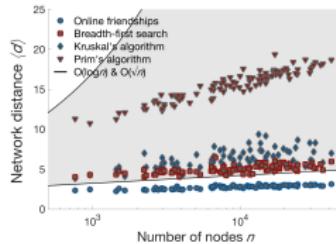
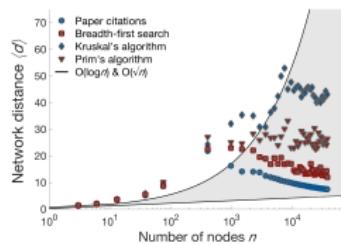
$\langle d \rangle \sim \sqrt{n}$  in lattices,  $\langle d \rangle \sim \log n$  in random graphs and  $\langle d \rangle \sim \frac{\log n}{\log \log n}$  in scale-free graphs



# distance $\langle d \rangle$ and diameter $d_{max}$

only BFS retains scaling of  $\langle d \rangle$  and  $d_{max}$  in real networks

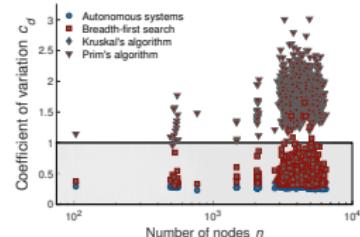
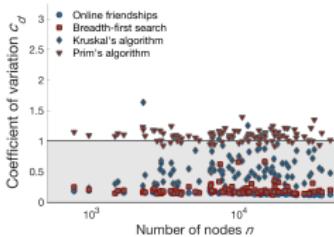
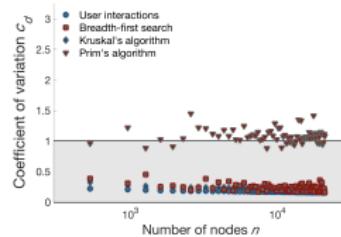
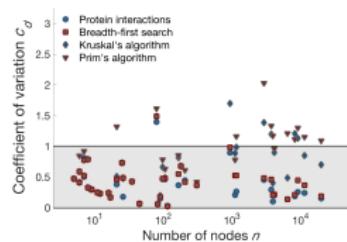
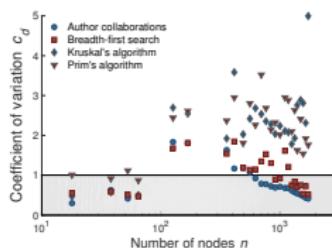
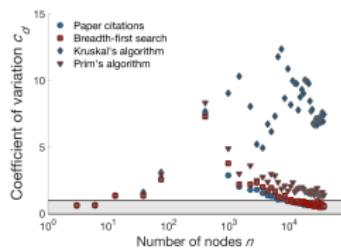
$\langle d \rangle \sim \log n$  in small-world networks and  $\langle d \rangle \sim \log \log n$  in ultra small-world networks



# distance distribution $p_d$

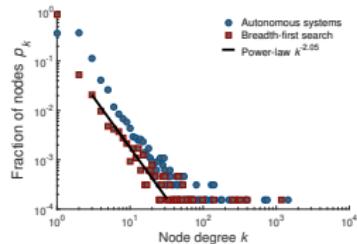
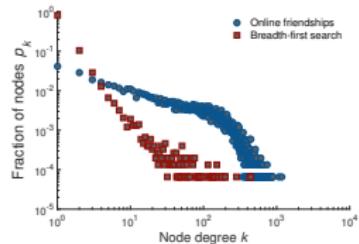
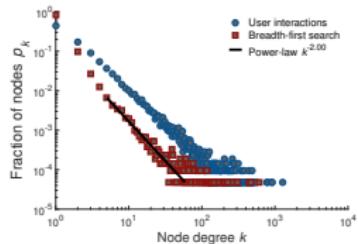
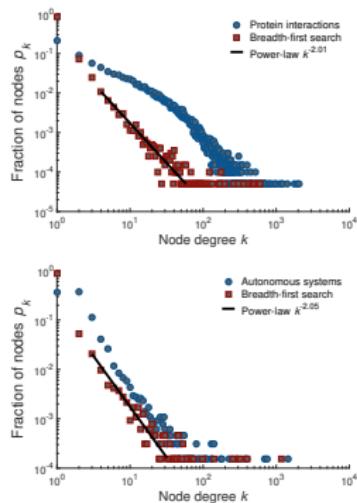
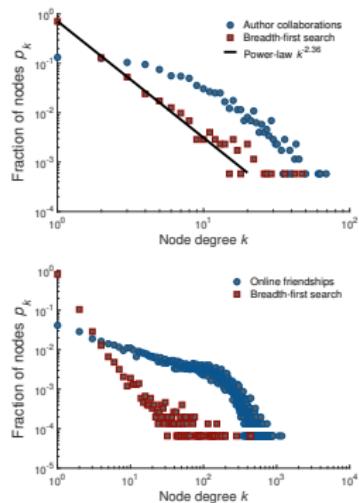
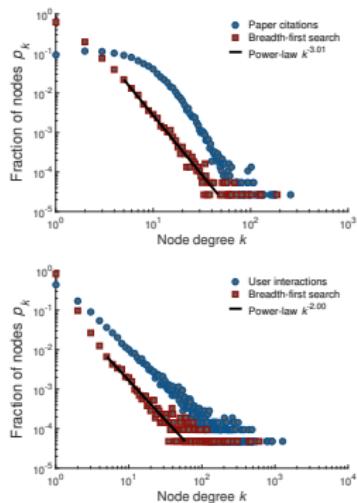
only BFS retains low-variance  $p_d$  in real networks

$$\text{coefficient of variation } c_d = \frac{\sigma_d}{\langle d \rangle} < 1 \text{ in (ultra) small-world networks}$$



# degree distribution $p_k$

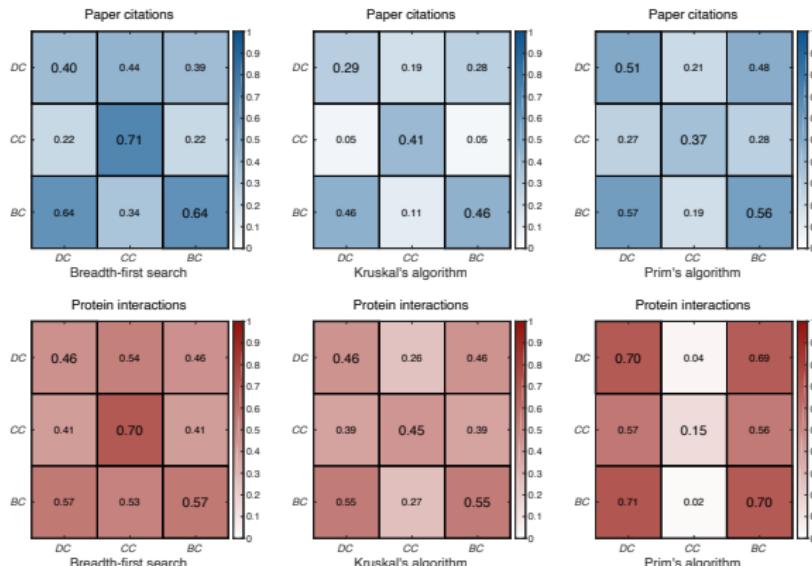
only BFS power-law  $p_k \sim k^{-\gamma}$  in most cases (Clauset et al., 2009)



# node importance

BFS best retains closeness centrality in real networks

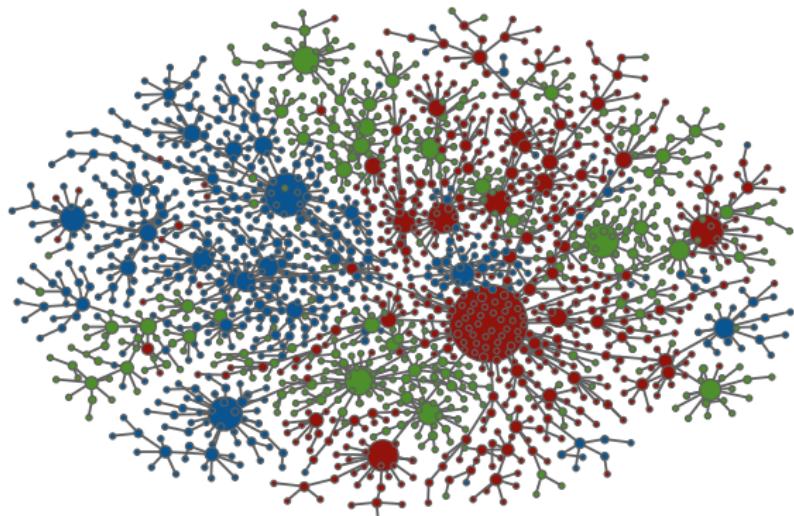
correlations between node degree ( $DC$ ), closeness centrality ( $CC$ ) and betweenness centrality ( $BC$ )



# network visualization

## BFS spanning tree of author collaborations in Slovenia

natural sciences (red), engineering (green), medical sciences (blue) and other



# conclusions

spanning trees **small-world**  $\langle d \rangle \sim \log n$  and **scale-free**  $p_k \sim k^{-\gamma}$

trees lack clustering  $\langle C \rangle = 0$  in contrast to convex skeletons (Šubelj, 2018)

**use breadth-first search for unweighted networks!**

use Prim's or Kruskal's algorithm only for weighted networks

are spanning trees actually **balanced trees**?

balanced tree data structure ensures  $\langle d \rangle \approx \log n$  by definition

how to measure that tree is approximately balanced?

# thank you!

Šubelj (2021) Algorithms for spanning trees of unweighted networks. *PeerJ Comput. Sci.*, under review.

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