

Recurring Part Arrangements in Shape Collections

Youyi Zheng



Daniel Cohen-Or

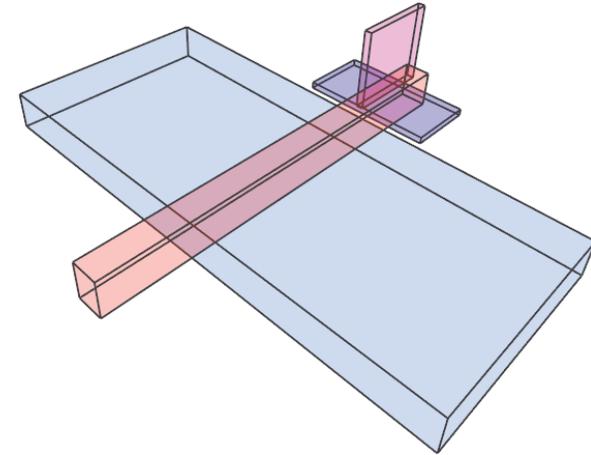


Melinos Averkiou

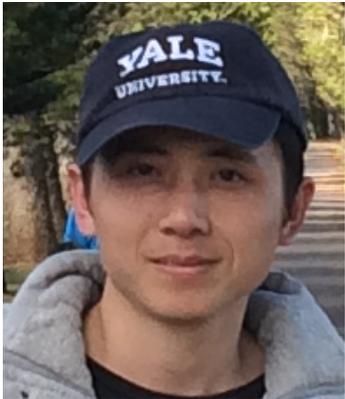


Niloy J. Mitra





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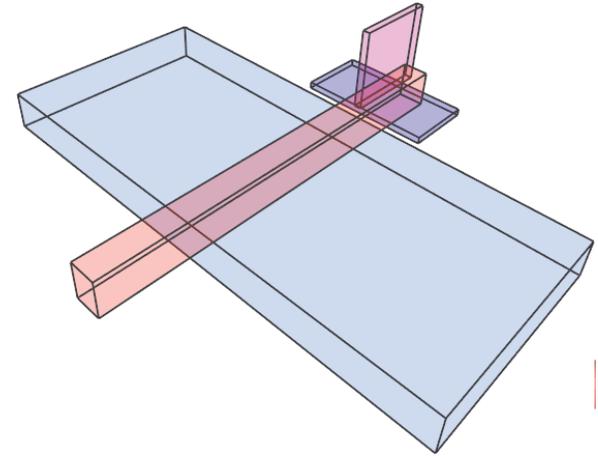
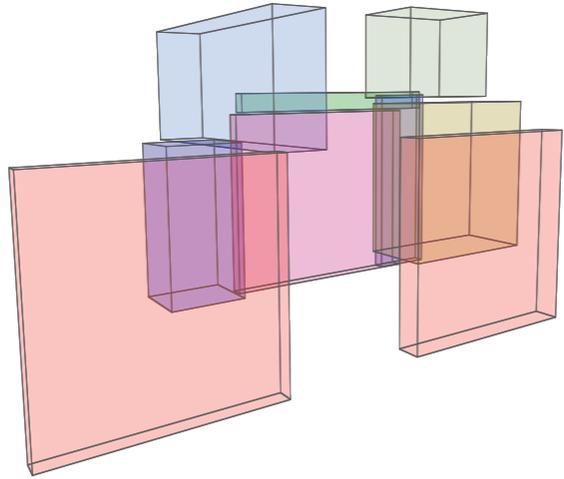


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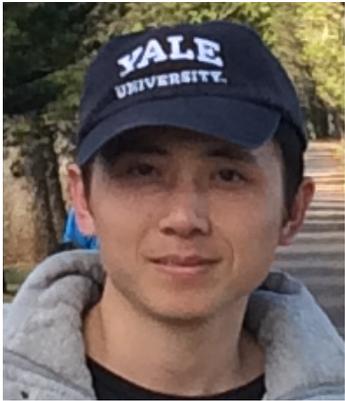


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Data → *Knowledge*?

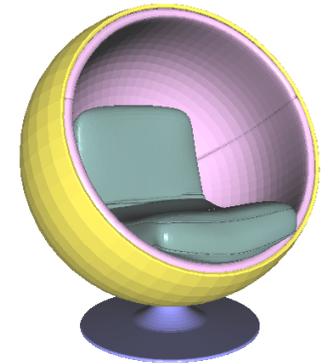
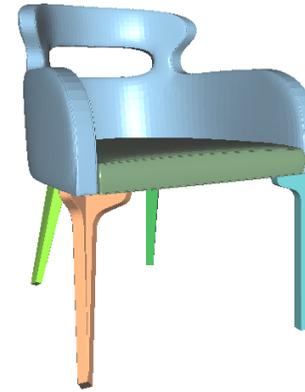
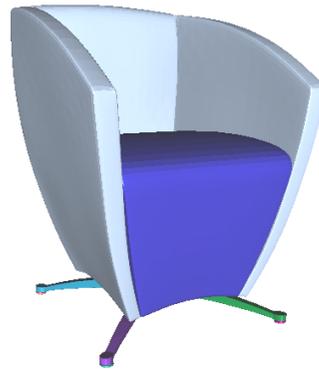
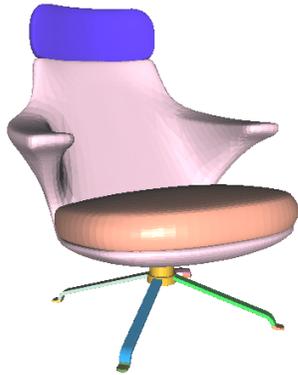


Data → *Knowledge*?

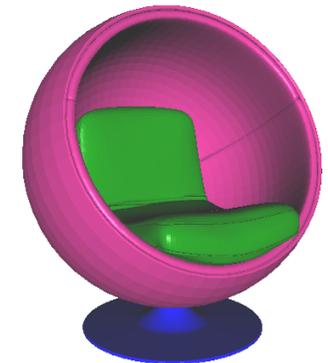
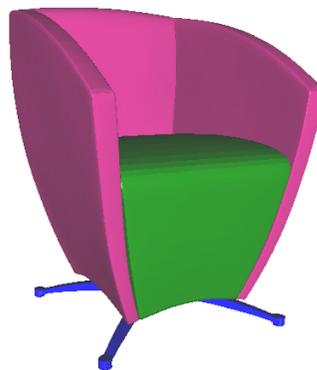
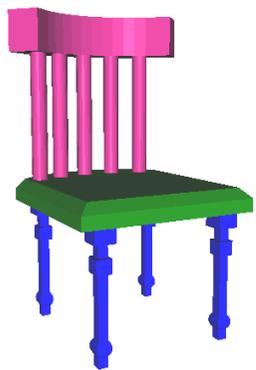
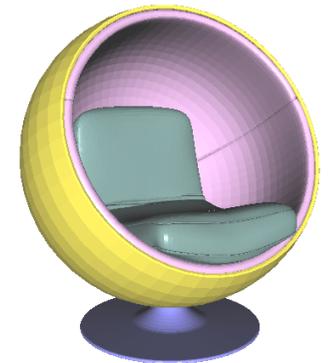
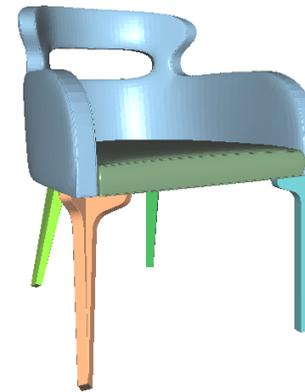
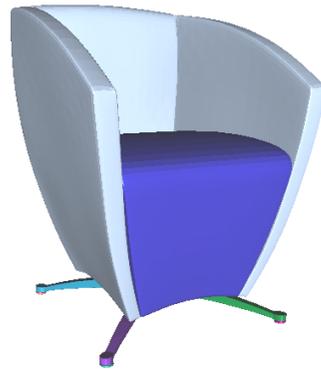
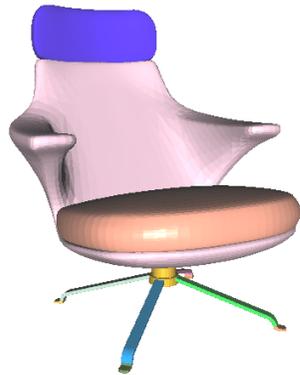


geometric differences can hide functional correlation

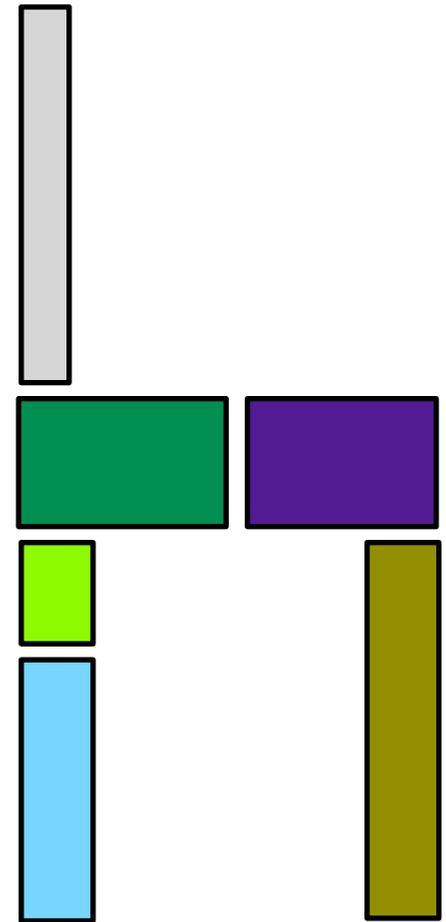
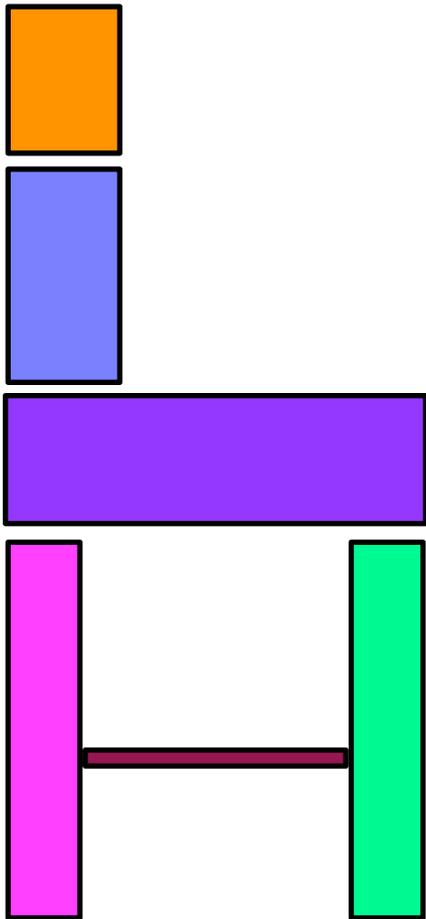
Goal



Goal

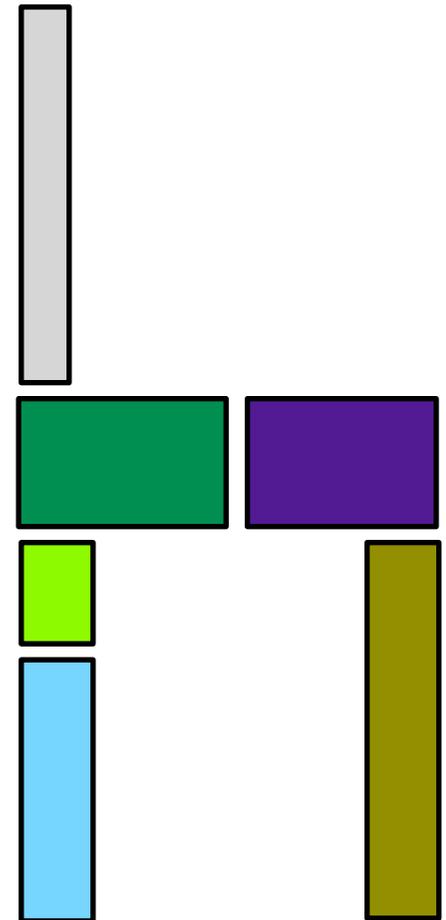
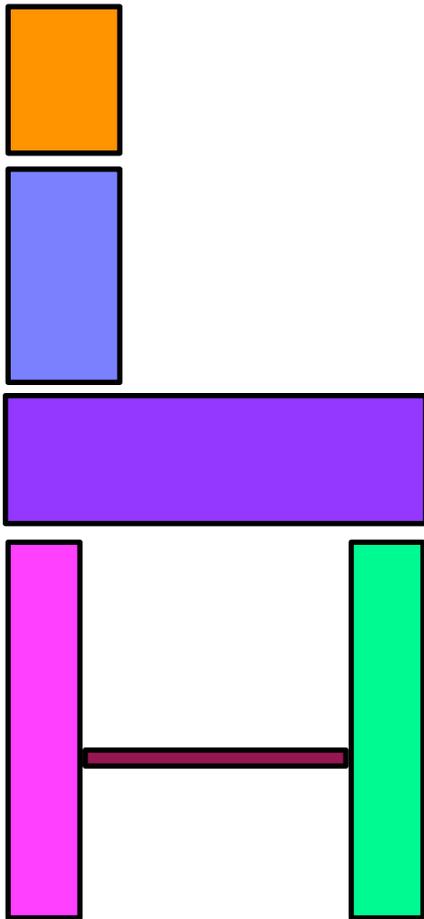


Where is the Challenge?



Where is the Challenge?

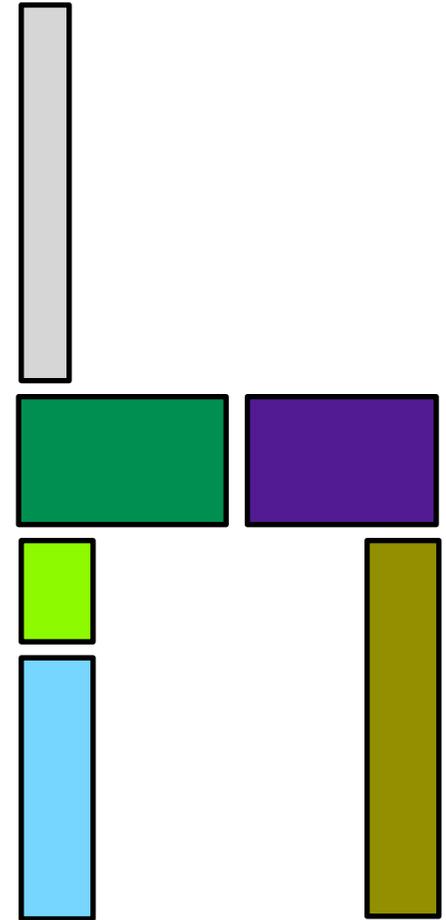
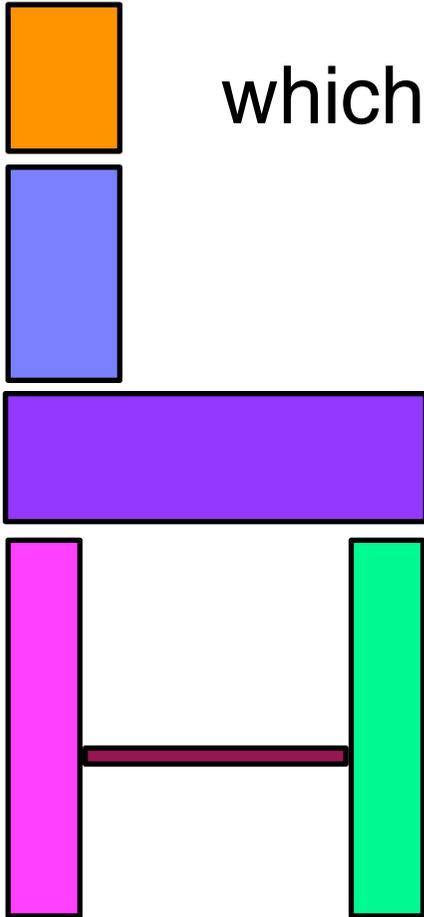
how to compare parts?



Where is the Challenge?

how to compare parts?

which parts are in correspondence?

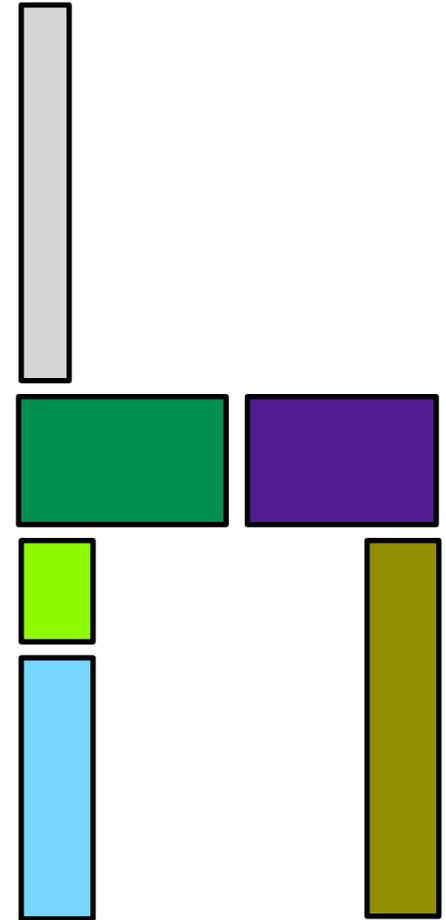
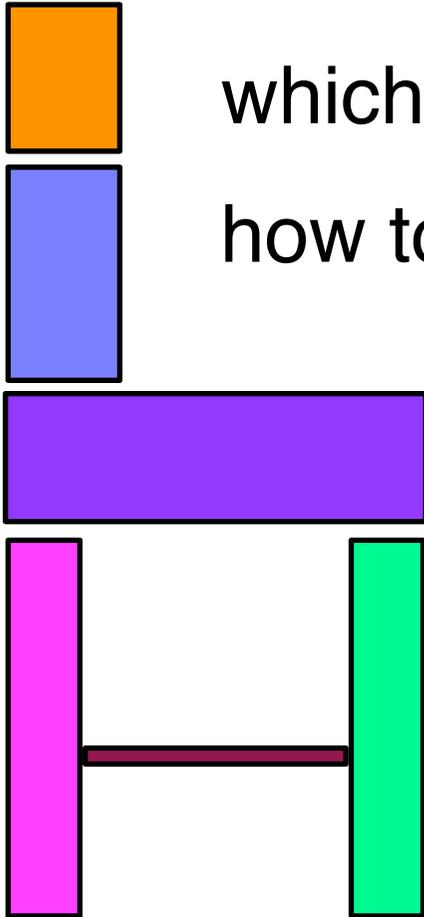


Where is the Challenge?

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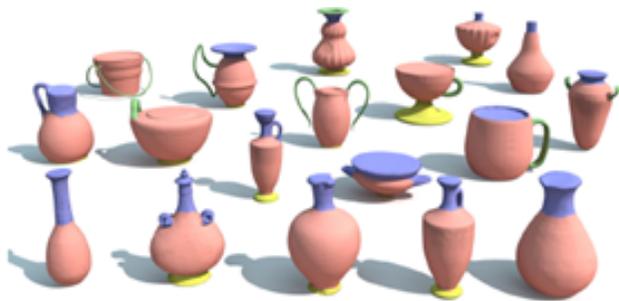
how to merge the parts?



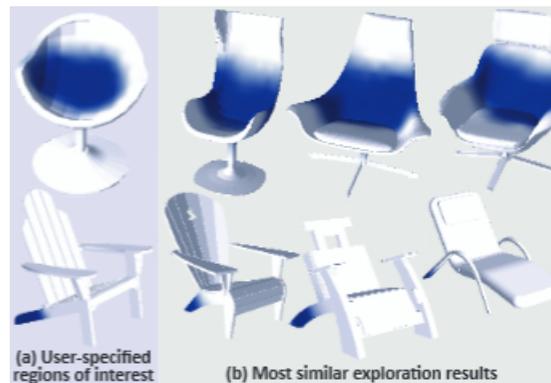
- Introduction
- Related Works
- Main Idea
- Algorithm
- Results
- Limitations and Future work

Relation to Co-segmentation

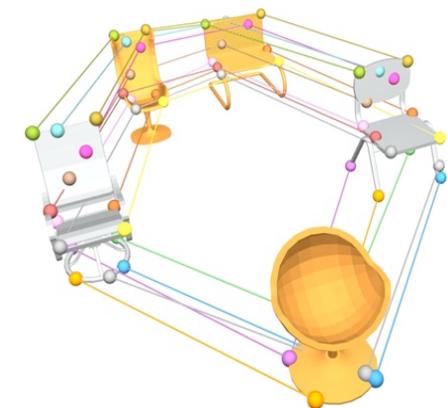
*supervised and/or use **geometric descriptors***



Wang et al. 2012



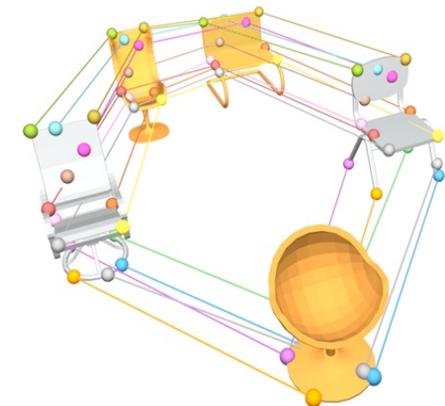
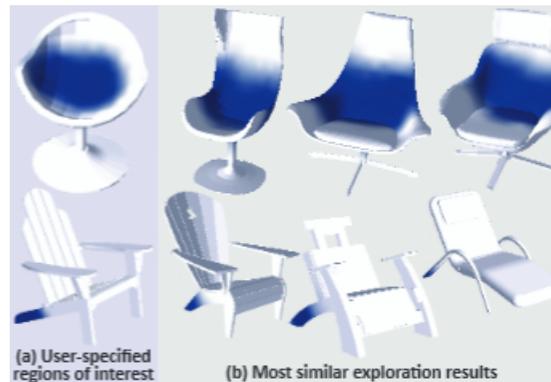
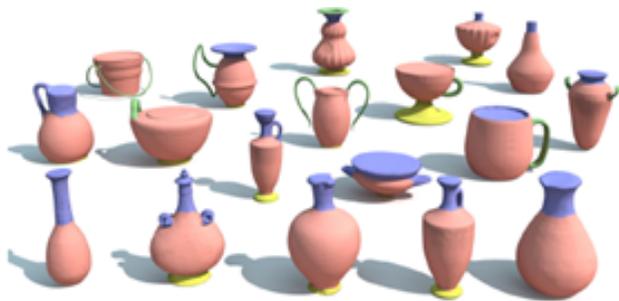
Kim et al. 2012, 2013



Huang et al. 2012

Relation to Co-segmentation

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Wang et al. 2012

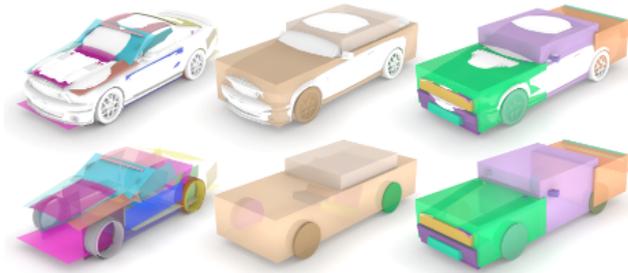
Kim et al. 2012, 2013

Huang et al. 2012



Relation to Co-analysis

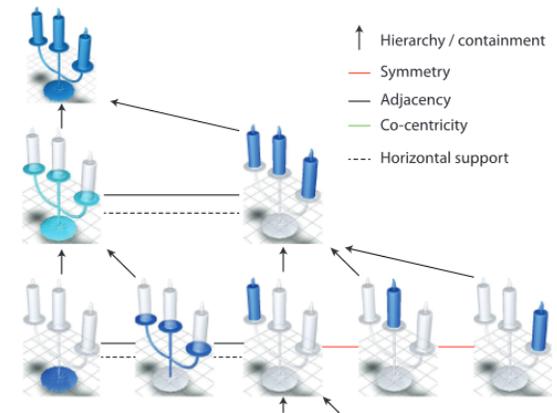
applications in synthesis, semantics



Yumer et al. 2012



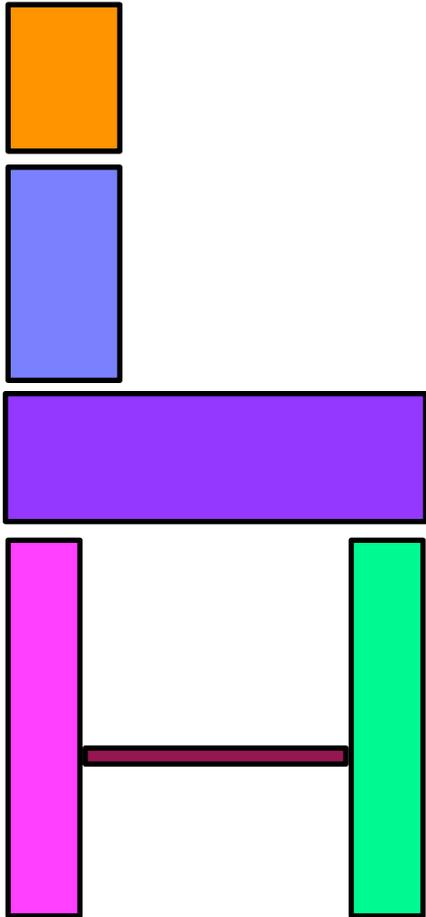
Kalogerakis et al. 2012



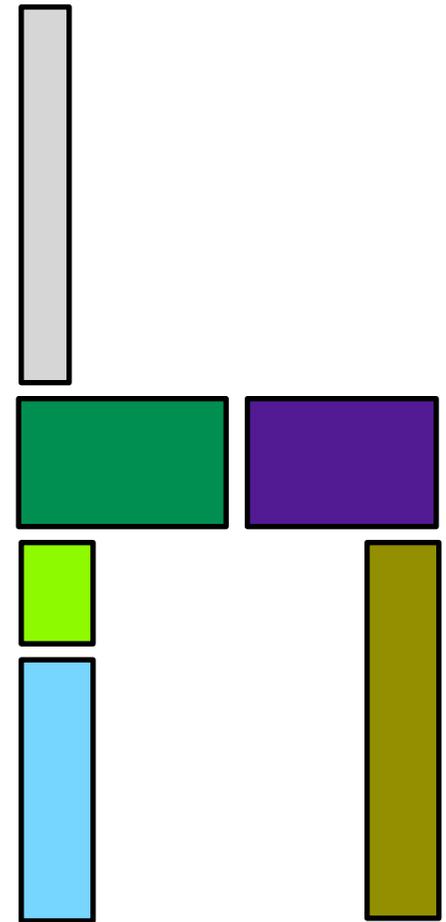
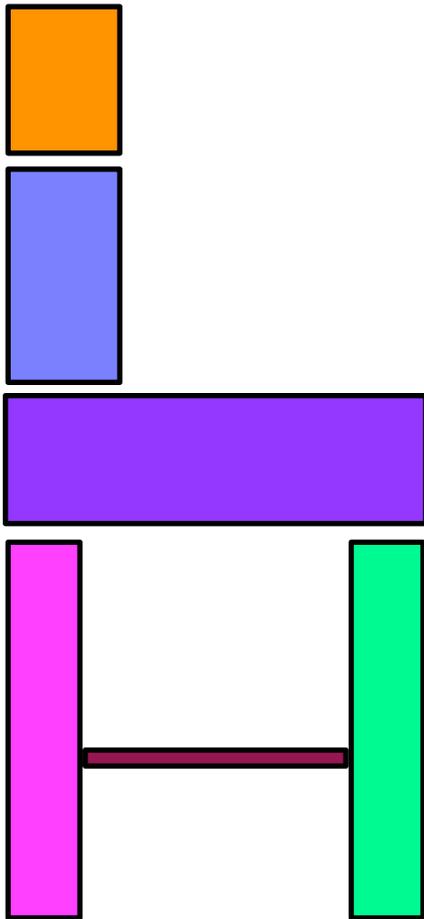
Laga et al. 2013

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- Related Works
- **Main Idea**
- **Algorithm**
- **Results**
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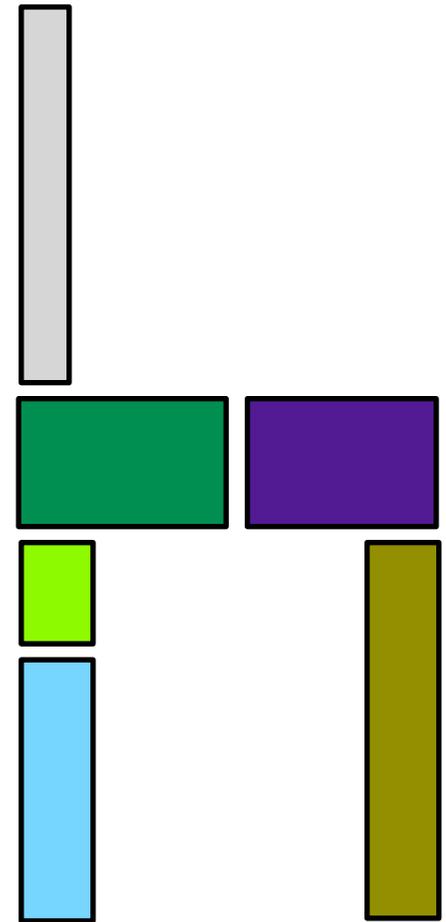
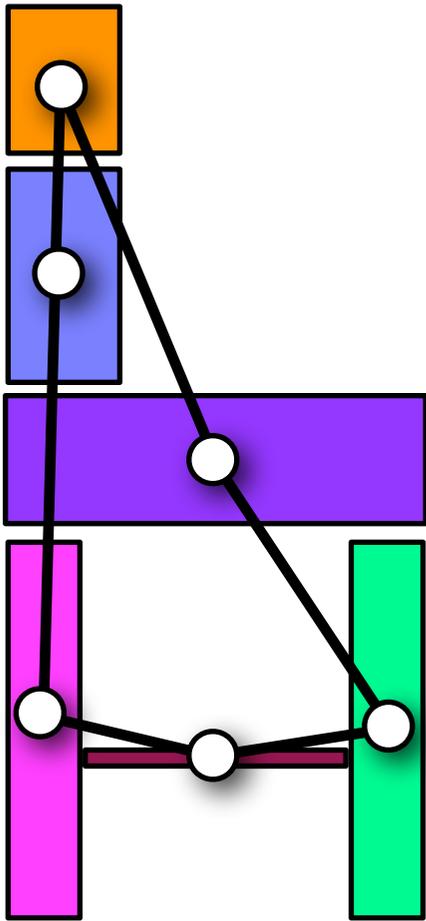
Graph Abstraction



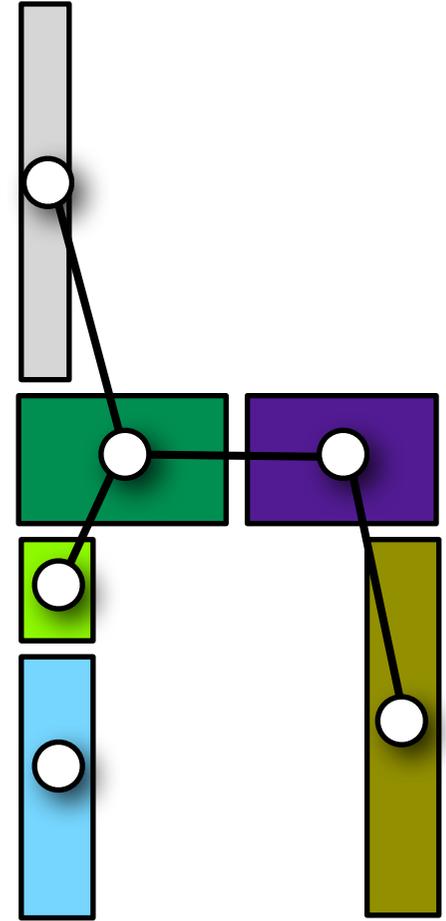
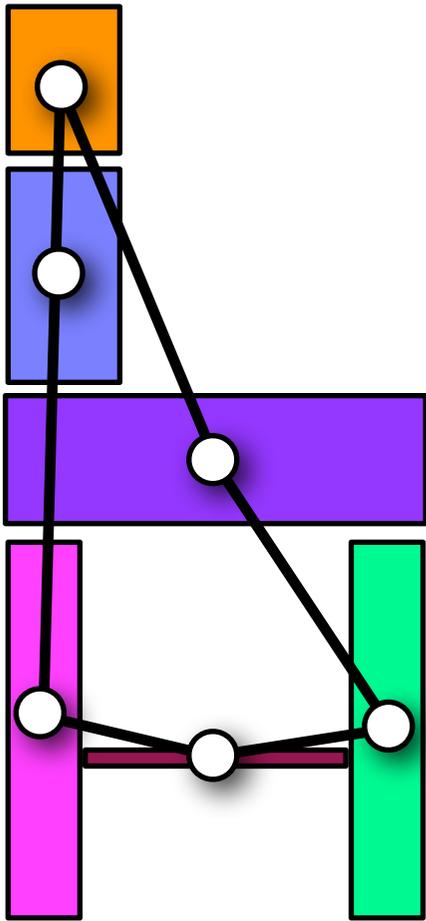
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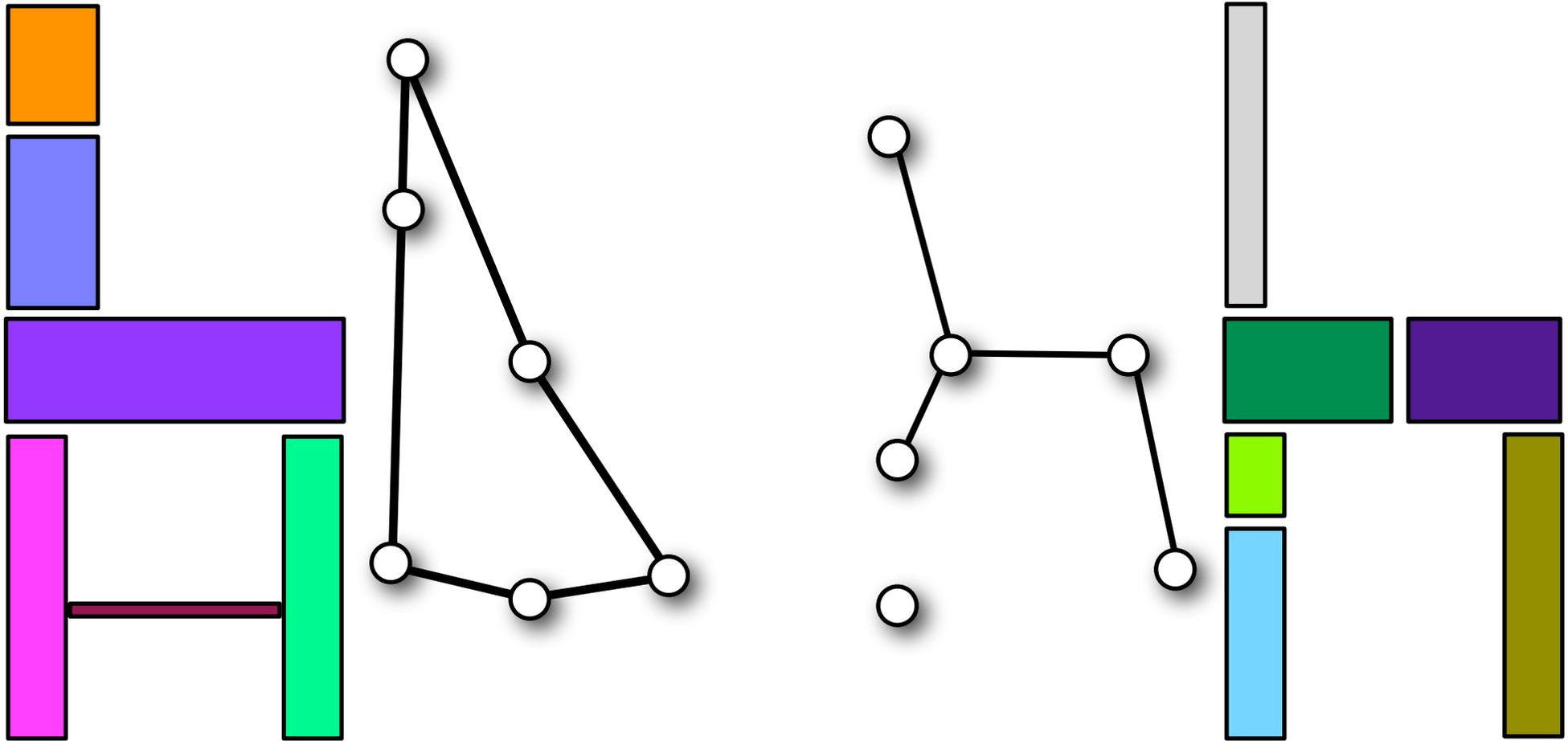
Graph Abstraction



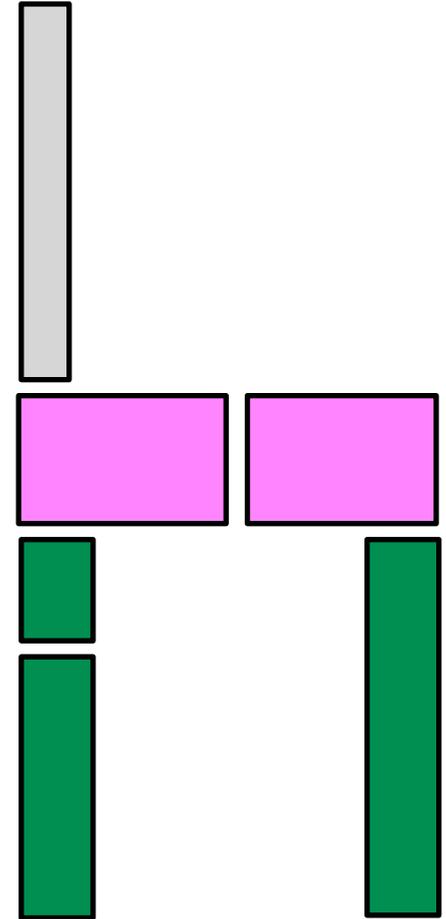
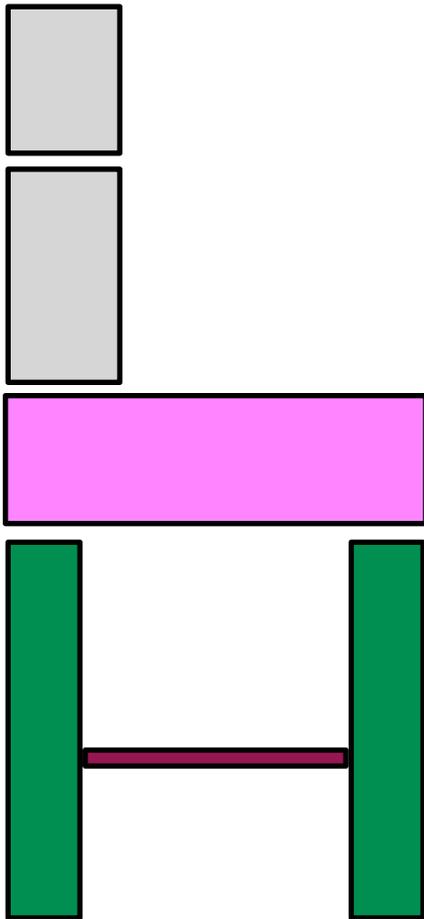
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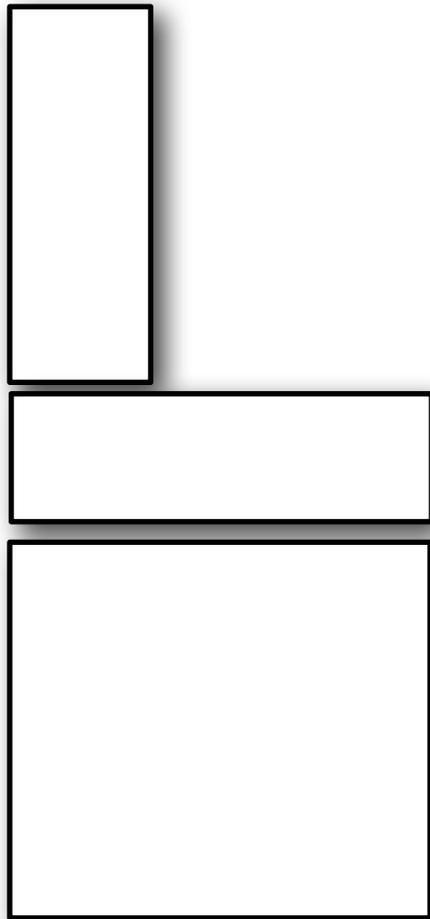
Graph Abstraction



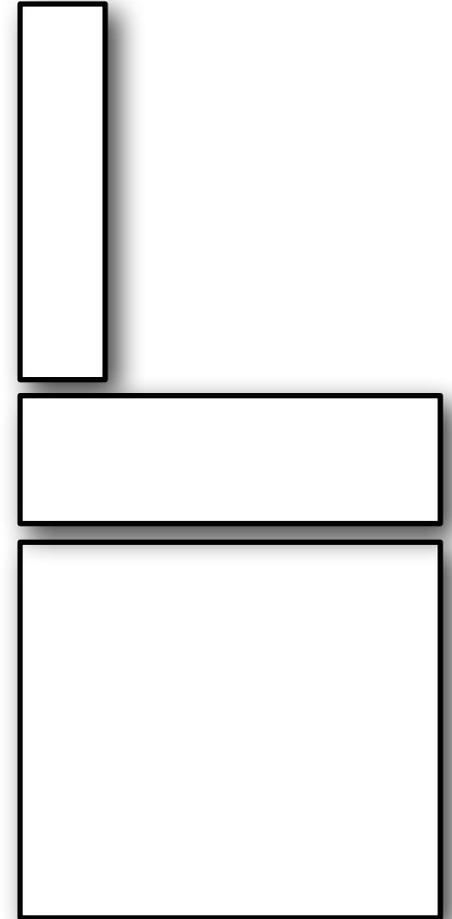
For the Correct Grouping



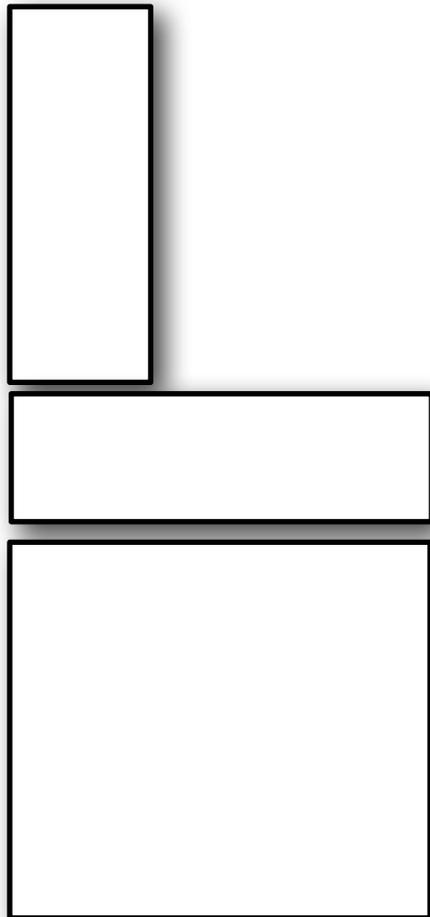
Focus on Arrangements



regroup parts

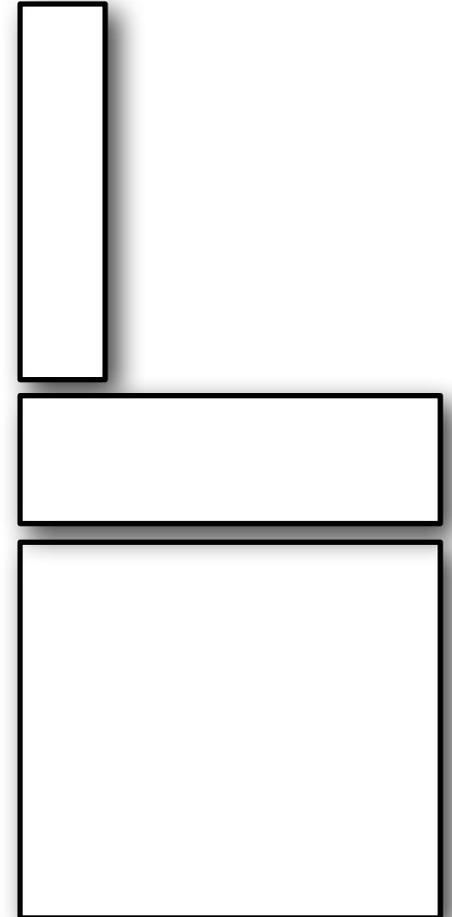


Focus on Arrangements

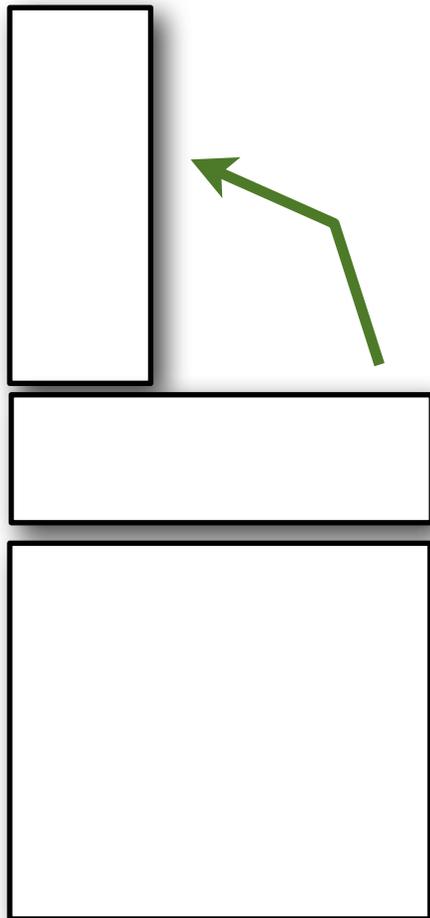


regroup parts

compare *without*
using correspondence

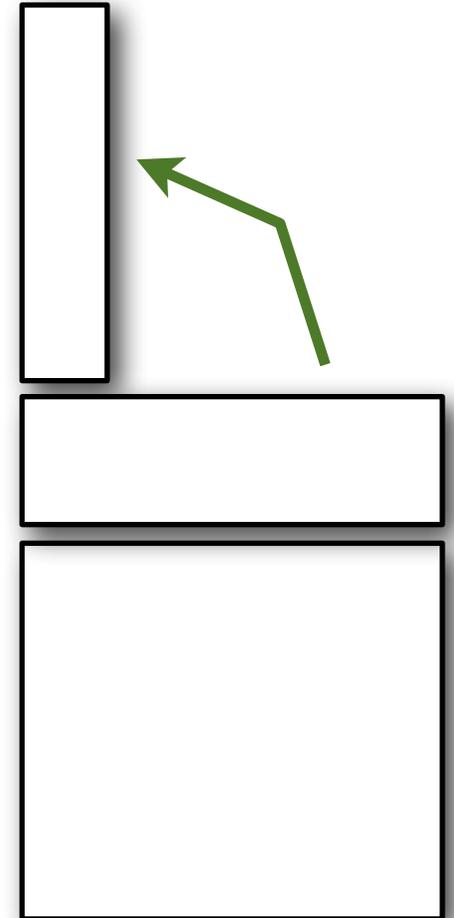


Focus on Arrangements

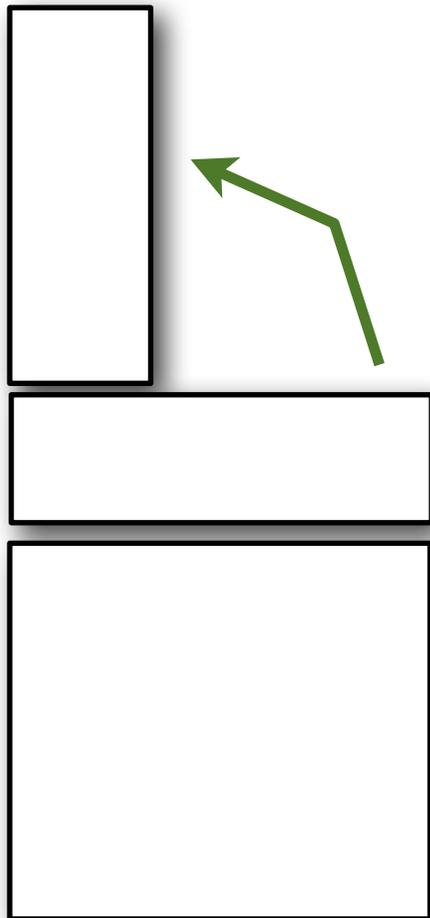


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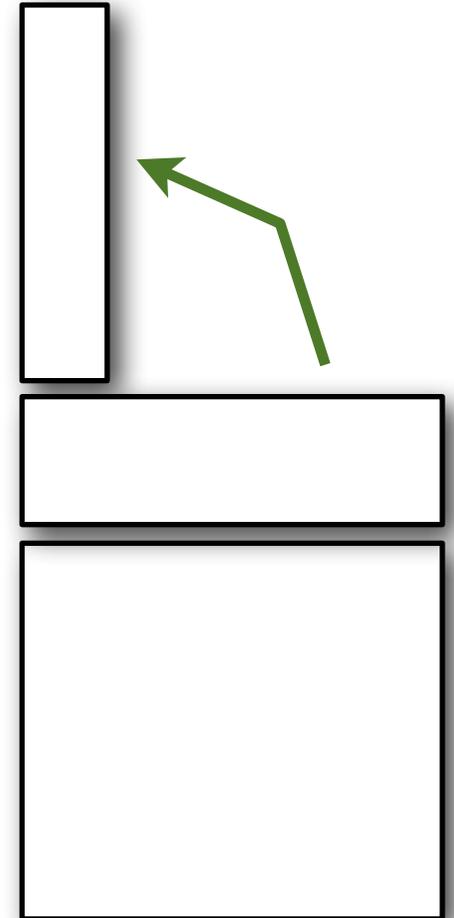
Focus on Arrangements



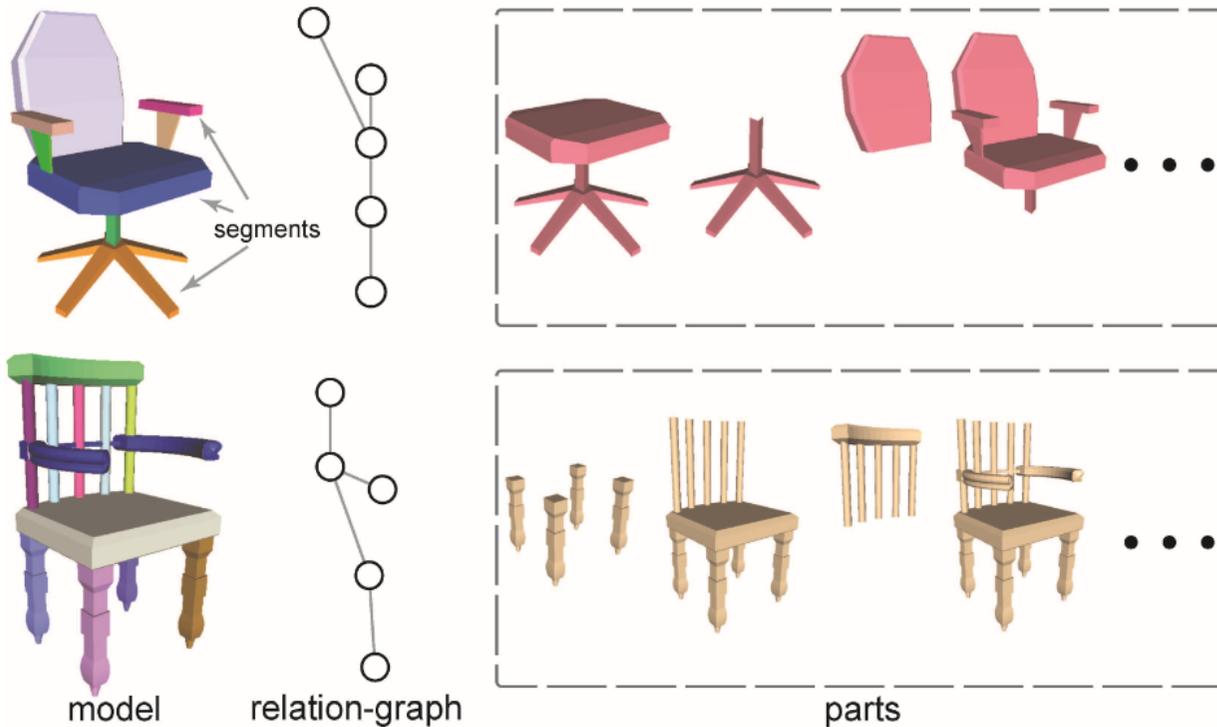
regroup parts

compare *without*
using correspondence

relative arrangement

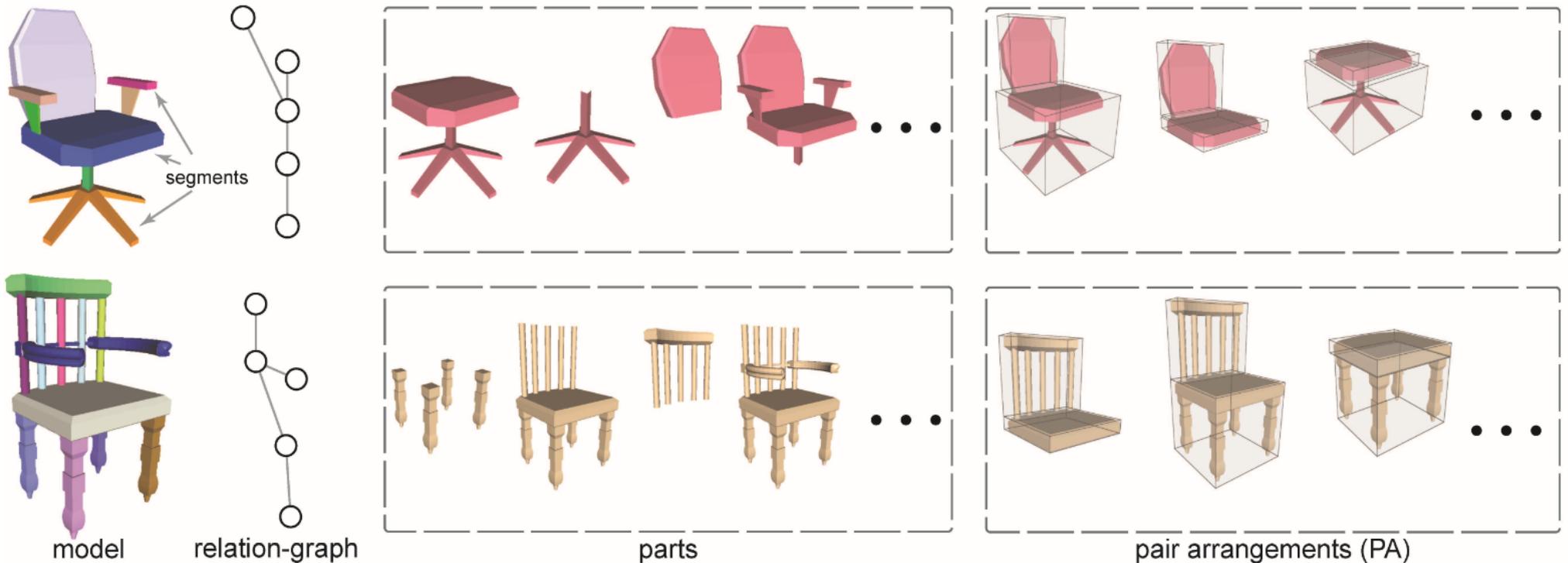


Part Arrangements



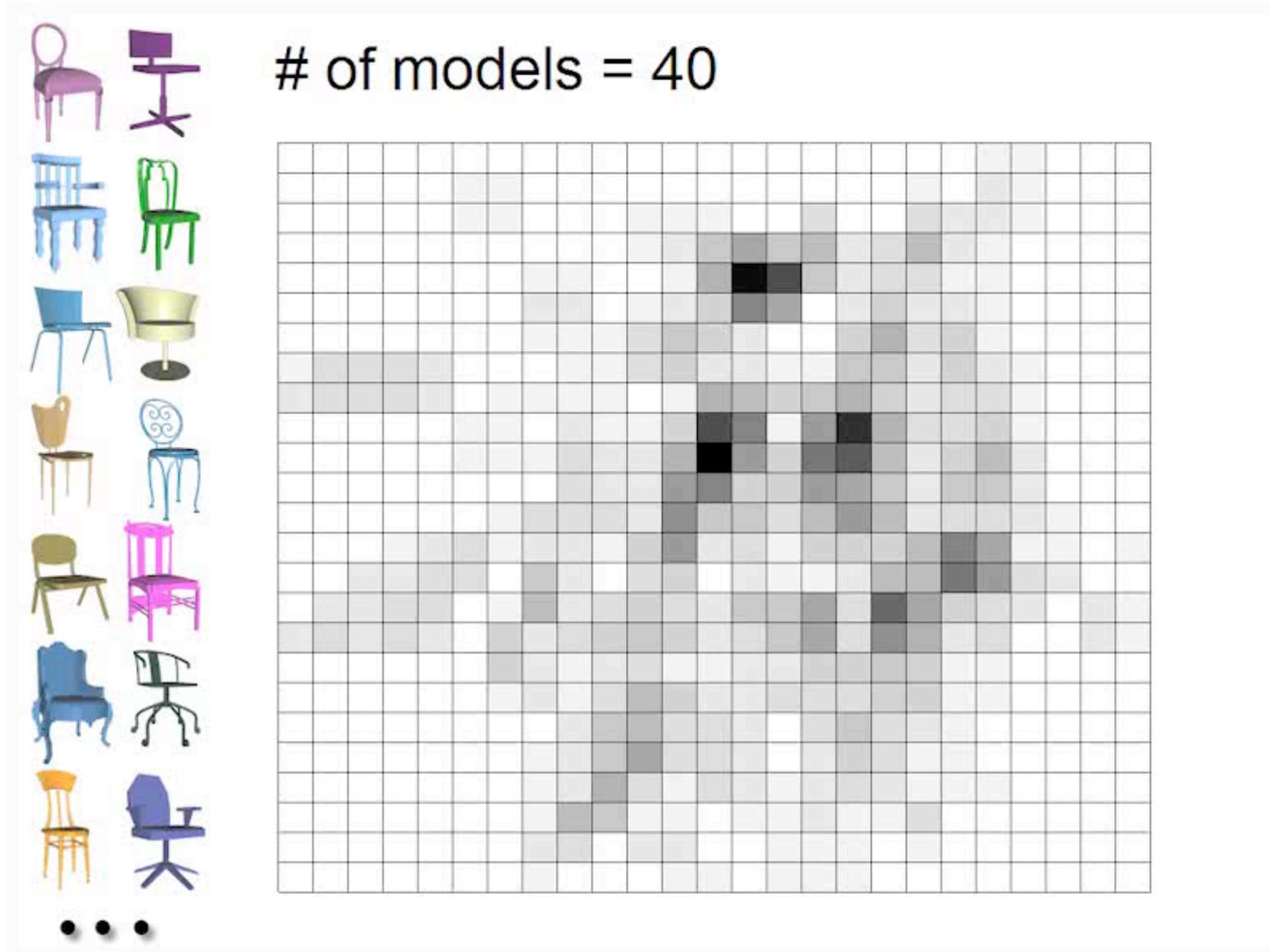
- Components form parts
- Parts from arrangements

Pair Arrangements



- Components form parts
- Parts from arrangements
- Pair of parts form **pair arrangement (PA)**

Arrangements Recur!



Arrangements Recur!



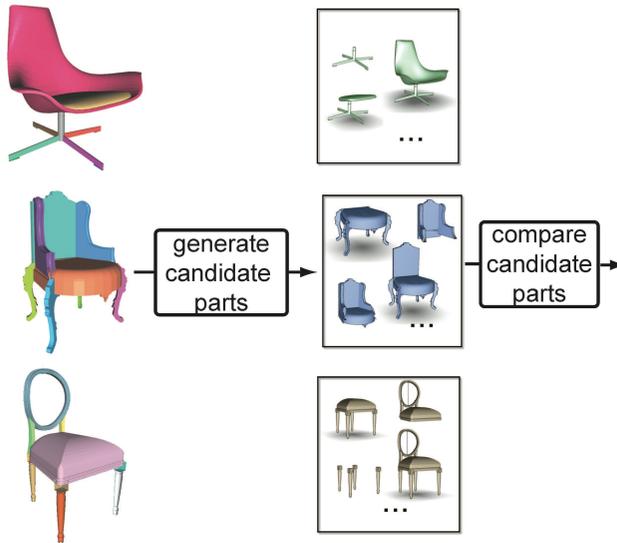
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Algorithm



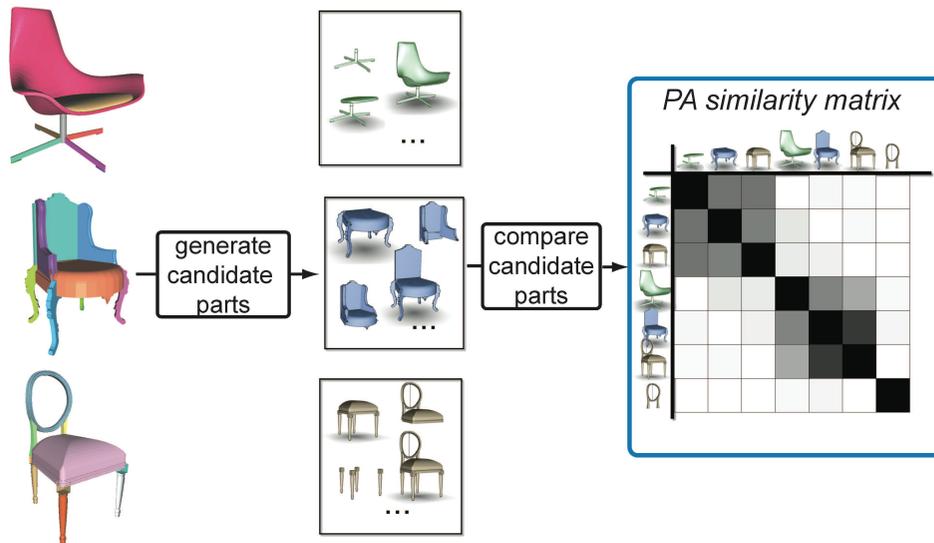
- Candidate *PA*-s generation

Algorithm



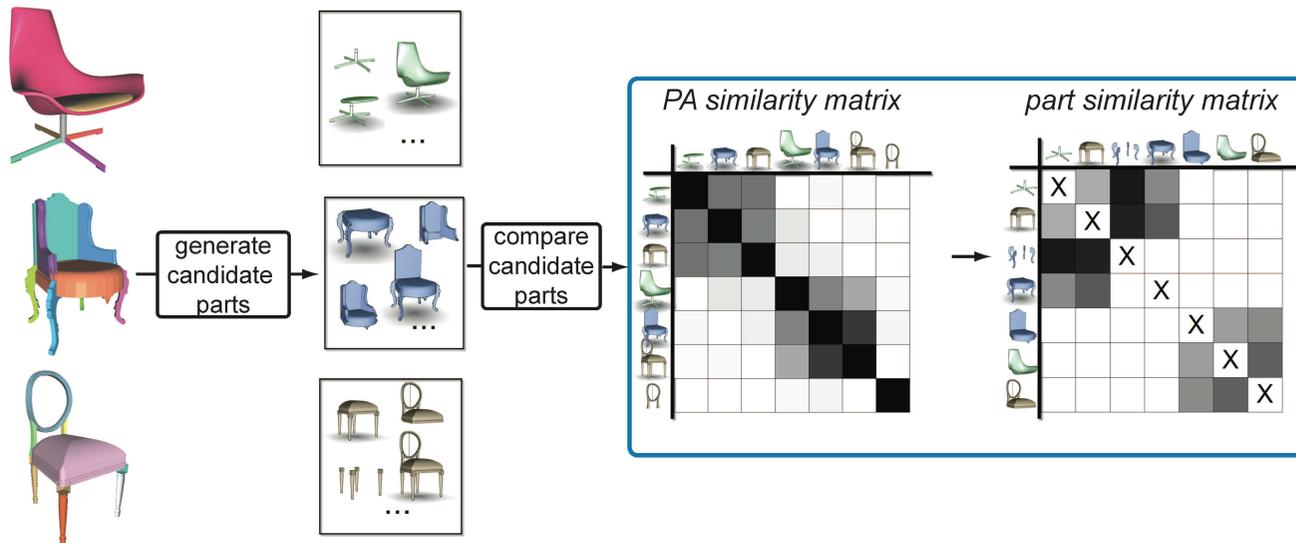
- Candidate *PA*-s generation
- Comparing *PA*-s

Algorithm



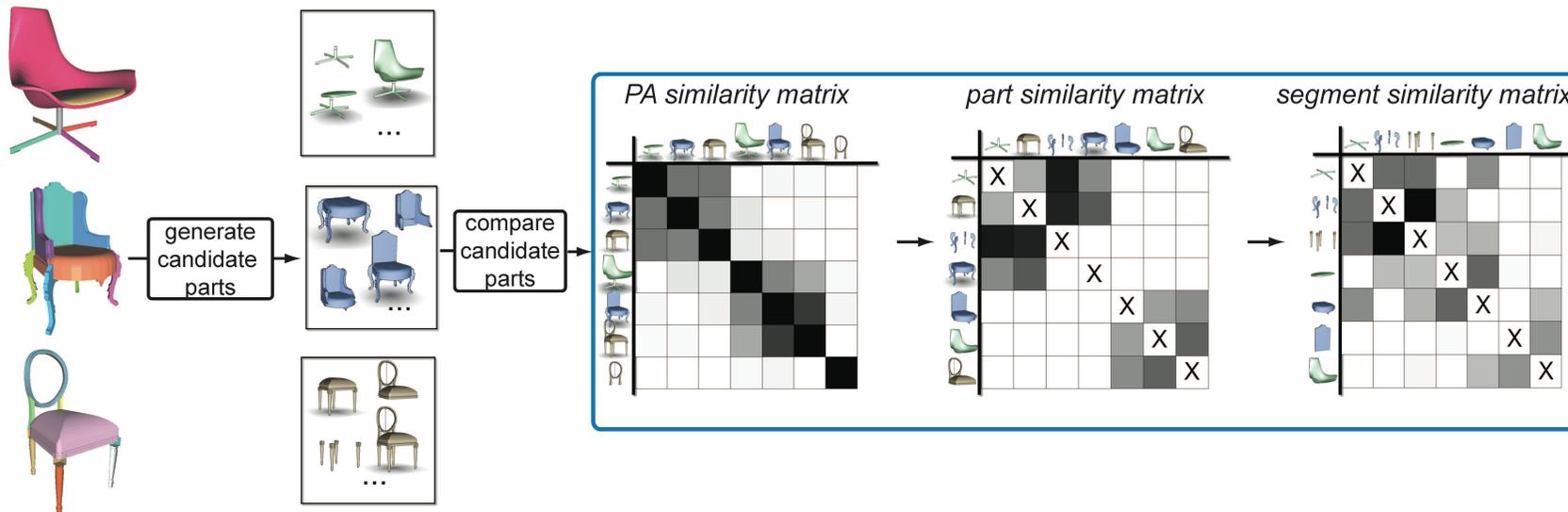
- Candidate *PA*-s generation
- Comparing *PA*-s
 - *PA* similarity matrix (M1)

Algorithm



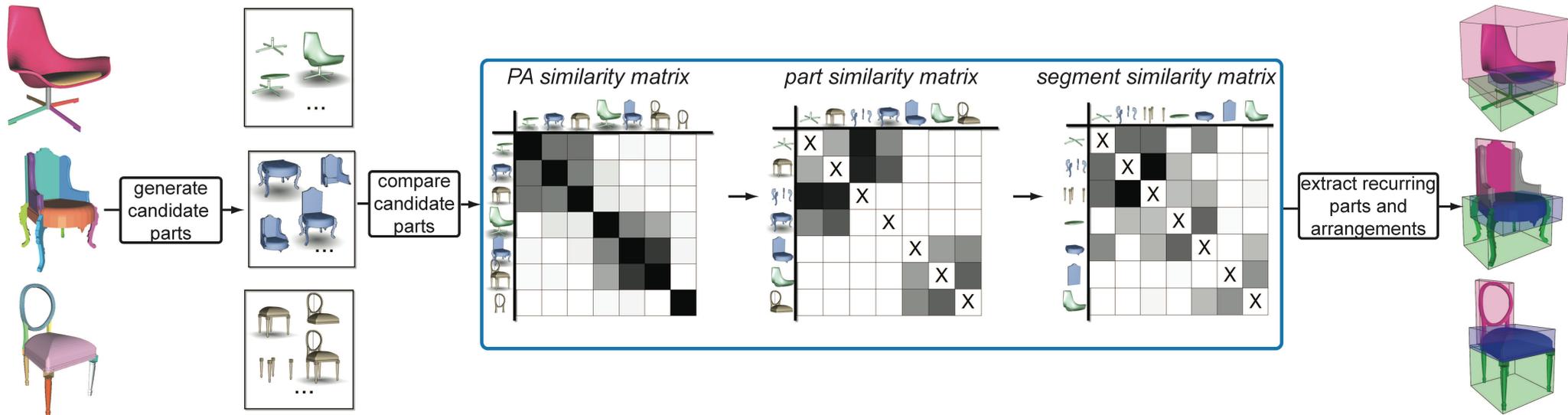
- Candidate *PA*-s generation
- Comparing *PA*-s
 - *PA* similarity matrix (M1)
 - Part similarity matrix (M2)

Algorithm



- Candidate *PA*-s generation
- Comparing *PA*-s
 - *PA* similarity matrix (M1)
 - Part similarity matrix (M2)
 - Component similarity matrix (M3)

Algorithm

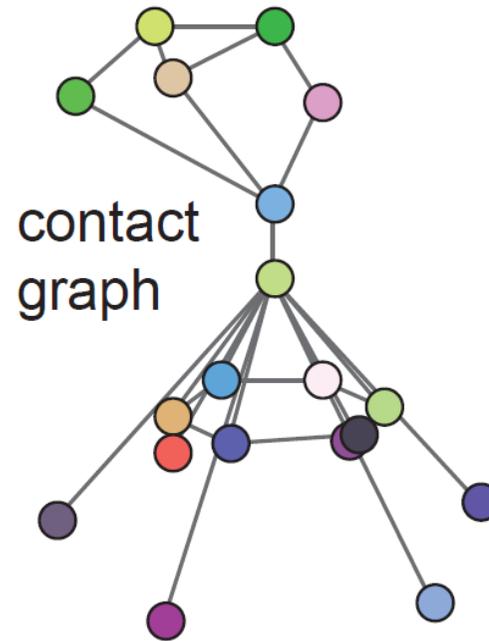
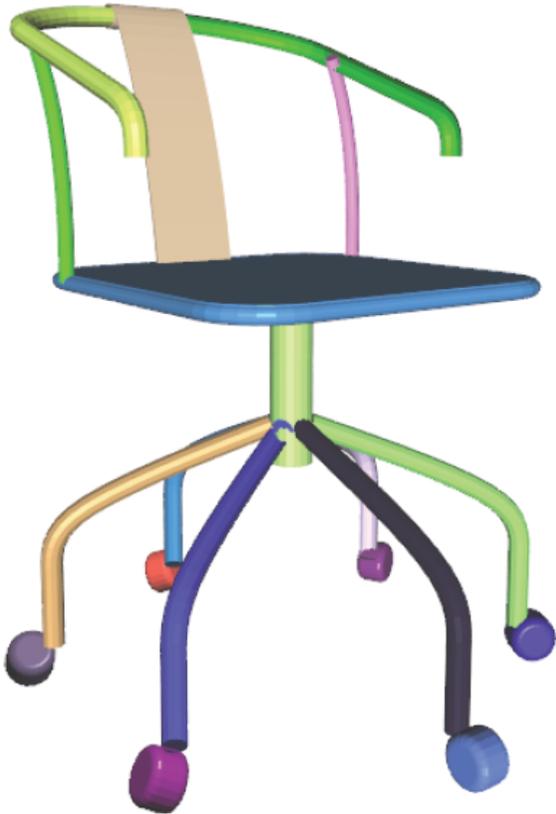


- Candidate *PA*-s generation
- Comparing *PA*-s
 - *PA* similarity matrix (M1)
 - Part similarity matrix (M2)
 - Component similarity matrix (M3)
- Recurring Arrangements Extraction

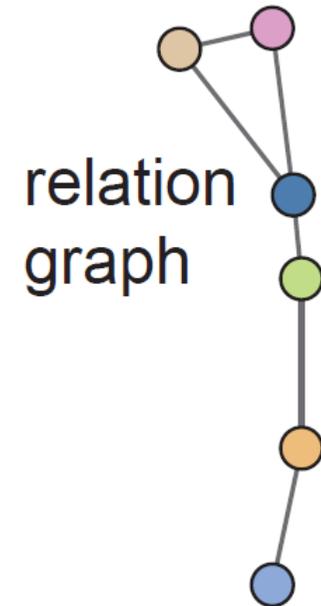
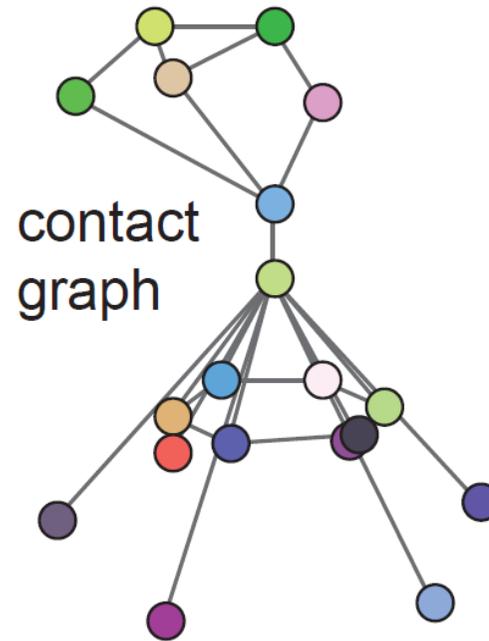
Relation Graph



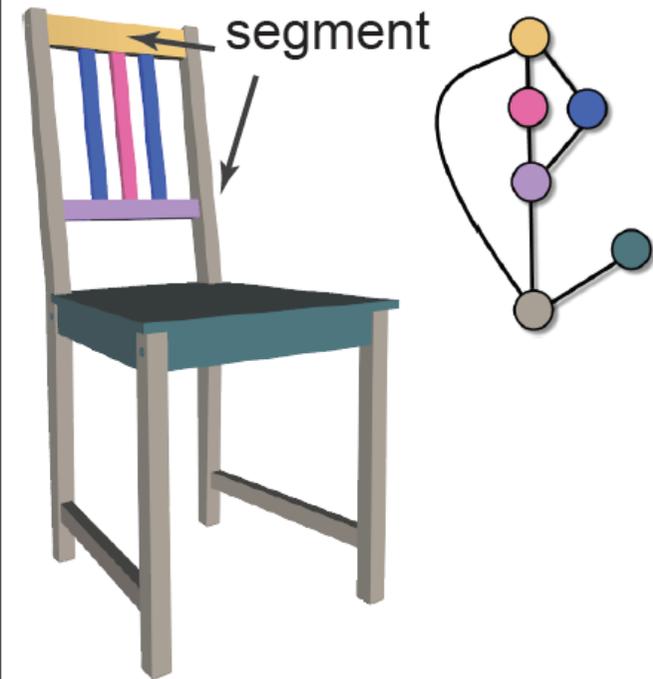
Relation Graph



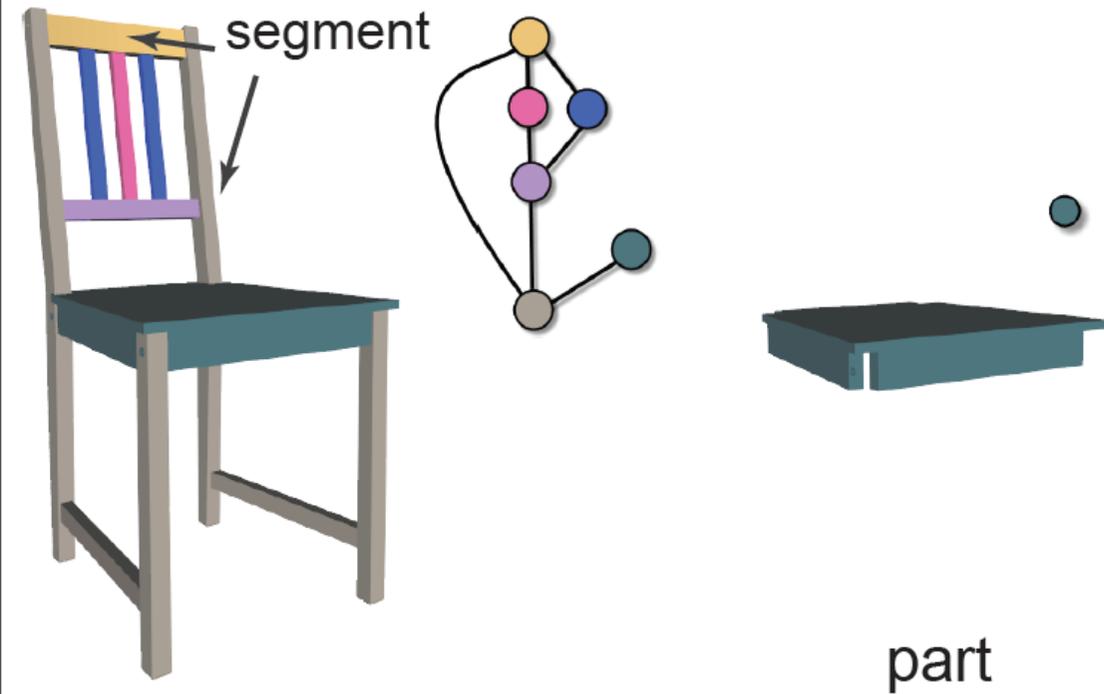
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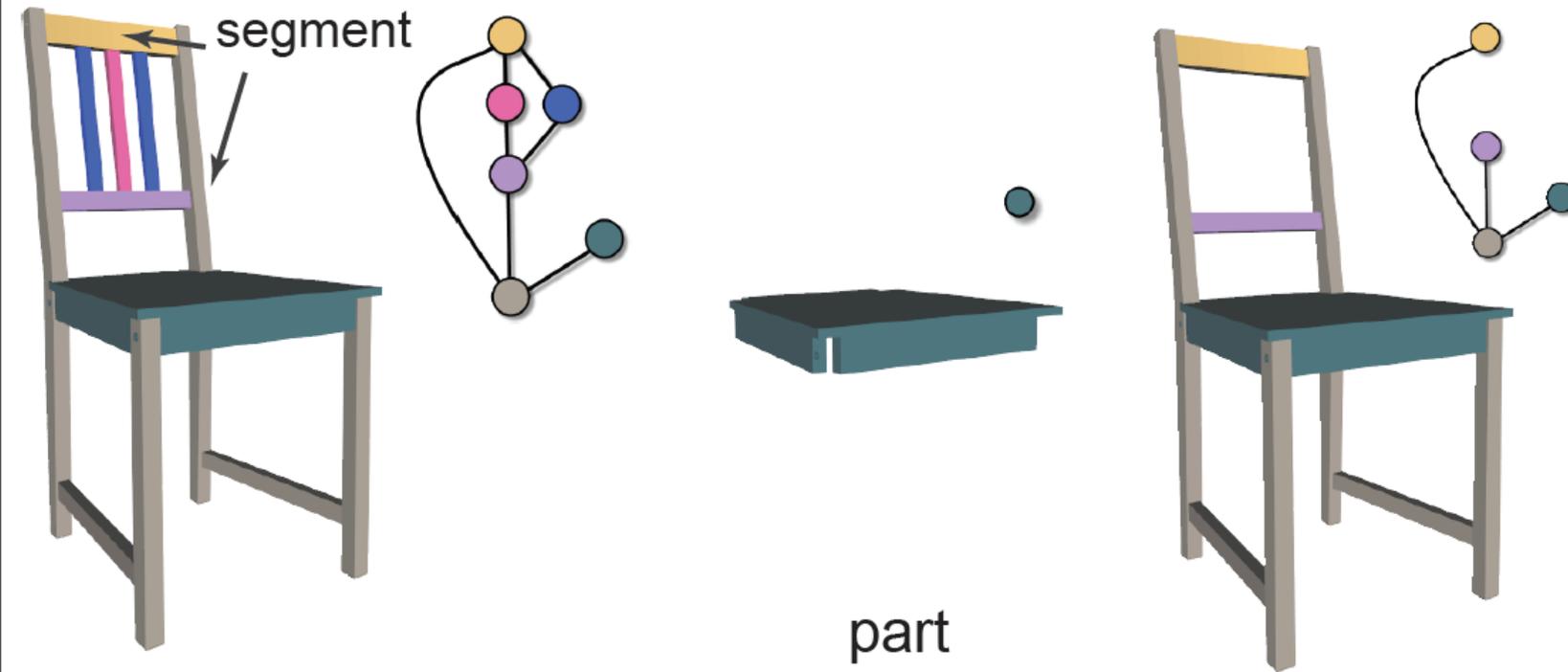
What are Valid Parts?



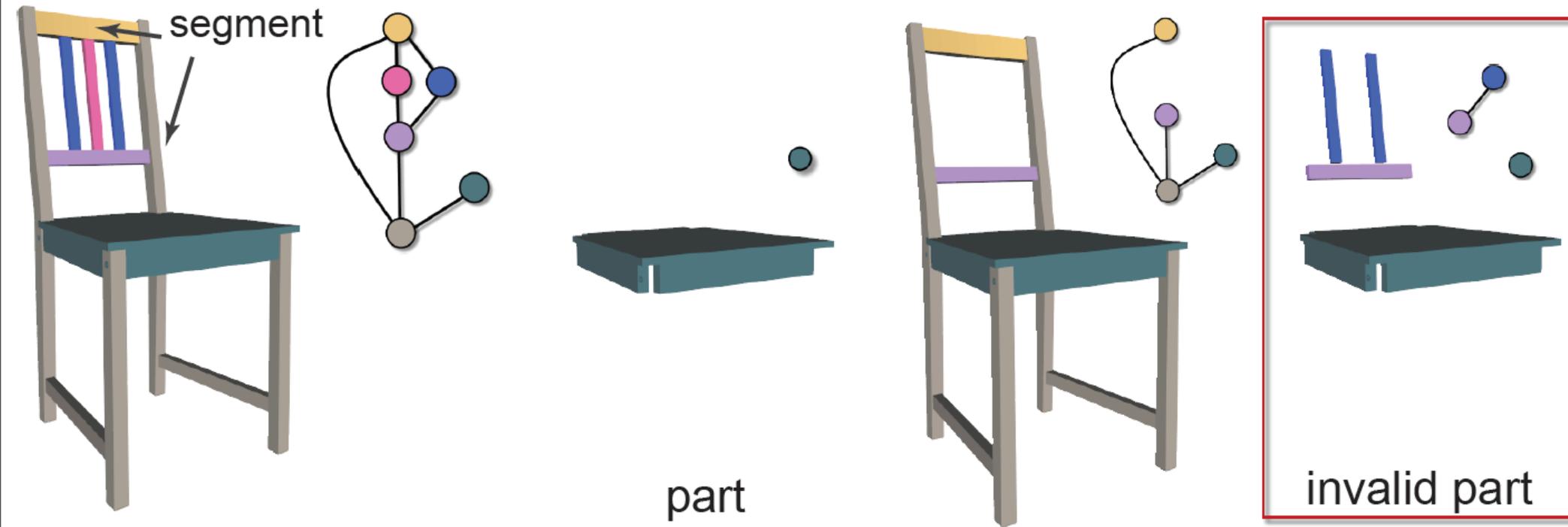
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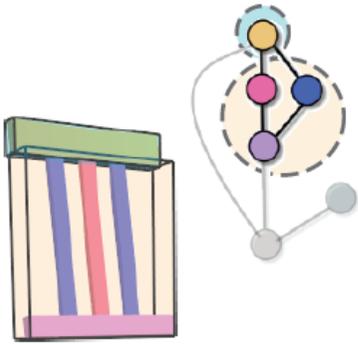
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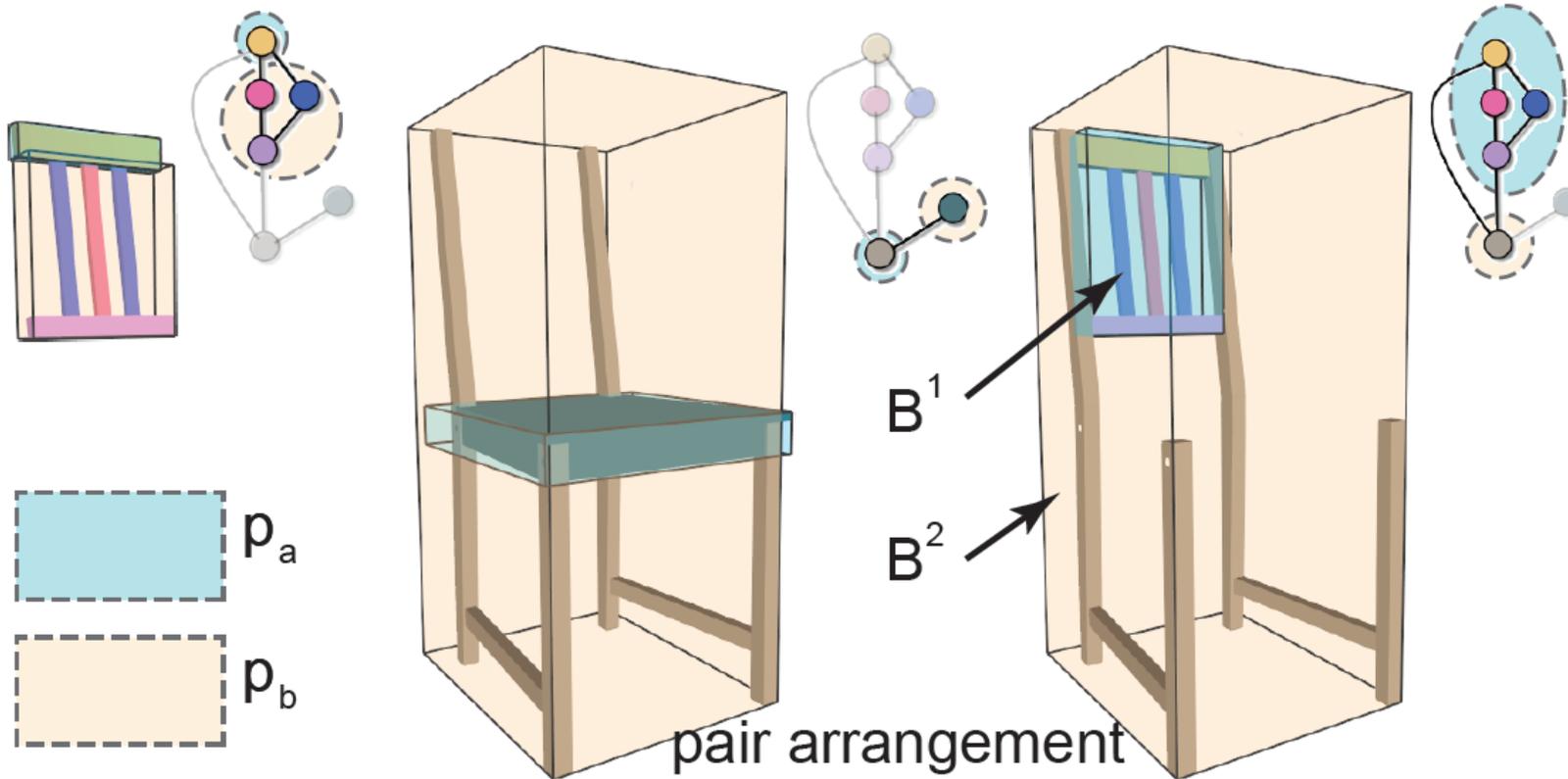
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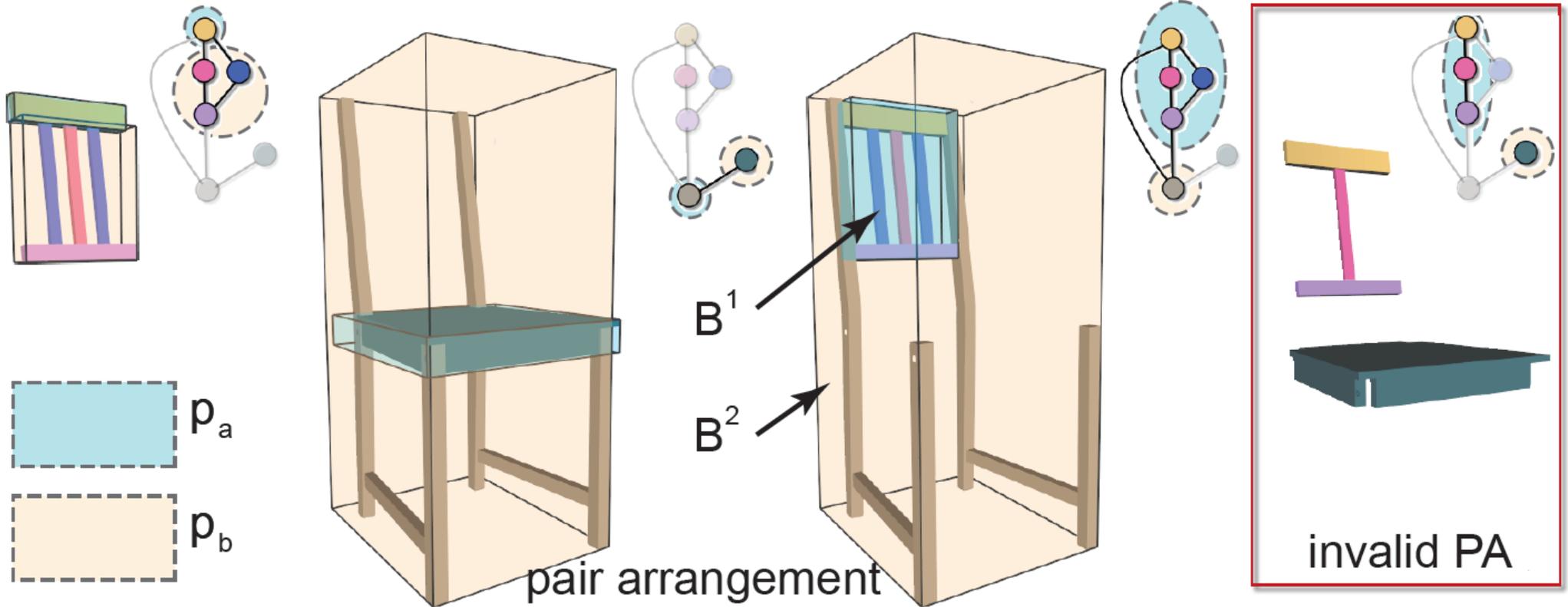
What are Valid Part Pairs?



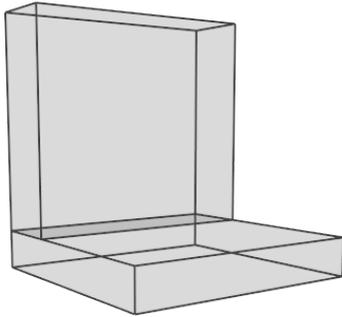
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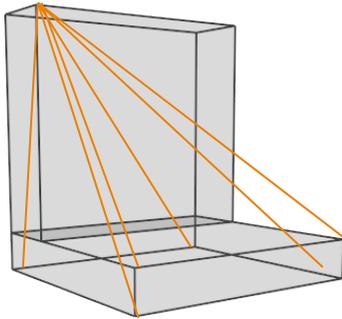
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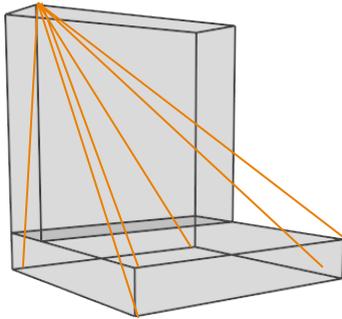
Comparing PA-s



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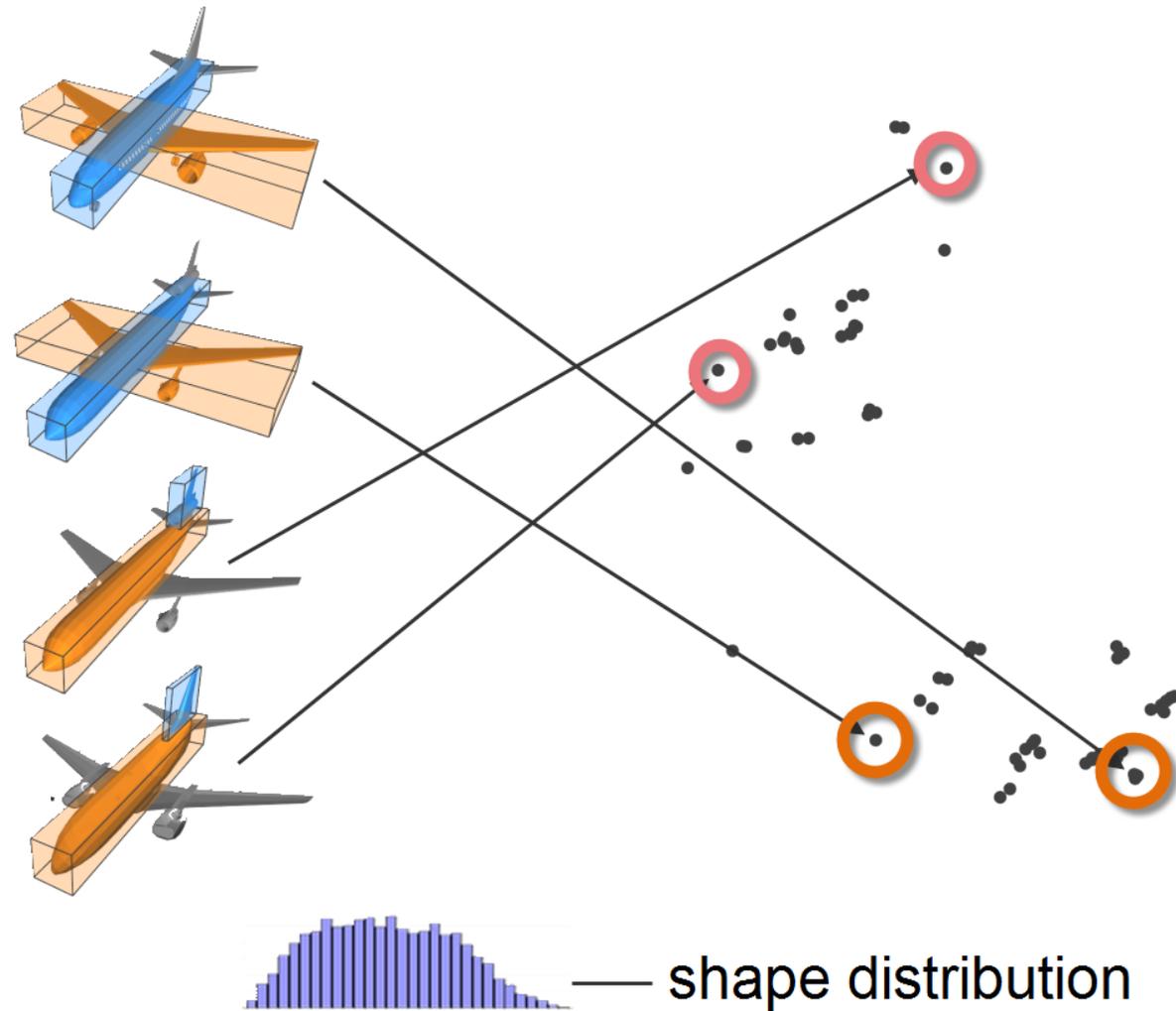


Comparing PA-s

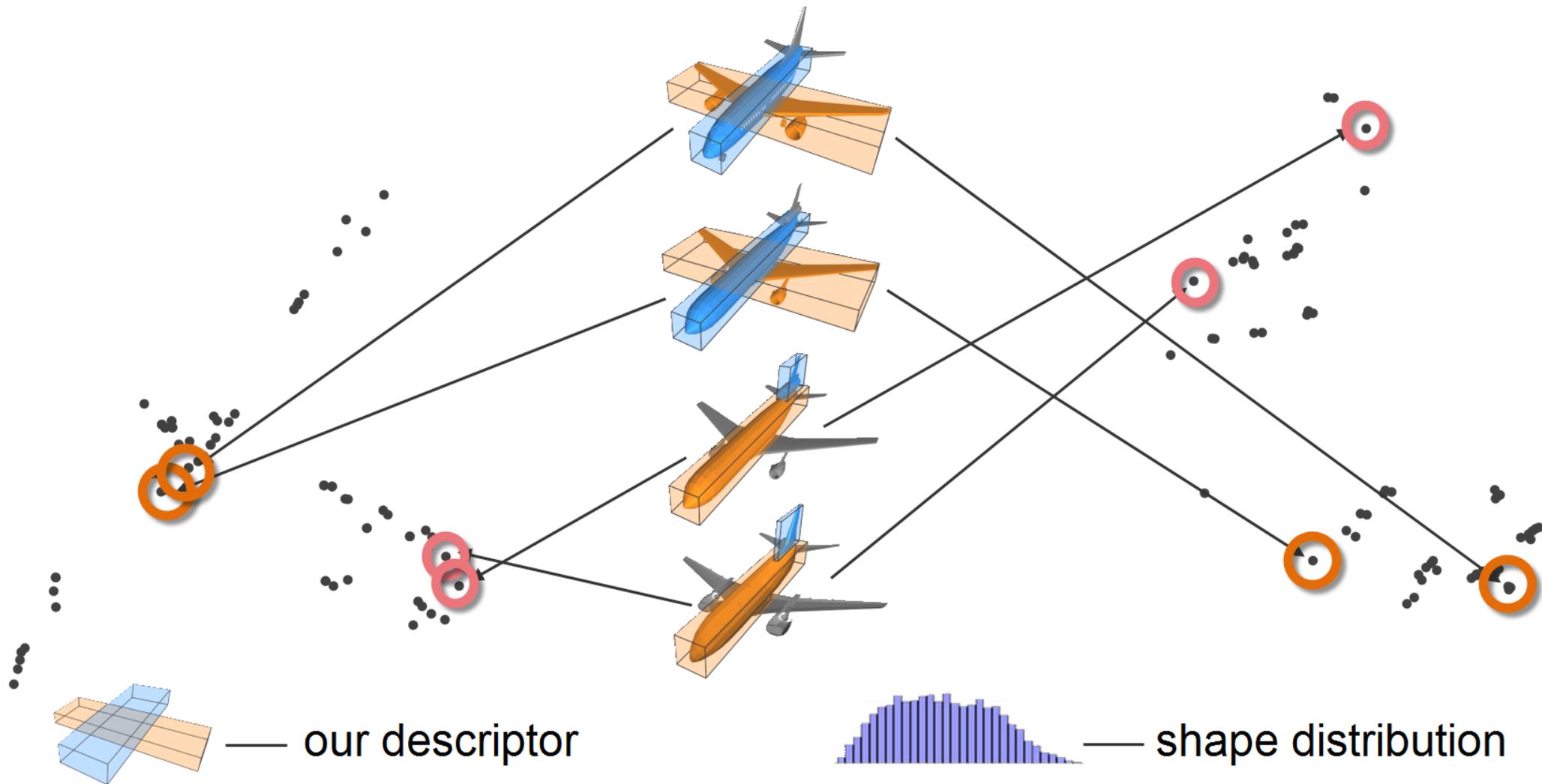


$$\mathcal{S}(s_{ab}) := \{ \|\mathbf{v}_i(B^1) - \mathbf{v}_j(B^2)\| \}$$

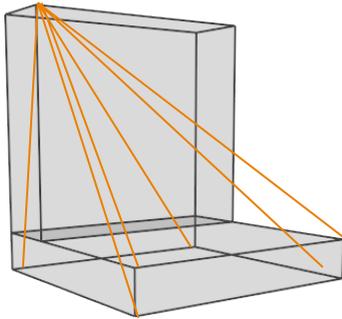
Comparing Arrangements



Comparing Arrangements

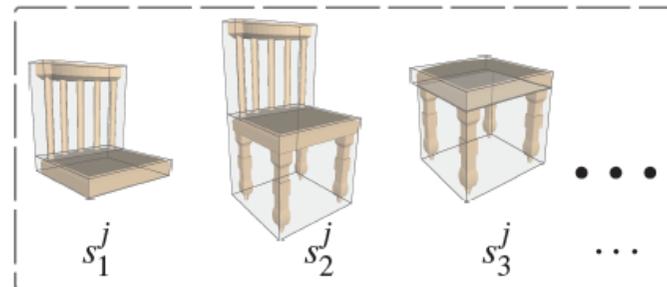
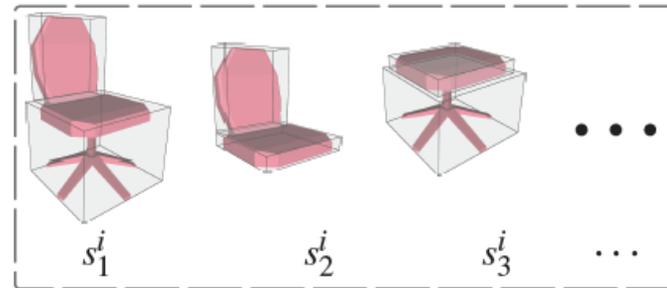
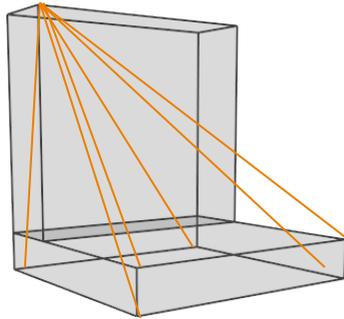


PA Similarity Matrix



$$\mathcal{S}(s_{ab}) := \{\|\mathbf{v}_i(B^1) - \mathbf{v}_j(B^2)\|\}$$

PA Similarity Matrix

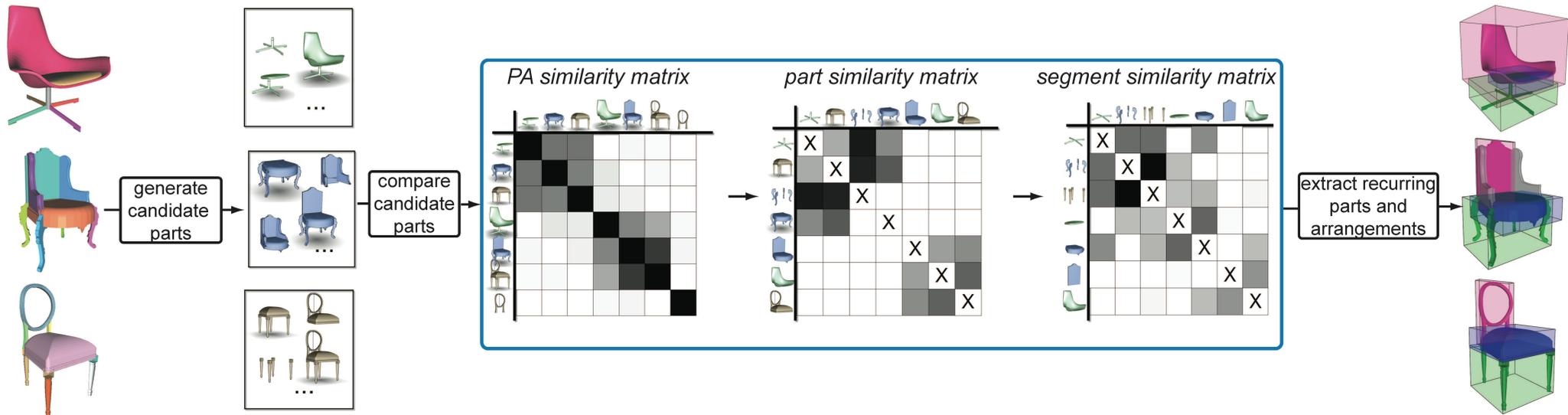


pair arrangements (PA)

	s_1^i	s_2^i	s_3^i
s_1^j	0.064	0.829	0.002
s_3^j	0.006	0.004	0.802
s_2^j	0.812	0.184	0.013

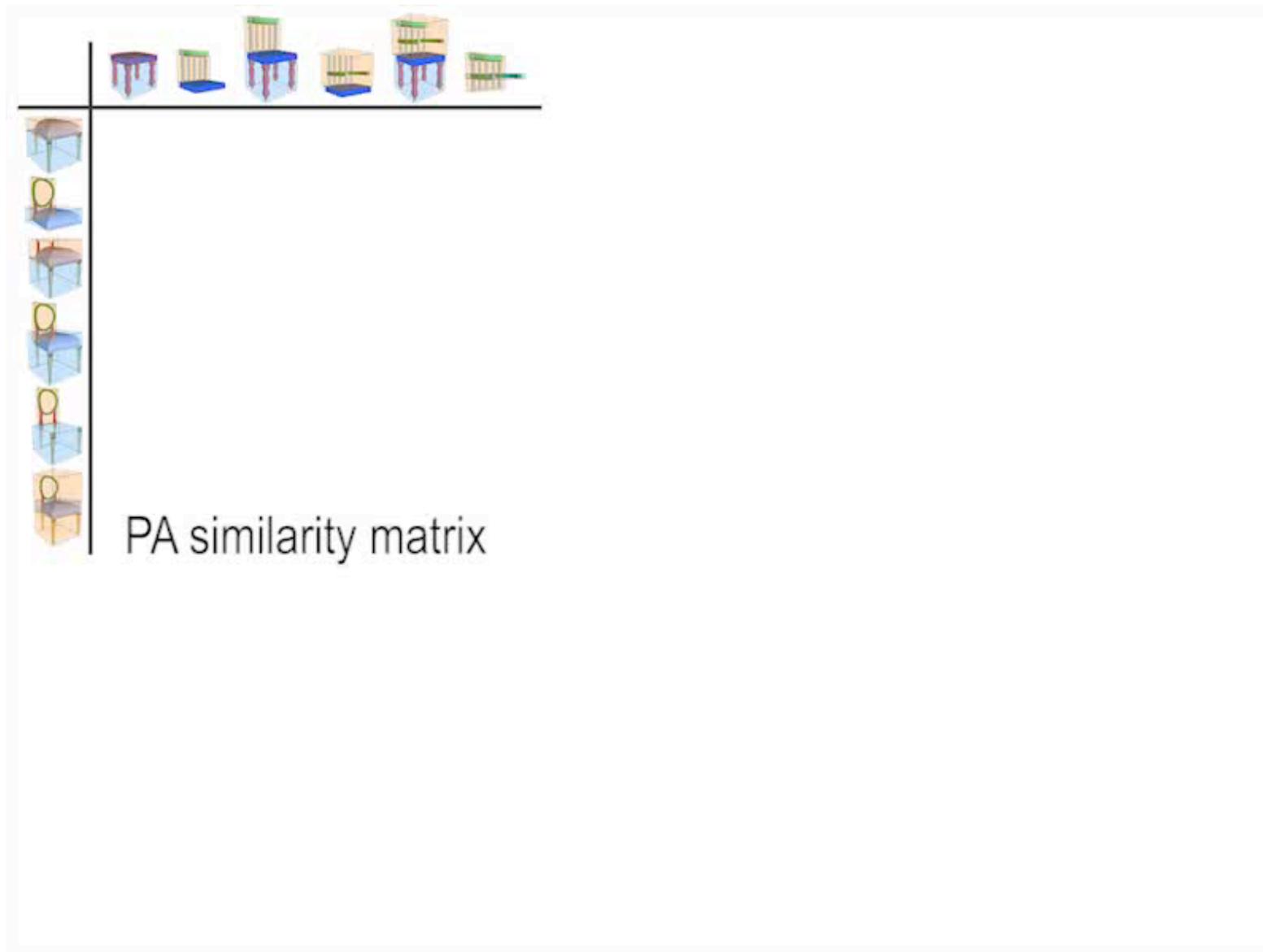
$$\mathcal{S}(s_{ab}) := \{\|\mathbf{v}_i(B^1) - \mathbf{v}_j(B^2)\|\}$$

Algorithm



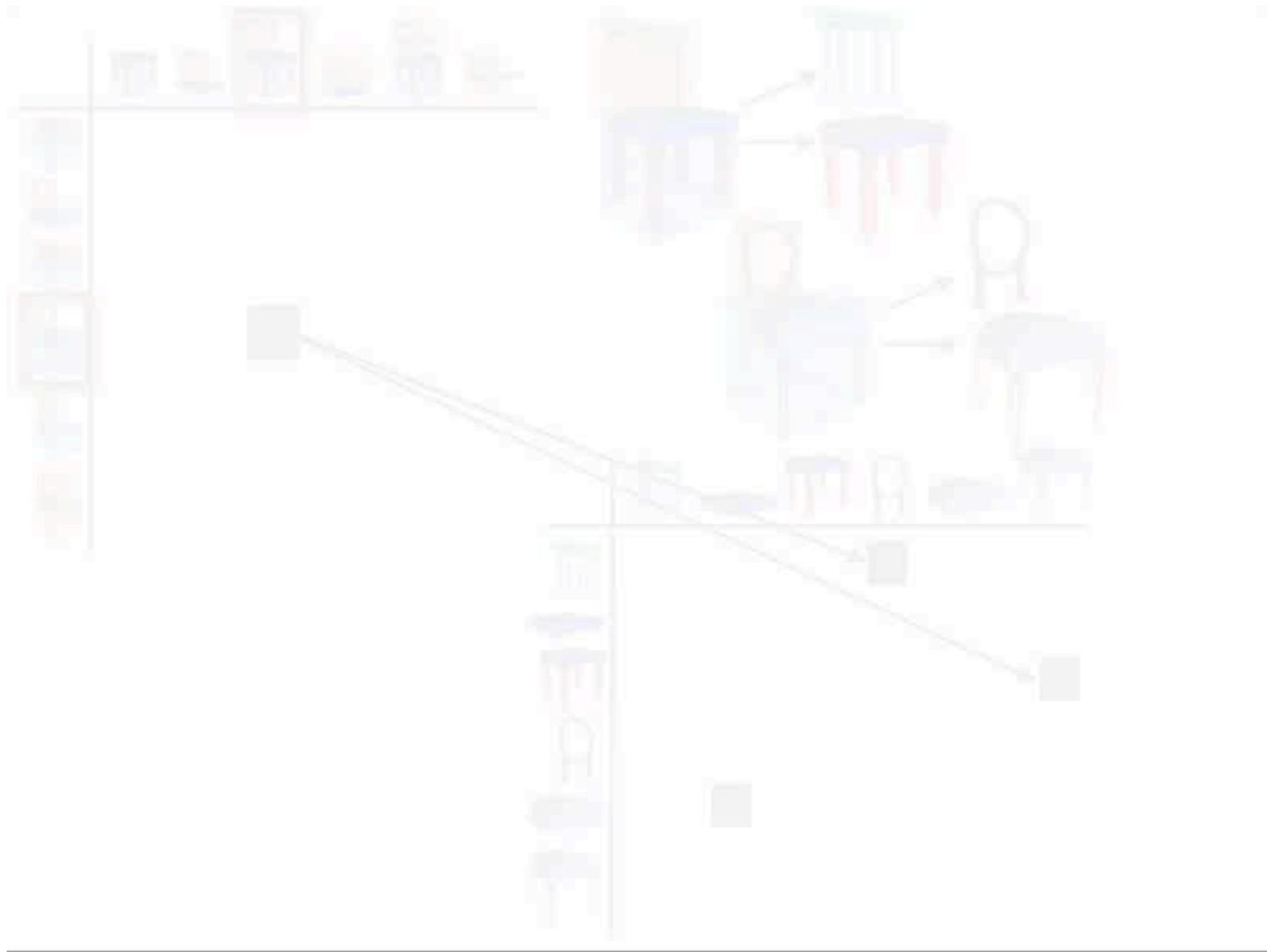
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$PA \Rightarrow$ Part Similarity



PA \Rightarrow *Part Similarity*

Part \Rightarrow Segment Similarity



Part ⇒ *Segment Similarity*

Extracting Recurring PAs



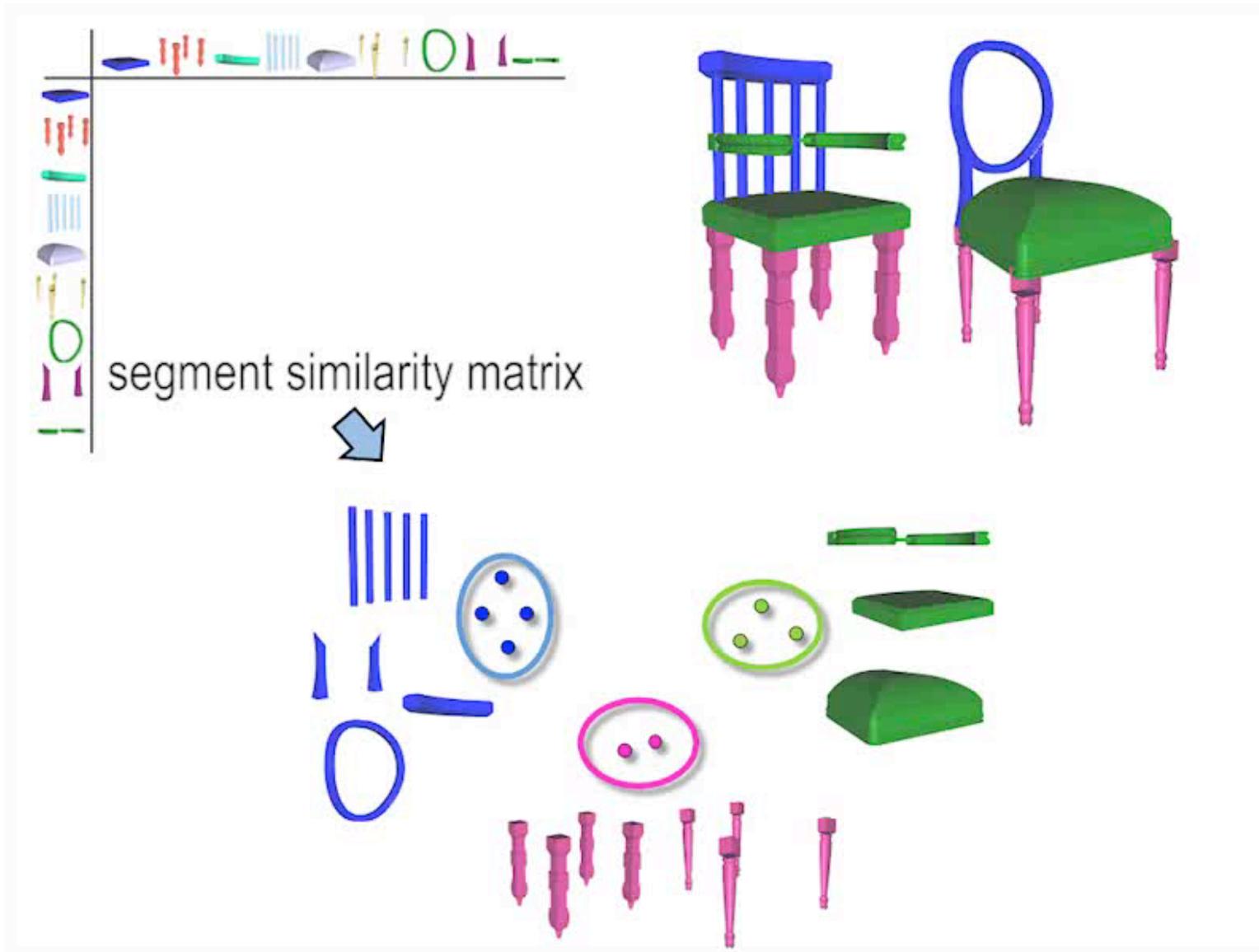
Extracting Recurring PAs



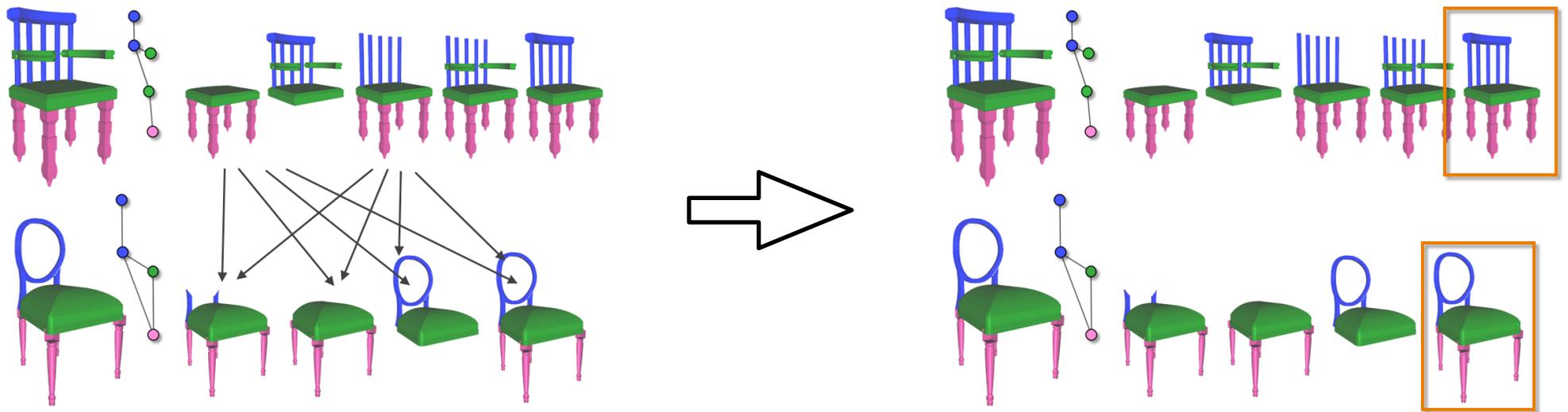
Final Step: Part Selection



Final Step: Part Selection



MRF-based Labelling Problem



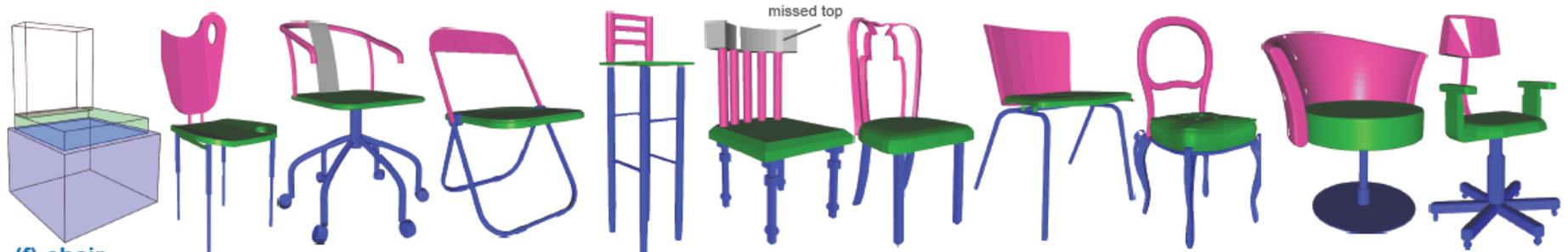
$$\{l_i\}^* := \arg \min_{\{l_i\}} \sum E(M_i \rightarrow l_j^k) + \sum_{i,j} E(M_i \rightarrow l_i^k, M_j \rightarrow l_j^l)$$

- Introduction
- Related Works
- Main Idea
- Algorithm
- **Results**
- Limitations and Future work

Results



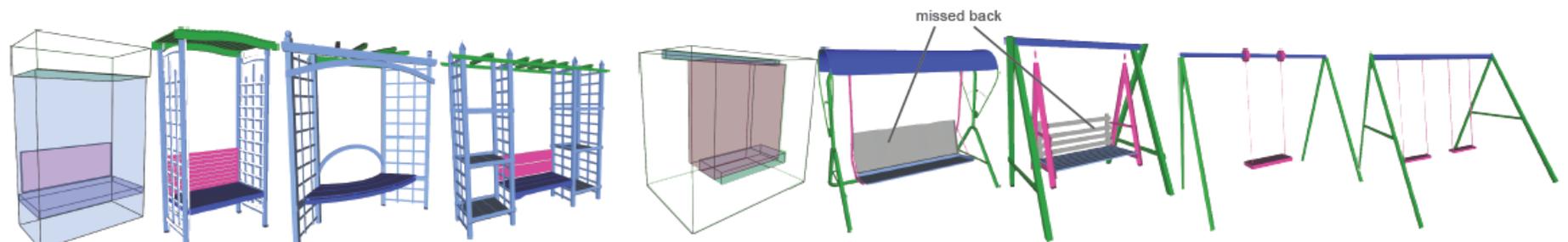
Further Results



(f) chair



(g) infant bed

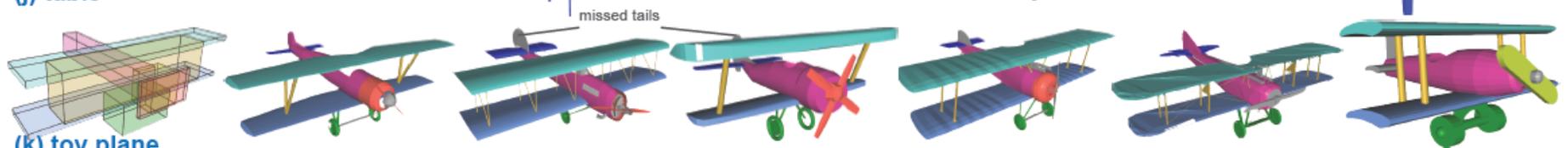


(h) bus stop

(i) swing

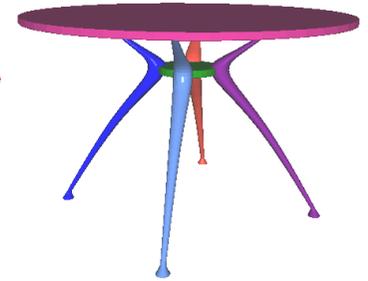
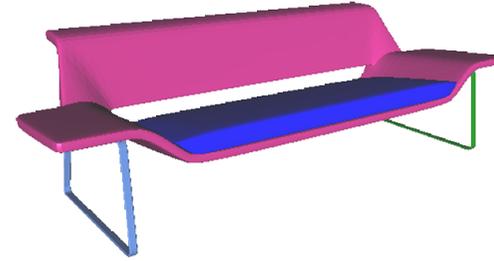
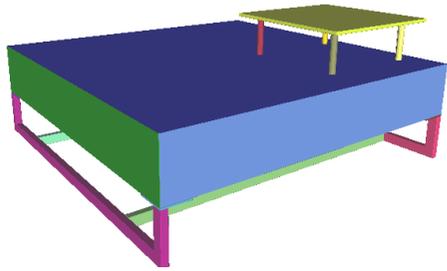


(j) table

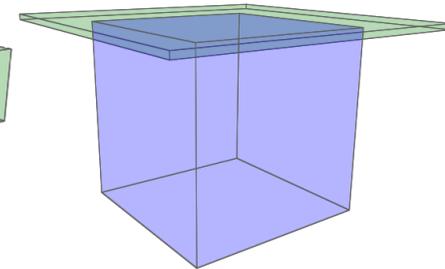
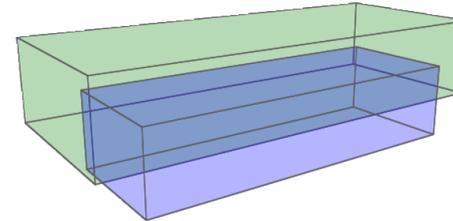
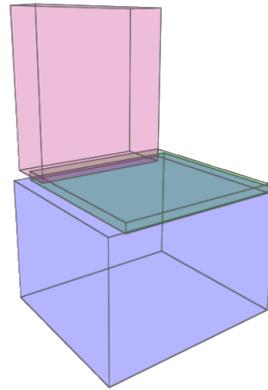
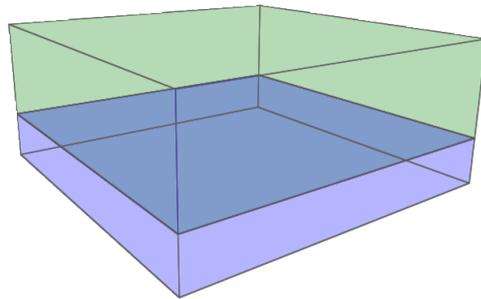
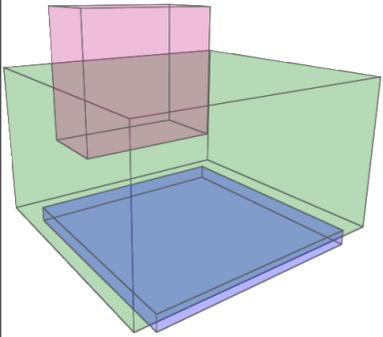
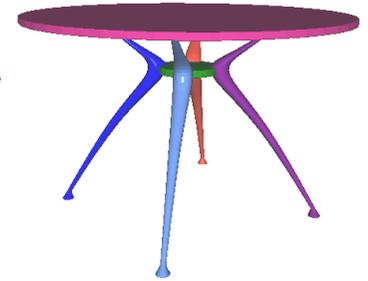
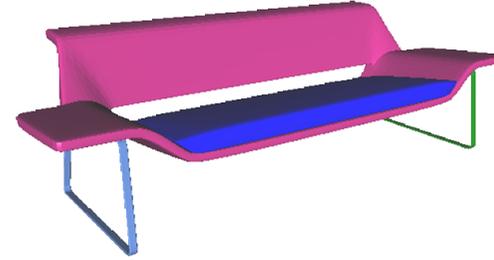
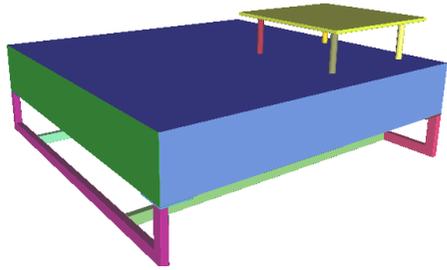


(k) toy plane

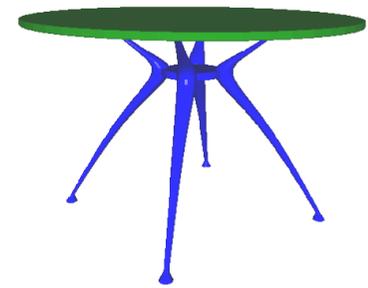
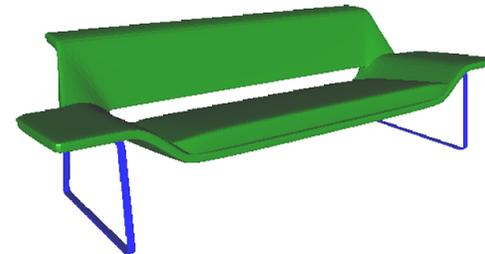
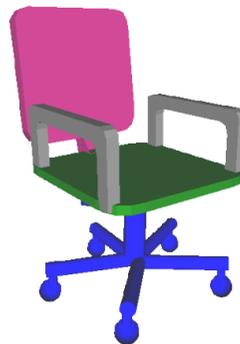
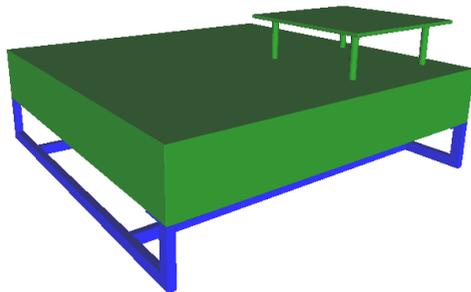
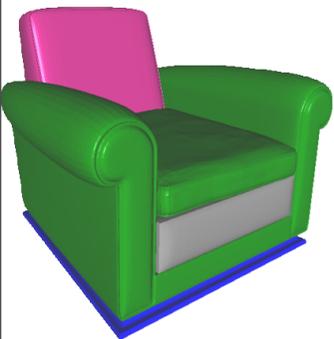
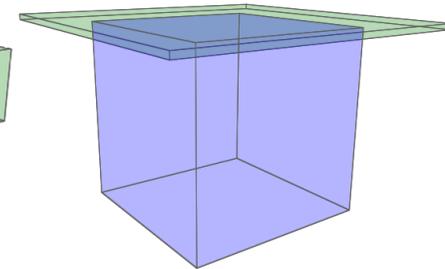
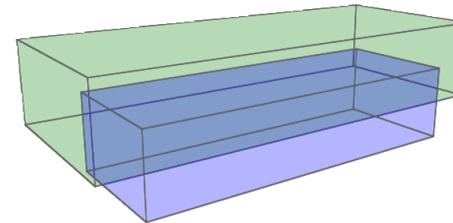
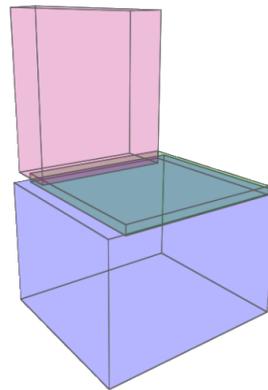
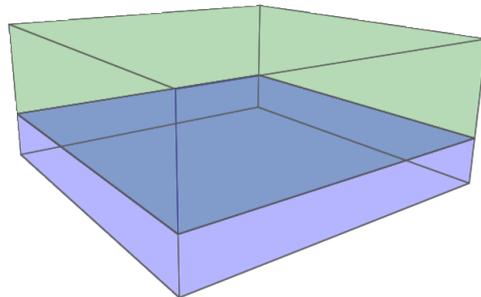
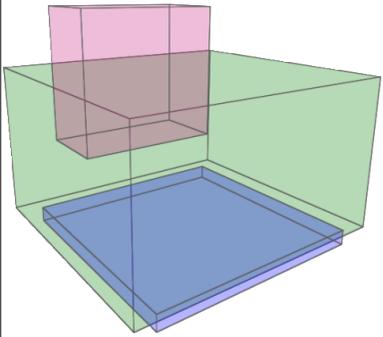
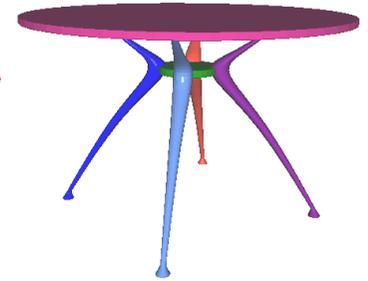
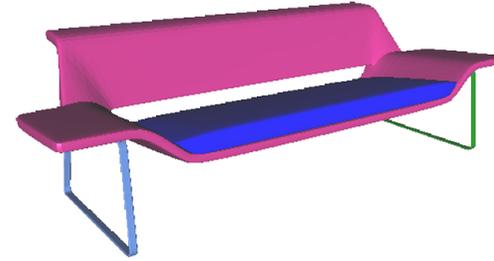
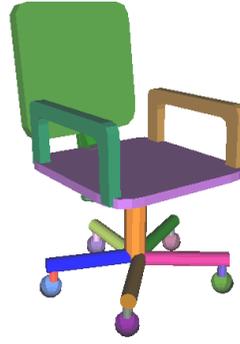
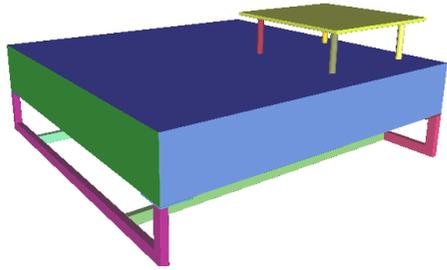
Mixed Models



Mixed Models



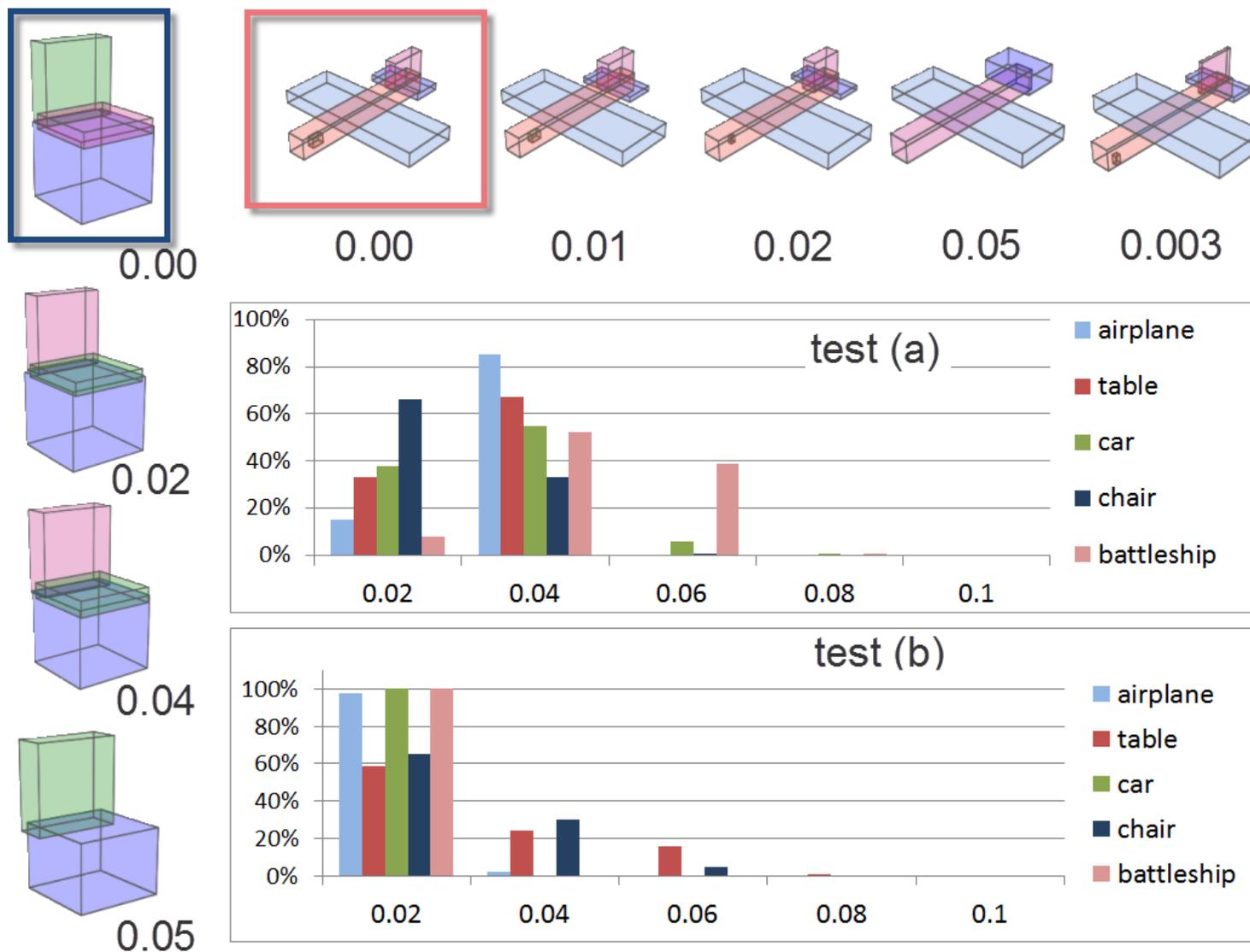
Mixed Models



Comparison

Class	Kim'13	Wang'12	Hu'12	Huang'12	ours
chair	0.59	0.69	0.30	0.83	0.96
bed	0.25	0.27	×	0.65	0.91
inf. bed	0.53	0.36	0.61	0.37	0.71
airplane	0.52	0.36	×	0.58	0.94

Stability of Abstractions



Overview

- Introduction
- Related Works
- Main Idea
- Algorithm
- Results
- Summary and Future work

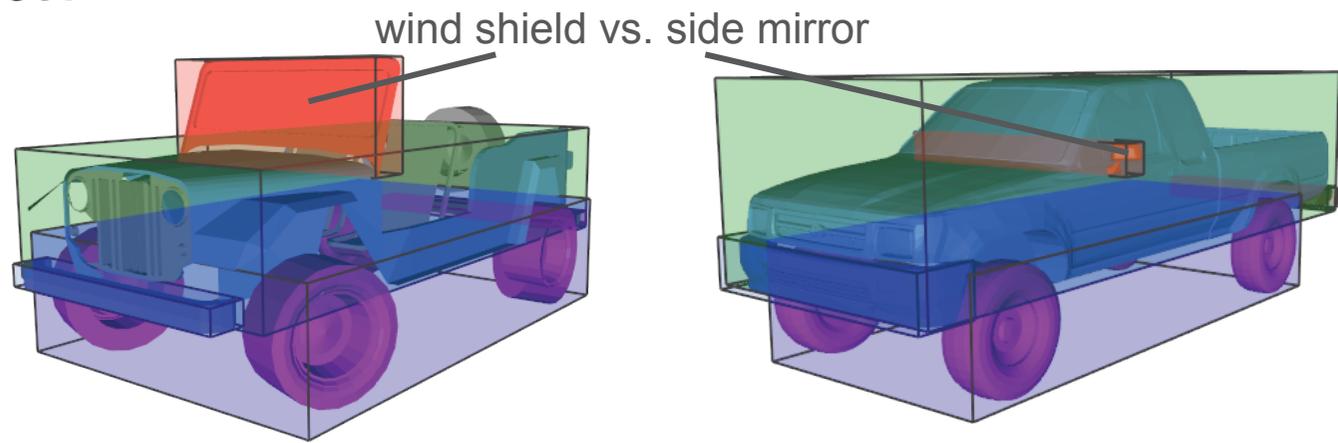
Summary and Future Work

Summary and Future Work

- **Arrangements** relates to shape design and functionalities
 - How parts are *arranged*?
 - How parts *interact*?

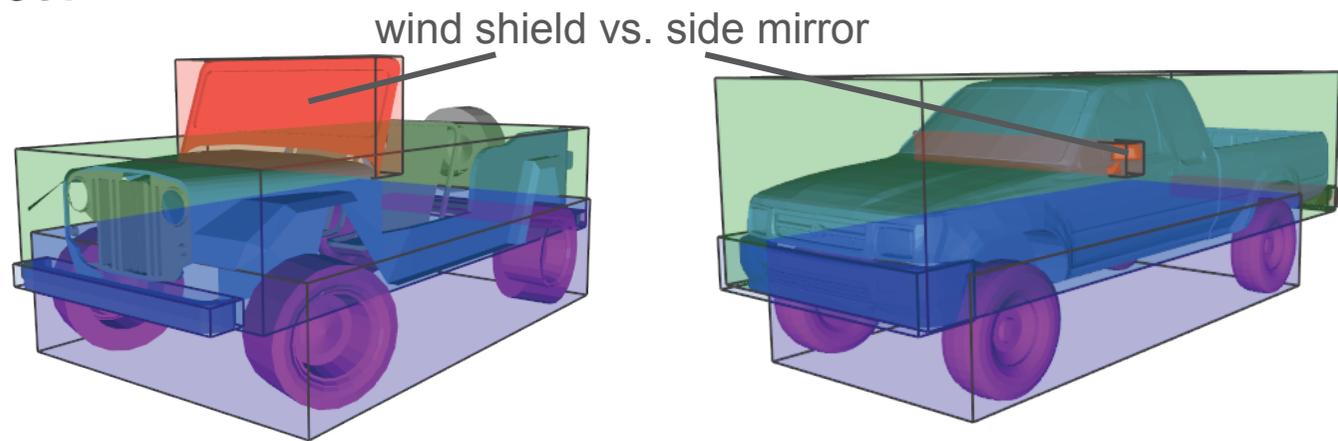
Summary and Future Work

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Summary and Future Work

- **Arrangements** relates to shape design and functionalities
 - How parts are *arranged*?
 - How parts *interact*?



- Beyond **pairwise arrangements**?
 - Structural invariant
 - Pattern relations across shape families

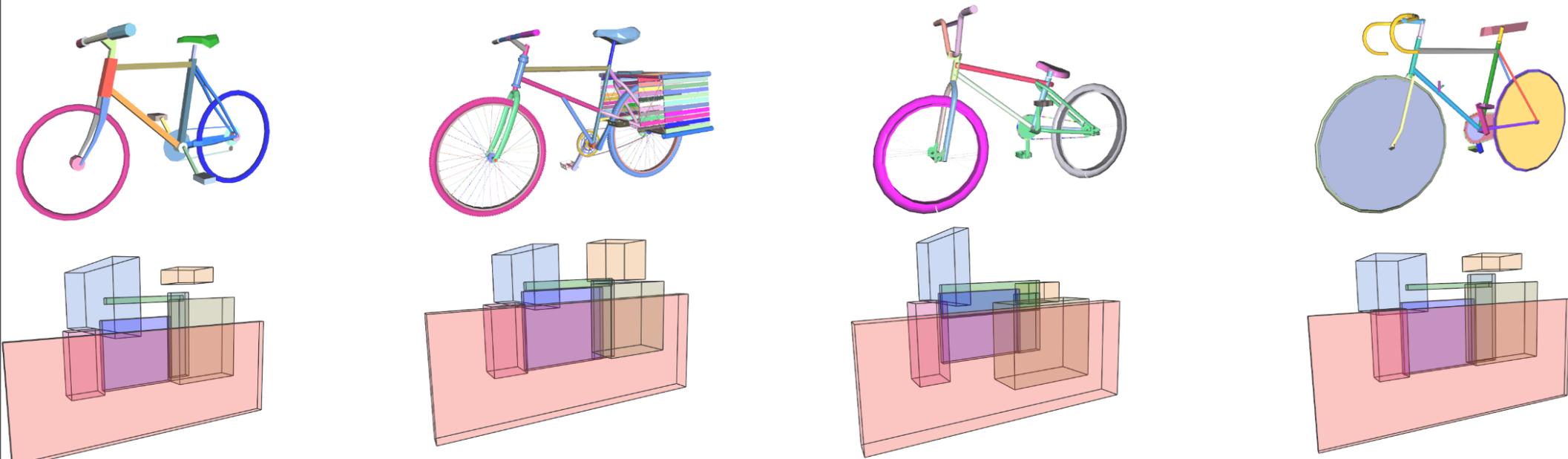
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Thank You!!



<http://geometry.cs.ucl.ac.uk/>

(code + data available)