### Maximum Rigid Components as Means for Direction-based Sensor Network Localization

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Body-Joint Framework

Layout

Results & Conclusion

### Sensor Network Localization



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### Sensor Network Localization



 $\gg$  what is it? (reconstruction)



Results & Conclusion

### Possible Inputs of Localization Problems

- Distances, e.g. from signal strength  $\gg$ 
  - >> uses common hardware capability
  - $\gg$  realization problem is  $\mathcal{NP}$ -hard
- Directions, e.g. from antenna arrays
  - $\gg$  needs special hardware
  - $\gg$  realization problem is in  $\mathcal{P}$
- Radio model, e.g. (quasi-)unit-disk-graph
  - relies on assumptions on radio propagation
  - $\gg \mathcal{NP}$ -hard even in combination with distances or directions







### Possible Inputs of Localization Problems

#### Directions, e.g. from antenna arrays

- $\gg$  needs special hardware
- $\gg$  realization problem is in  $\mathcal{P}$



- >> We take a closer look on the algorithmics of the direction-based localization problem









### Localization Agenda

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Given the communication graph with edge directions,

- >> What parts of the network can uniquely be reconstructed?
- $\gg$  What is an efficient way to identify these parts?
  - $\gg$  Can we take advantage of the sparsity and/or high locality?
  - $\gg$  To what extent can we use distributed techniques?
- $\gg$  How can we get the layout then?





#### Uniqueness

- Possible up to scaling/rotation  $\gg$
- >> Known problem in *rigidity theory* 
  - >> uniqueness coincides with (parallel) rigidity
  - ≫ we are looking for maximum rigid components



#### Parallel Rigidity [Laman 70 / Whiteley 96]

A graph G = (V, E) is (parallelly) rigid in the plane iff it contains edges  $E' \subseteq E$  with |E'| = 2|V| - 3 such that for all  $E'' \subset E'$ 

 $|E''| \leq 2|V(E'')| - 3$ 





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Results & Conclusion

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  - $\gg$  hard to distribute, runtime in  $\mathcal{O}(n^2)$





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- $\gg$ More intuitive techniques for graphs with high locality:





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  - $\gg$  edge-overlapping
  - node-overlapping  $\gg$





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Greedy Techniques

Body-Joint Framework

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  - $\gg$  all combinations

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Self-organizing Sensor-Actuator-Networks

- $\gg$  faster, easier to distribute, but. . .
- they do not end with *maximum* rigid components.





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Stuck?

- Is the price of being greedy to end here?
- Can we find maximum rigid components in such *body-joint frameworks*?
  - previous work [Moukarzel 96] solves only special cases







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# Rigidity in Body-Joint Frameworks

 $\gg$  Intuition in graphs:

A *minimal* subgraph with enough edges is rigid.

Intuition with bodies and joints: A minimal set of bodies using enough nodes redundantly is rigid.

 $\gg$  Node redundancy wrt. a set of bodies  $\mathcal S$  :

$$\operatorname{rd}_{\mathcal{S}}(v) := \sharp \{ S \in \mathcal{S} \mid v \in \mathcal{S} \} - 1$$

$$\gg$$
 Example:  $\mathrm{rd}_{v}(\mathcal{S})=1$ ,  $\mathrm{rd}_{u}(\mathcal{S})=2$ 







### Rigidity in body-joint frameworks cont'd

#### Theorem [Our paper]

Let  ${\mathcal S}$  be a set of bodies. If  ${\mathcal S}$  is minimal with

$$2\sum_{v\in V} \operatorname{rd}_{\mathcal{S}}(v) \ge 3(|\mathcal{S}|-1)$$
,

the bodies from  $\mathcal{S}$  together are rigid.

» Example:  

$$2\sum \operatorname{rd}_{\mathcal{S}}(v) = 18 = 3(|\mathcal{S}| - 1)$$







### Algorithm

Iteratively grow a set of maximally rigid bodies!

- $\gg$  repeatedly add a body to a set  $\mathcal{S}^{\star}$
- $\gg$  check if  $\mathcal{S}^{\star}$  contains a rigid subset
- merge rigid subsets as soon as  $\gg$ possible







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 $\gg$  How can we efficiently test for rigid subsets?



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Results & Conclusion

### Bipartite Rigidity Flow Network

- $\gg$  Maintain a flow network:
  - $\gg$  nodes are bodies and joints
  - $\gg$  arcs are inclusions
  - $\gg$  support is twice the redundancy
  - $\gg$  demand and capacities 3 resp. 2
- ➢ Flow network is updated after adding a body to S<sup>\*</sup>

 $\gg$  maximum flows reveal rigid sets

- Candidates are *closures* over each neighbored body in the residual graph
- > Flows can be reused, bounding the time to  $O(n + l \log l + k^2)$  for k bodies and l joints (overall)







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Introduction	Uniqueness	Greedy Techniques	Body-Joint Frameworks	Layout	Results & Conclusion
Lay	out				

- $\gg$  Finding a consistent realization can be formulated as an LP
- For rigid subgraphs, solving a system of linear equations suffices
- Solving independend subproblems first reduces costs dramatically



 $\gg$   $\Rightarrow$  always keep a realization for all rigid bodies!



### Experimental Results on Geometric Graphs



node density (nodes per unit square)

- >> Maximum rigid components demand less density.
- $\gg$  Greedy techniques really reduce the number of bodies.
- $\gg$  Layout subproblems almost always have constant size.
  - $\gg$  costs of layout become negligible







 $\gg\,$  Direction-based localization is the only case with

- $\gg$  tight characterization of uniqueness
- $\gg$  polynomial-time realization
- ≫ Our approach
  - solves the problem of finding rigid components in body-joint frameworks
  - $\gg$  allows to use fast & intuitive techniques first
  - $\gg$  is adapted to geometric graphs (at asymptotically no cost)
  - removes the bottleneck by iteratively solving the layout problem





# Thank you for your attention.