

# Recurring Part Arrangements in Shape Collections

**Youyi Zheng**



**Daniel Cohen-Or**

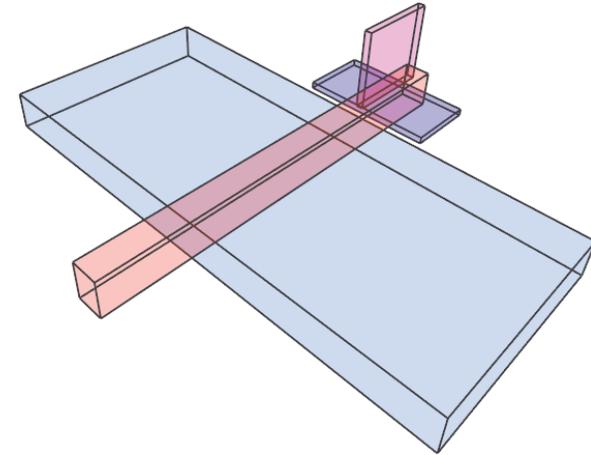


**Melinos Averkiou**



**Niloy J. Mitra**





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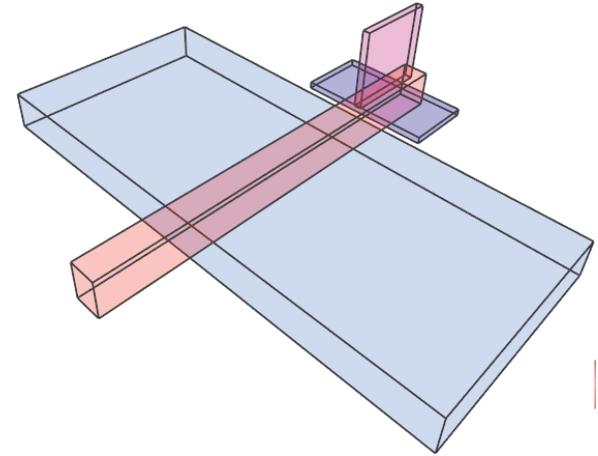
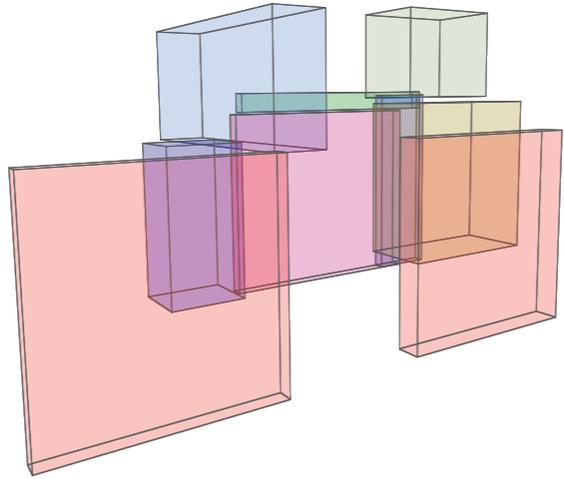


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# *Data* → *Knowledge*?

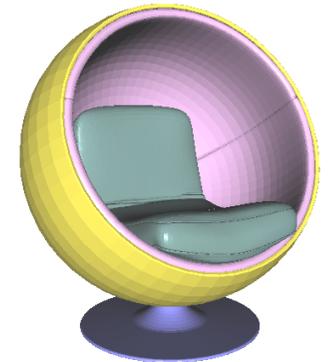
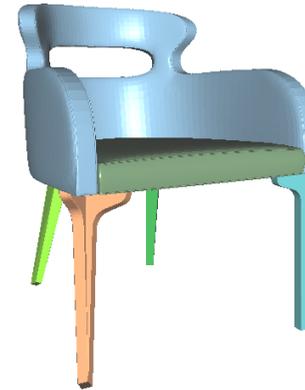
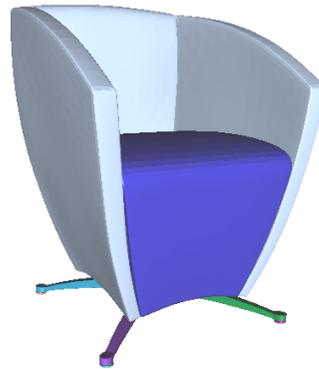
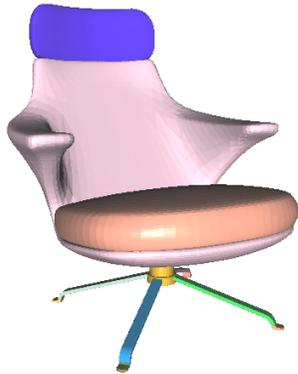


# *Data* → *Knowledge*?

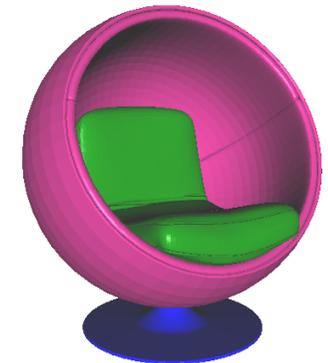
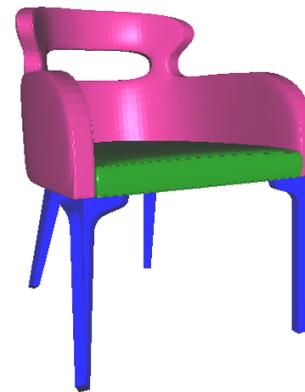
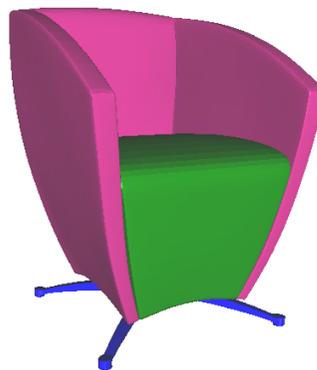
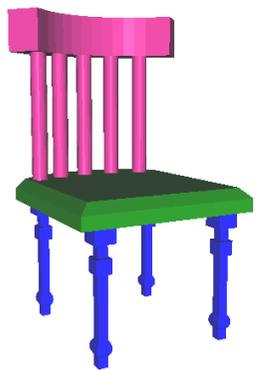
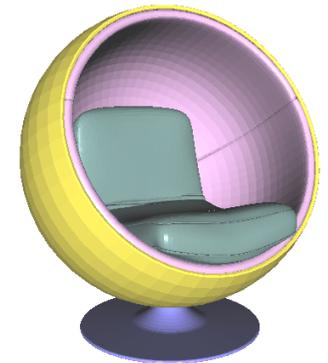
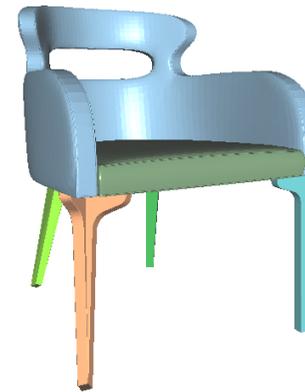
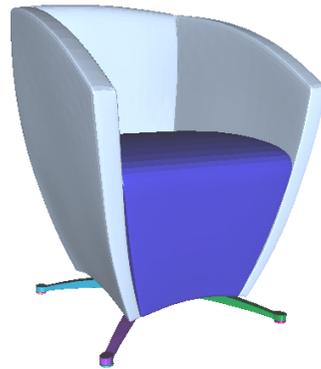
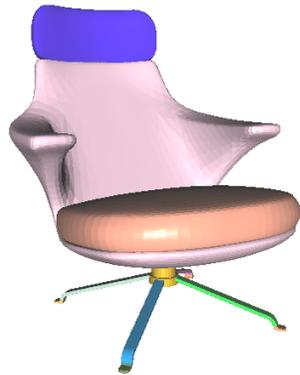


***geometric differences can hide functional correlation***

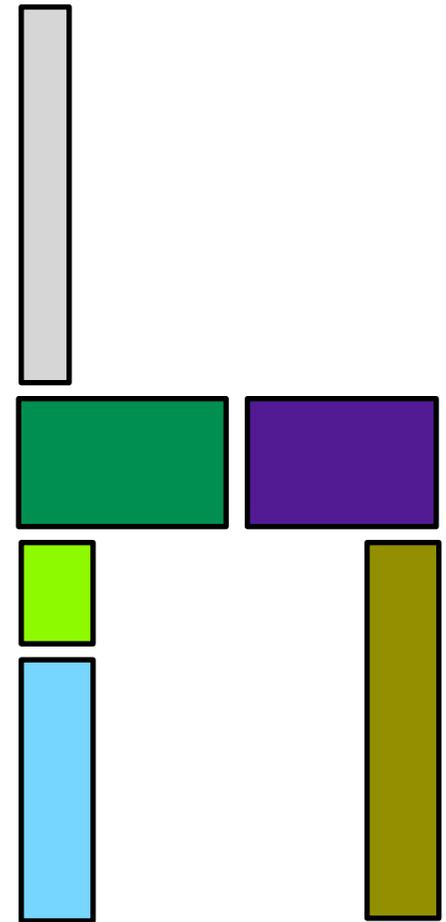
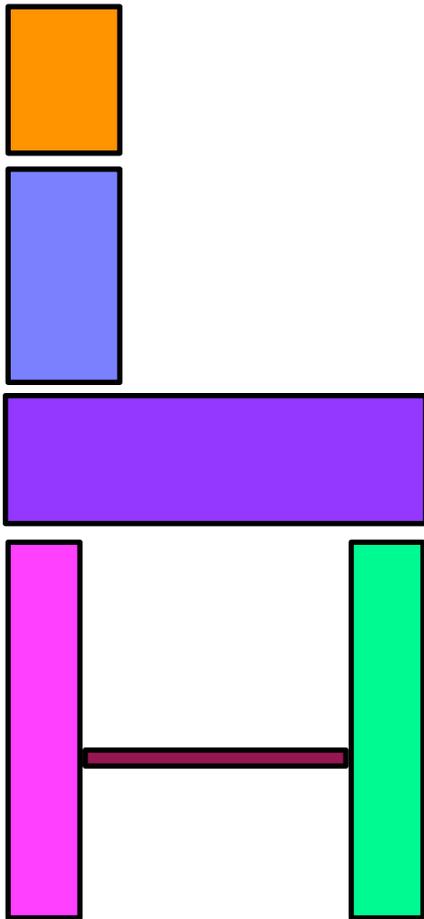
# Goal



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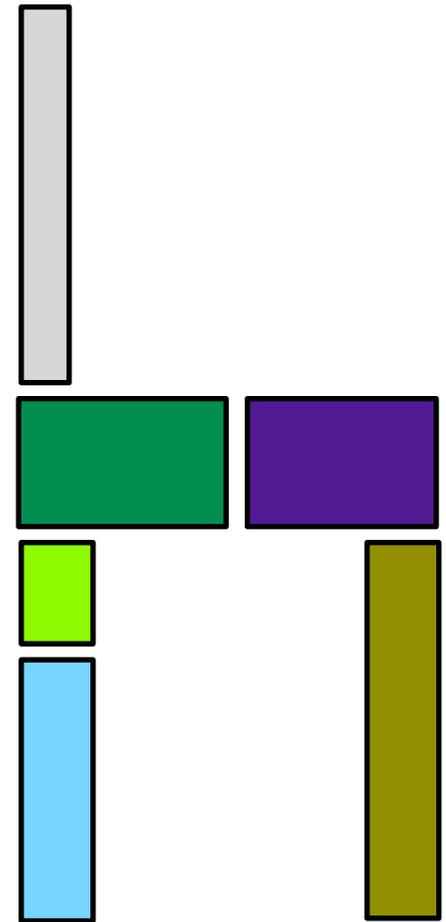
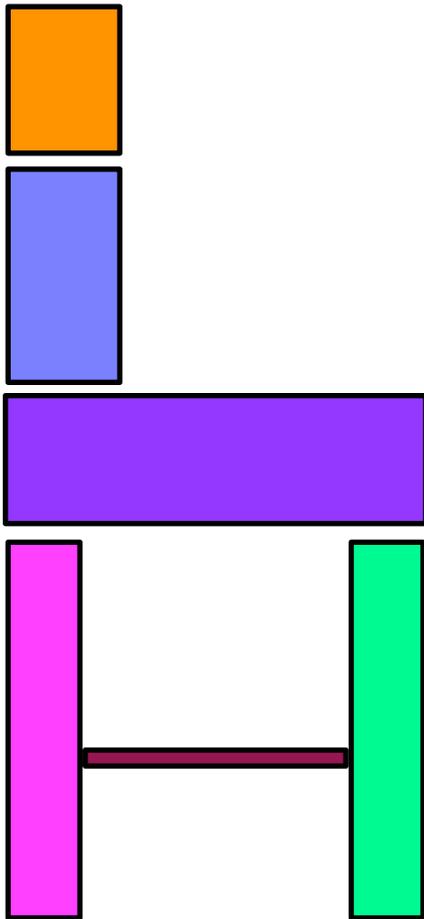


# Where is the Challenge?



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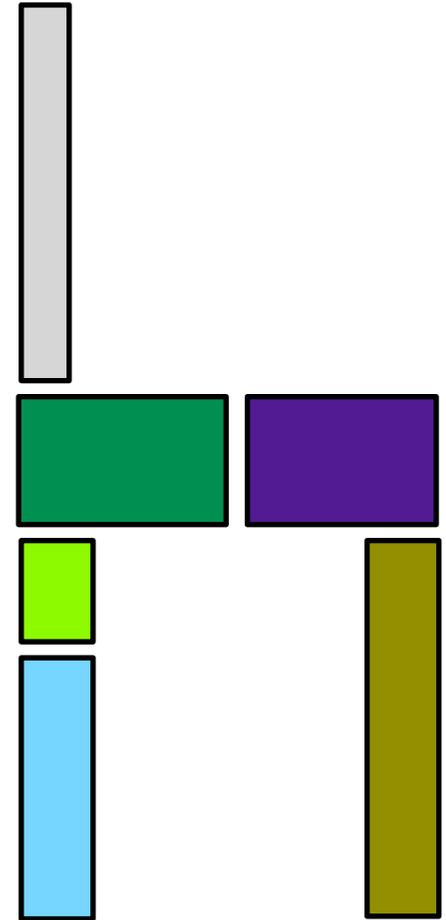
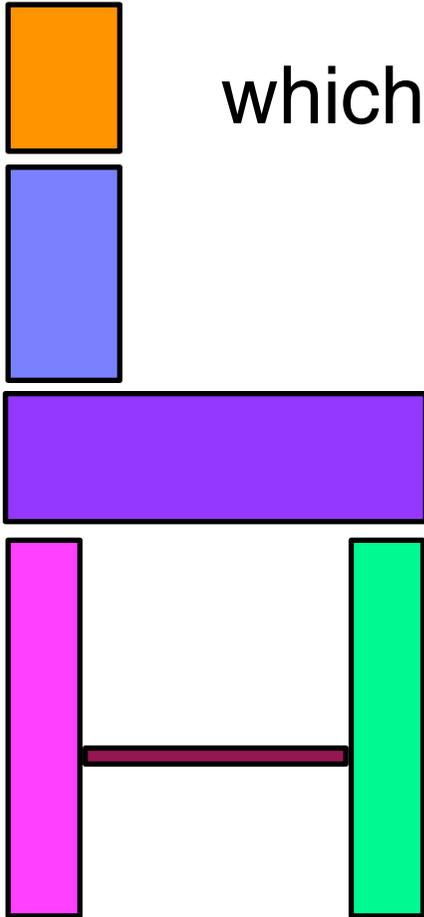
how to compare parts?



# Where is the Challenge?

how to compare parts?

which parts are in correspondence?

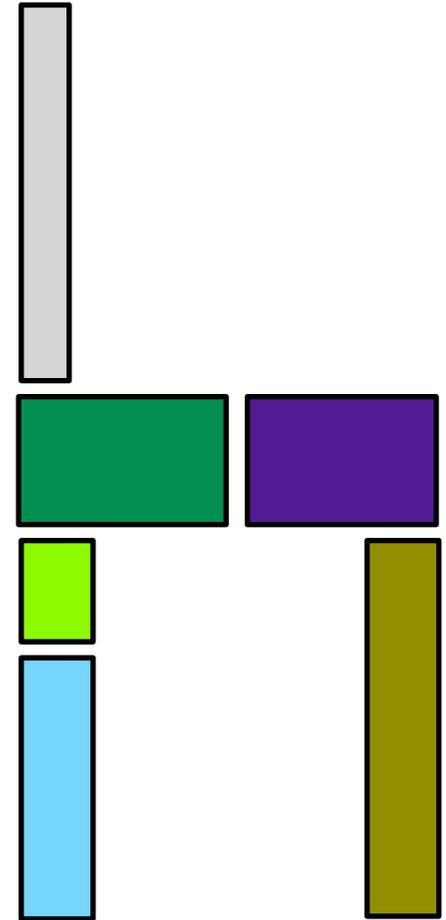
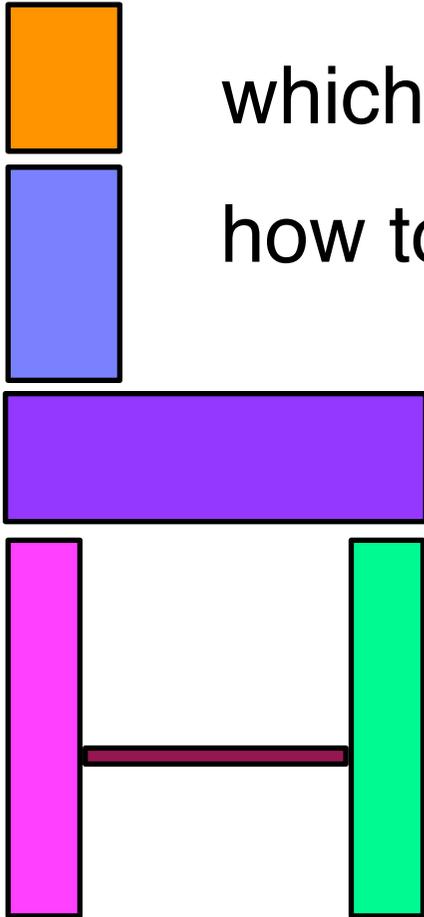


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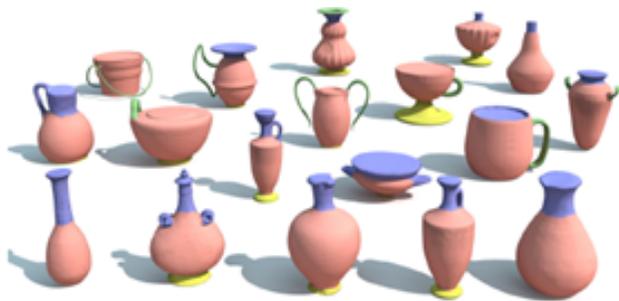
how to merge the parts?



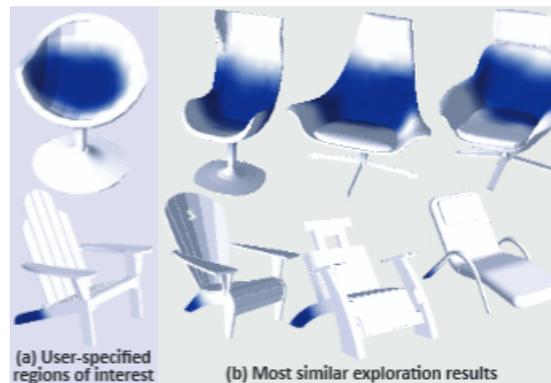
- Introduction
- Related Works
- Main Idea
- Algorithm
- Results
- Limitations and Future work

# Relation to Co-segmentation

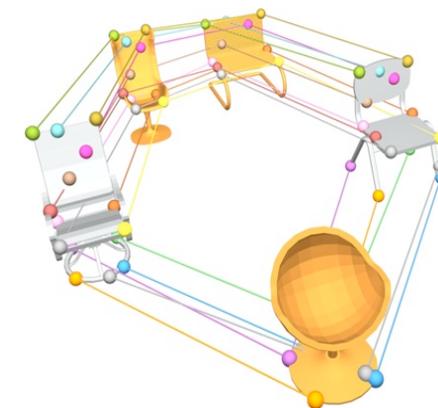
*supervised and/or use **geometric descriptors***



Wang et al. 2012



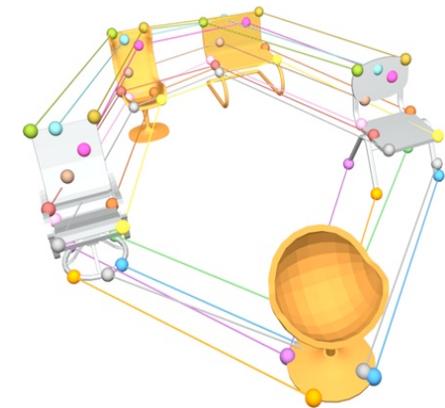
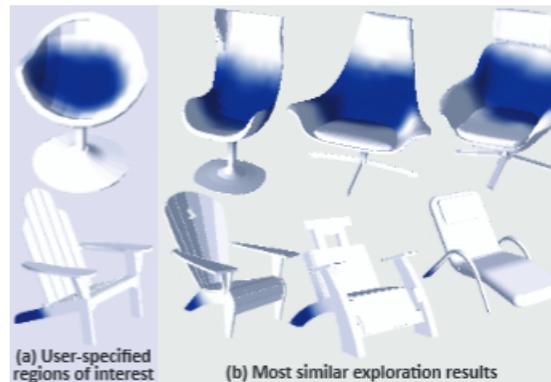
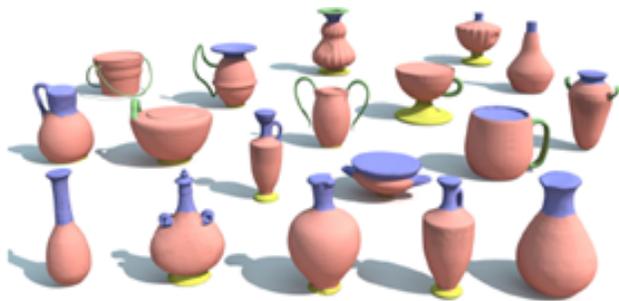
Kim et al. 2012, 2013



Huang et al. 2012

# Relation to Co-segmentation

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



Wang et al. 2012

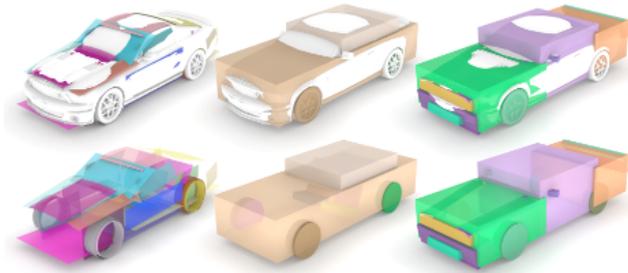
Kim et al. 2012, 2013

Huang et al. 2012



# Relation to Co-analysis

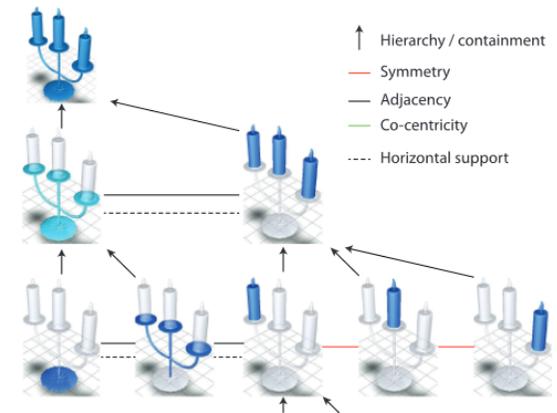
*applications in synthesis, semantics*



Yumer et al. 2012



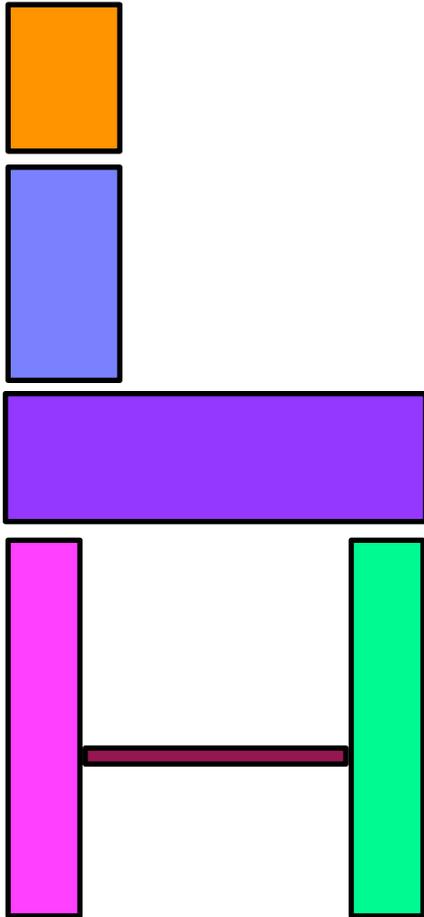
Kalogerakis et al. 2012



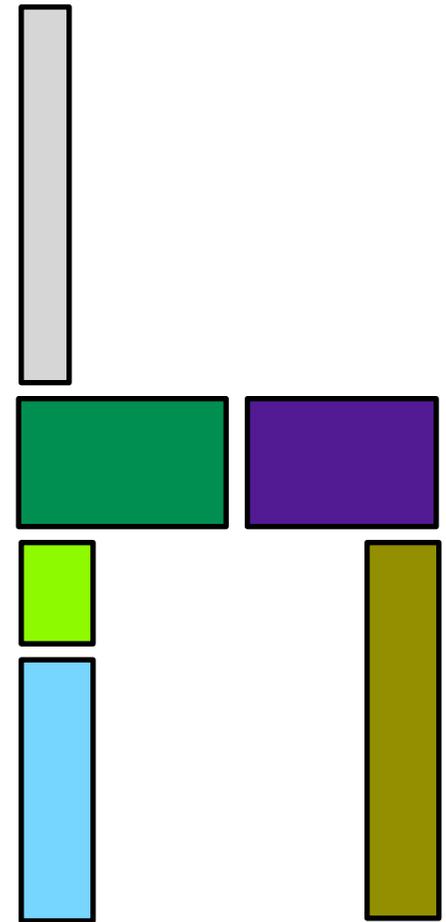
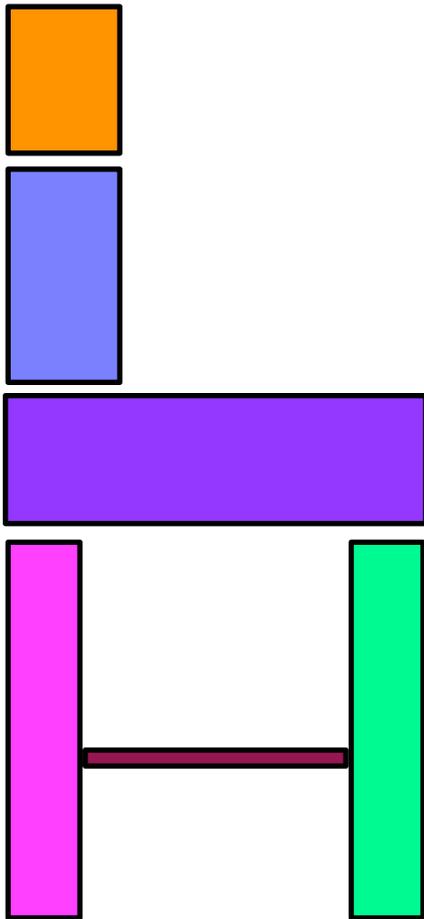
Laga et al. 2013

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

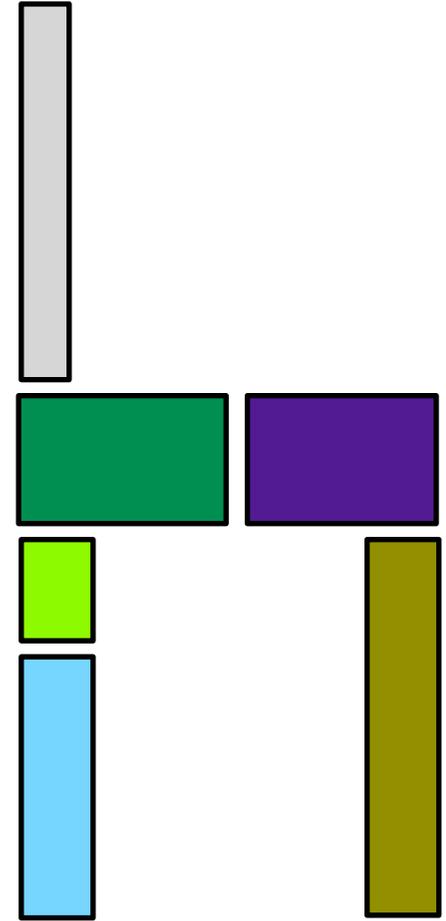
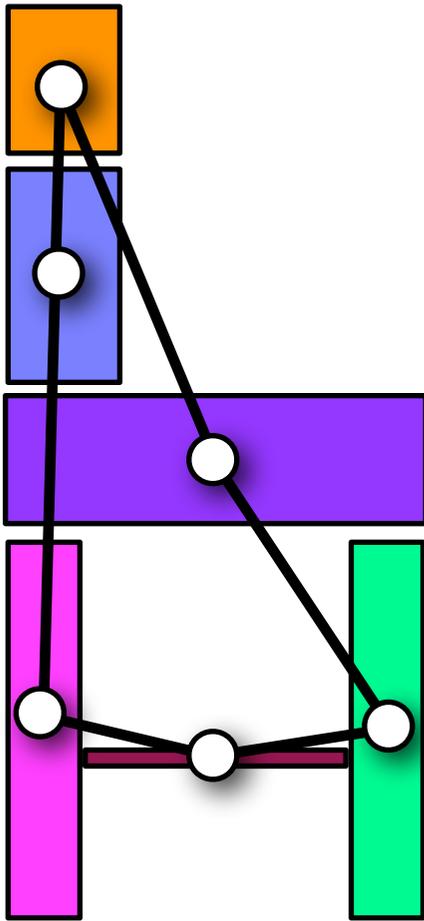
# Graph Abstraction



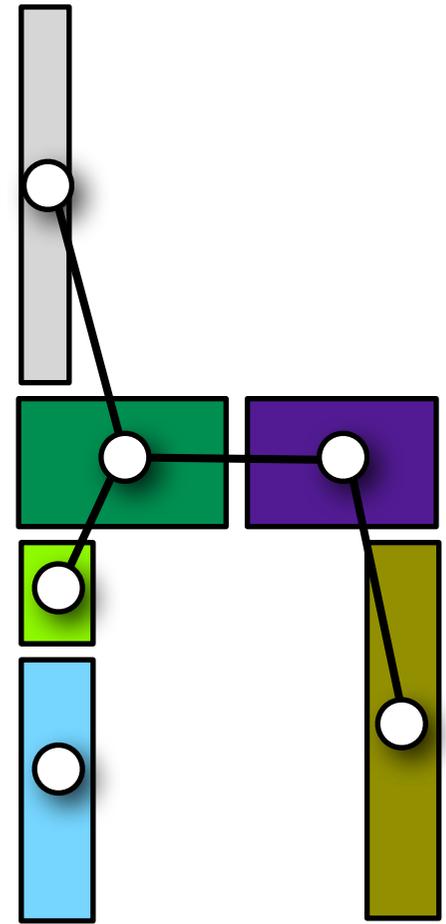
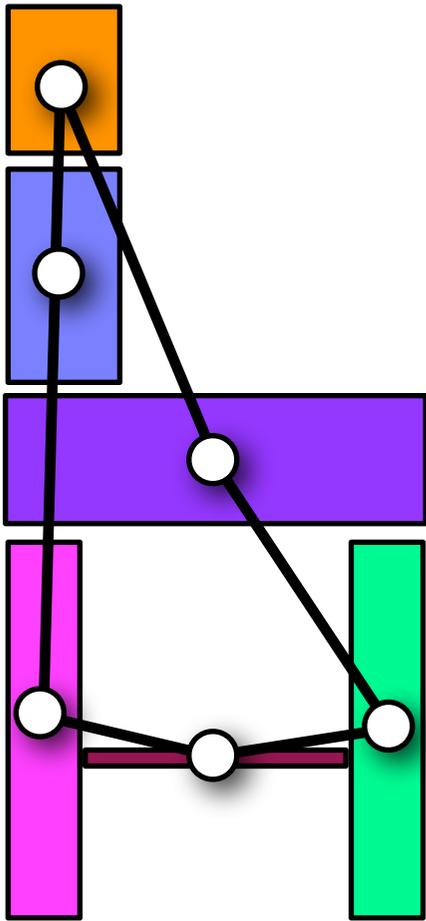
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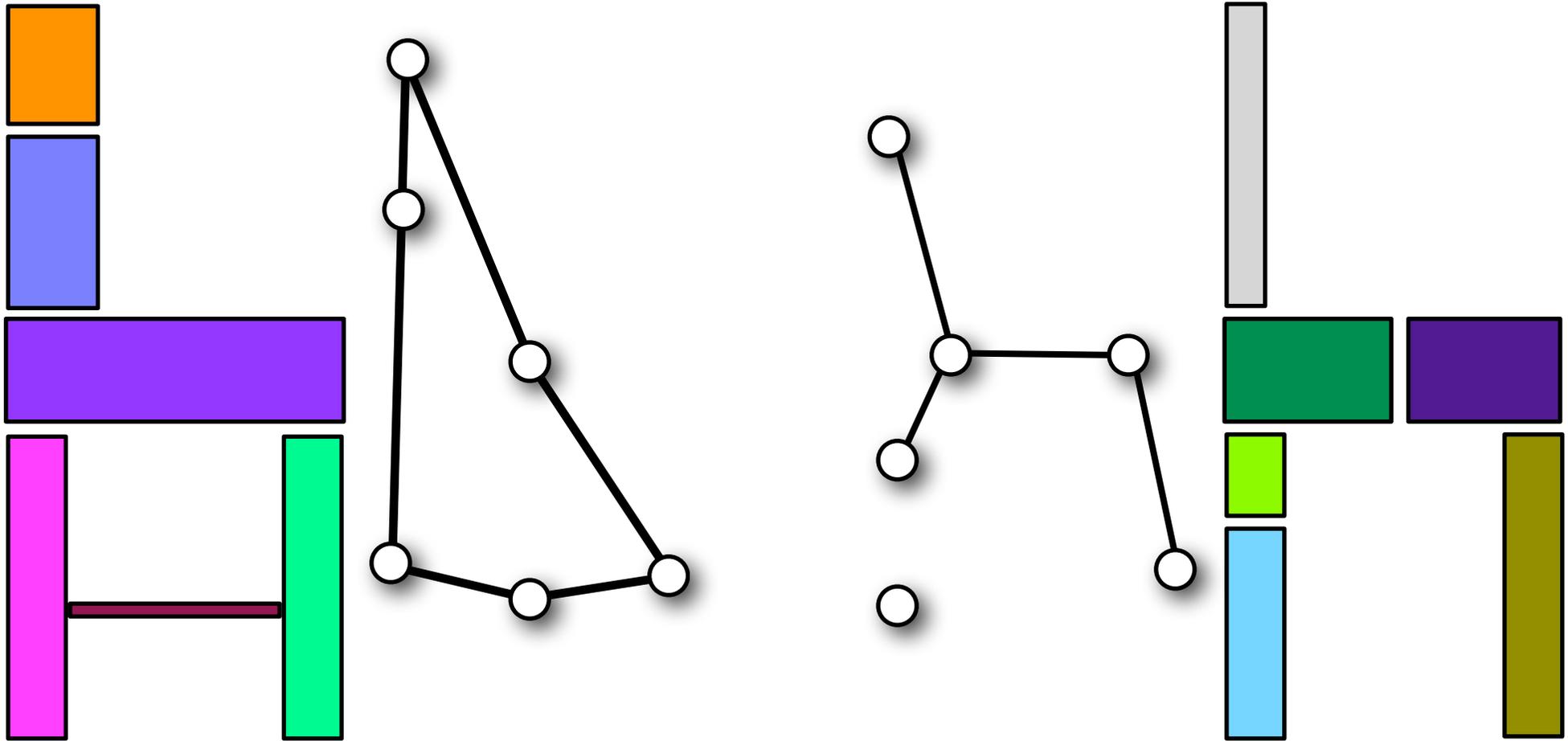
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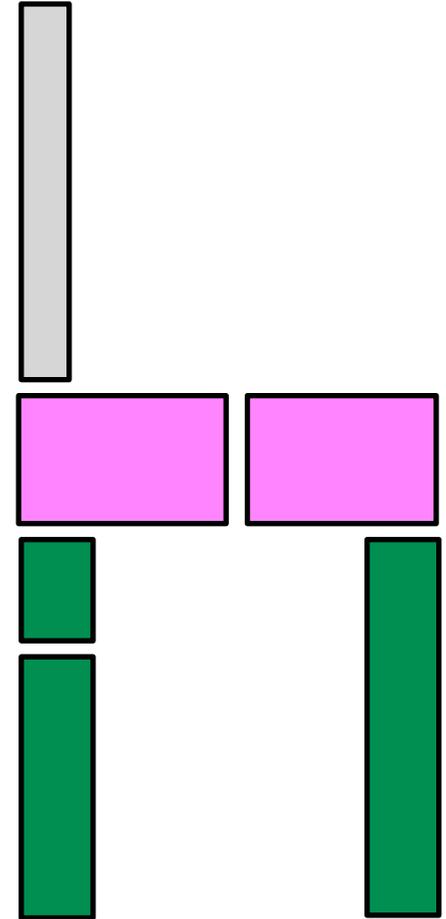
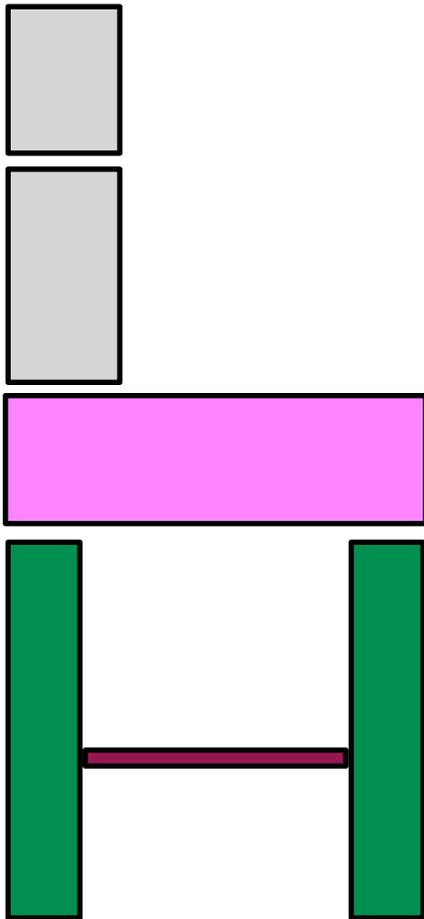
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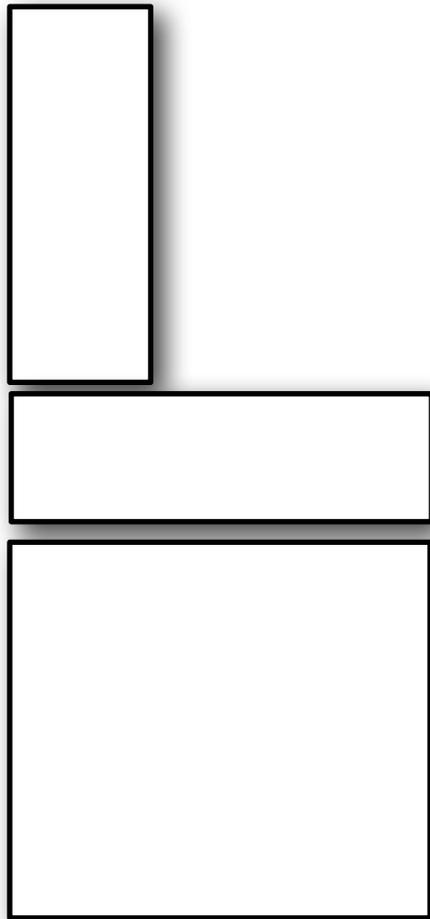
# Graph Abstraction



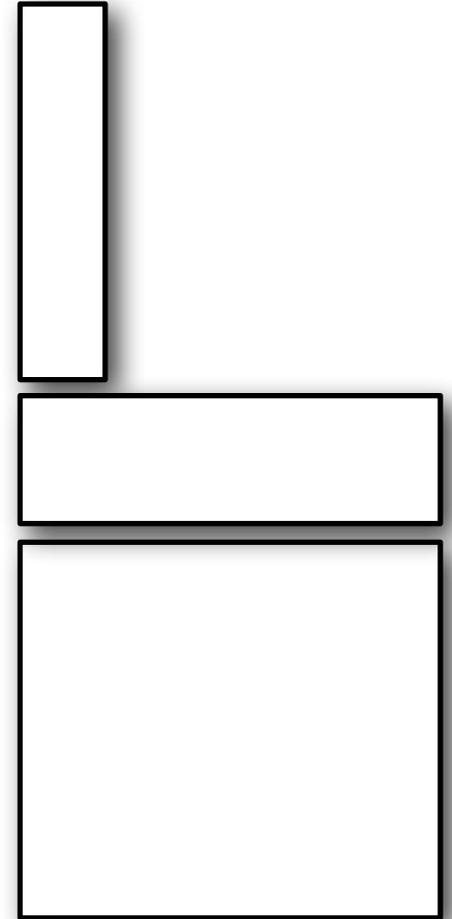
# For the Correct Grouping



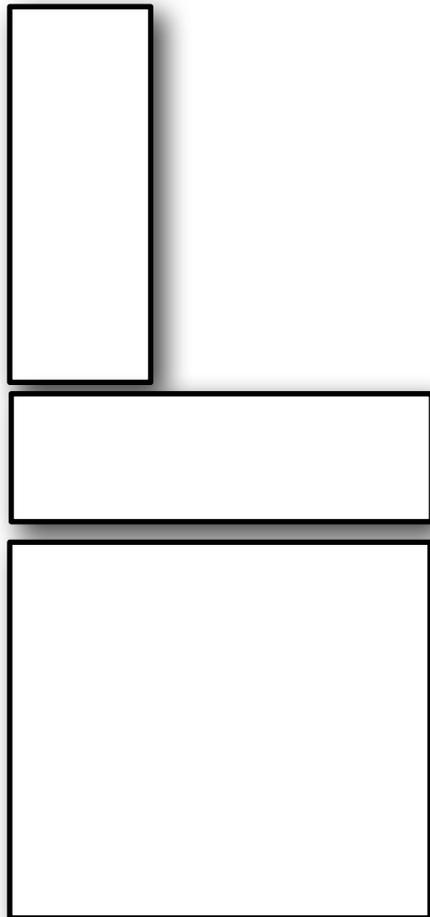
# Focus on Arrangements



regroup parts

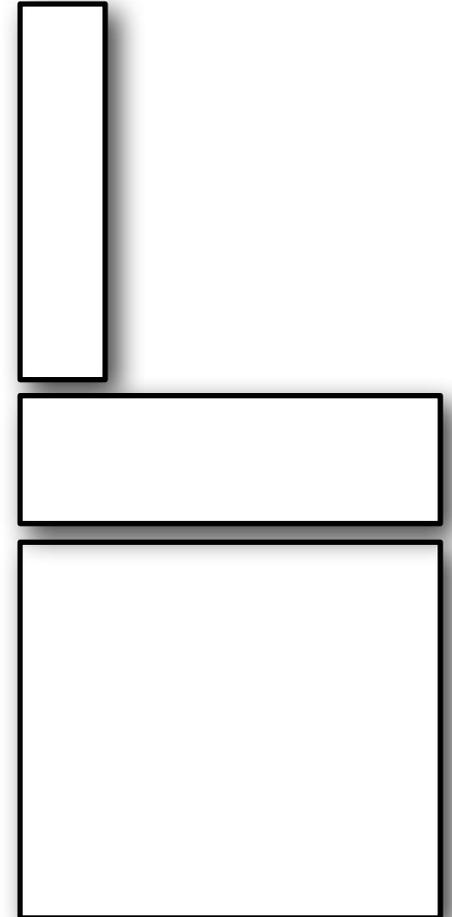


# Focus on Arrangements

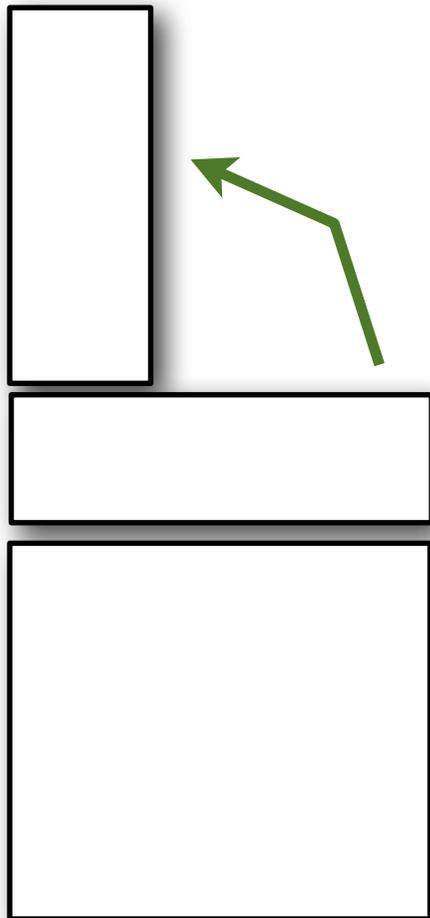


regroup parts

compare *without*  
using correspondence

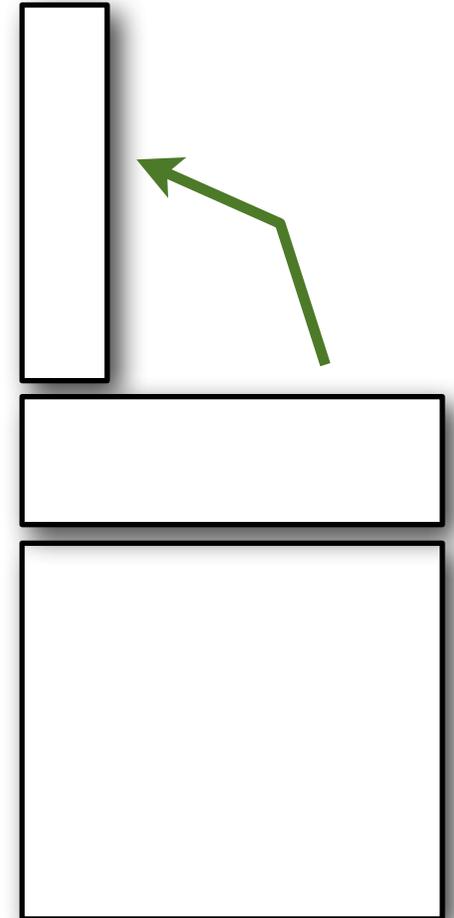


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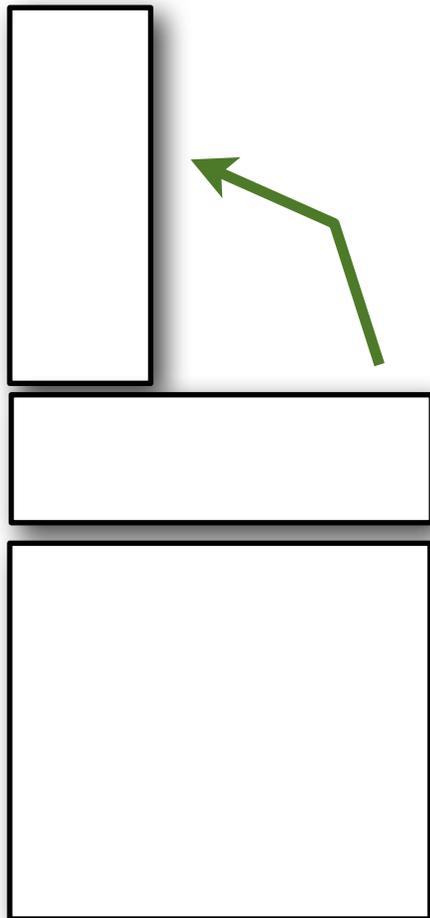


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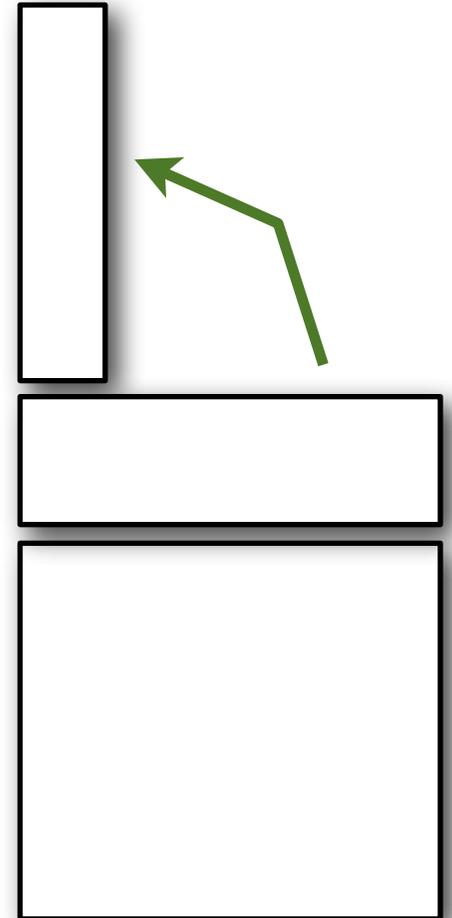
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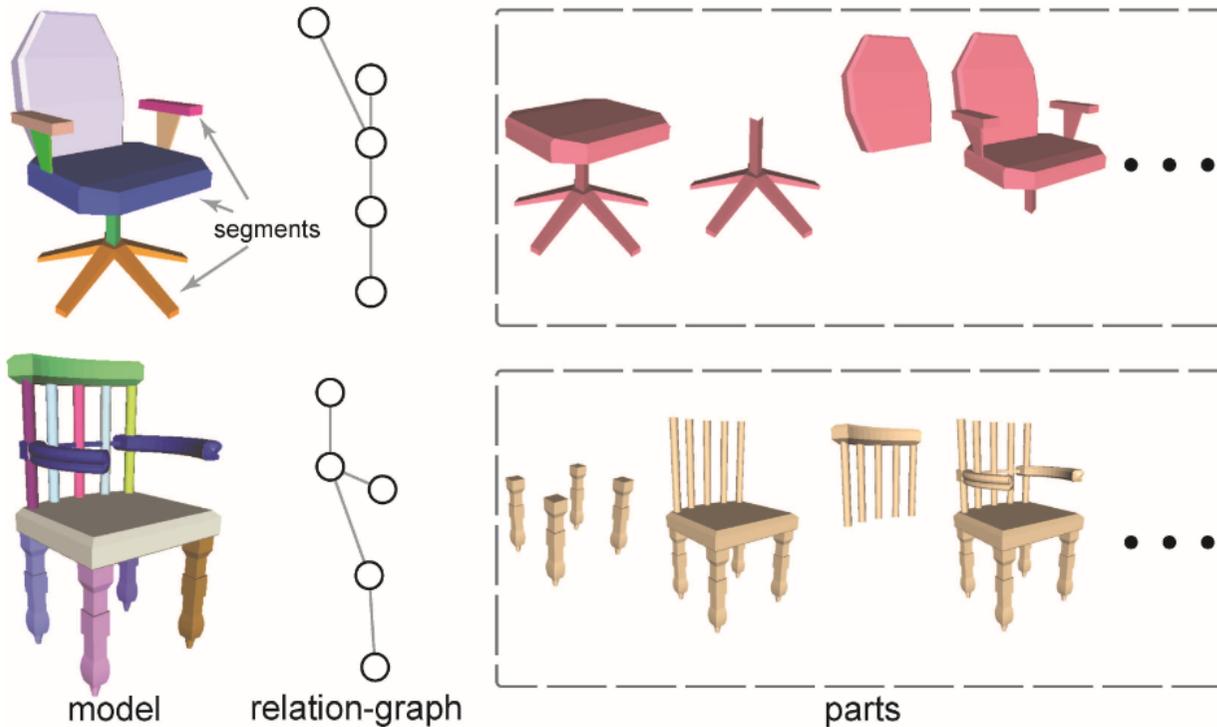
regroup parts

compare *without*  
using correspondence

*relative arrangement*

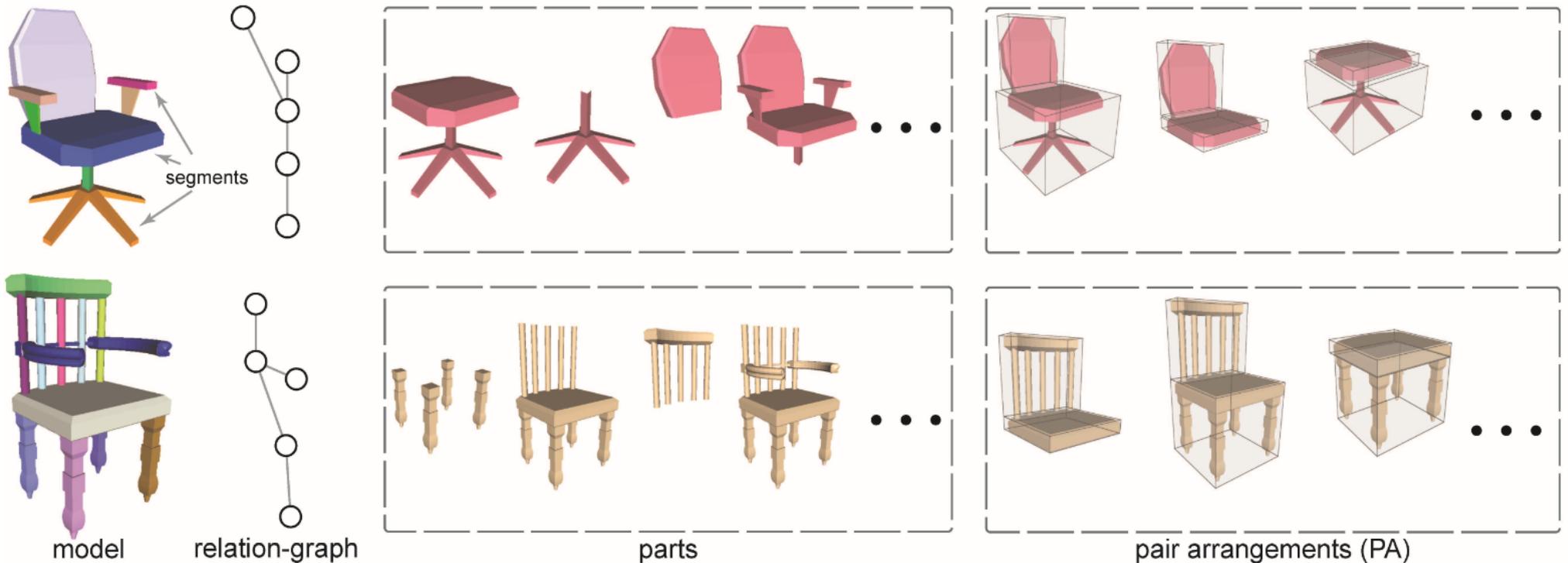


# Part Arrangements



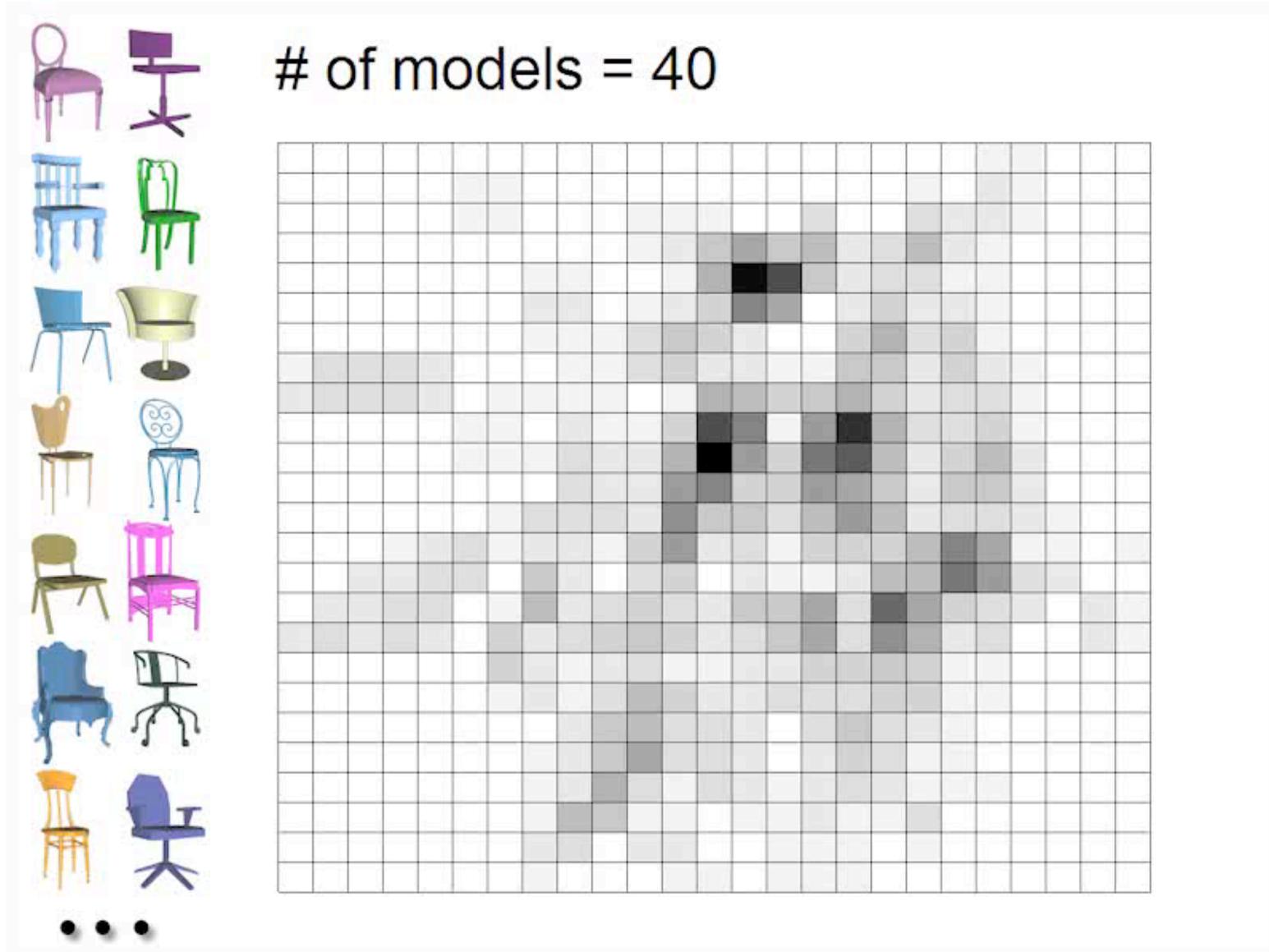
- Components form parts
- Parts from arrangements

# Pair Arrangements



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

# Arrangements Recur!



# Arrangements Recur!



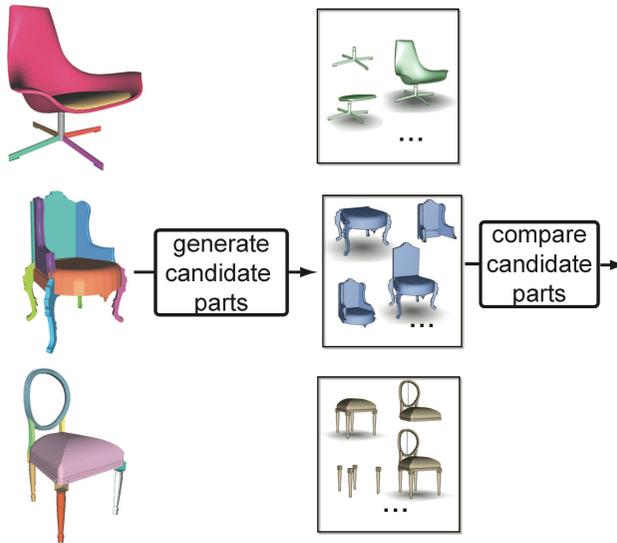
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# Algorithm



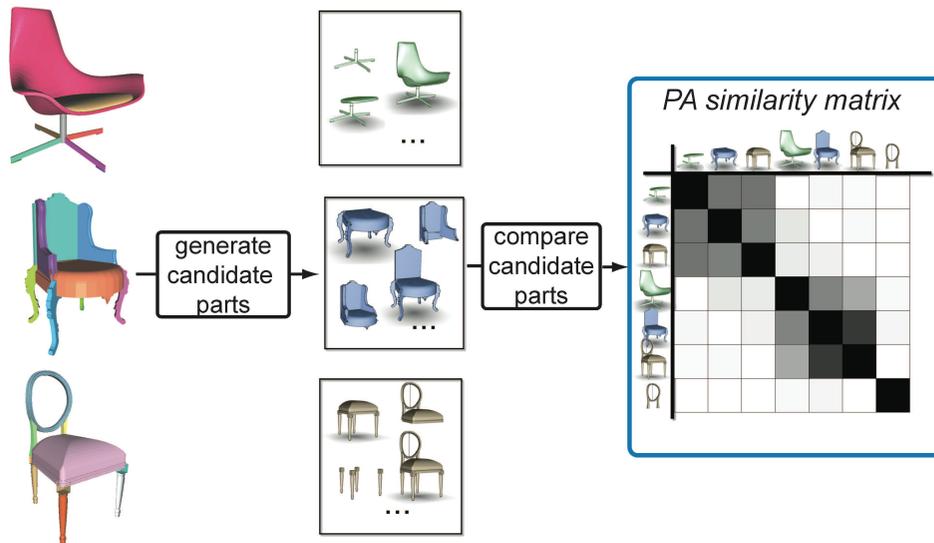
– Candidate *PA*-s generation

# Algorithm



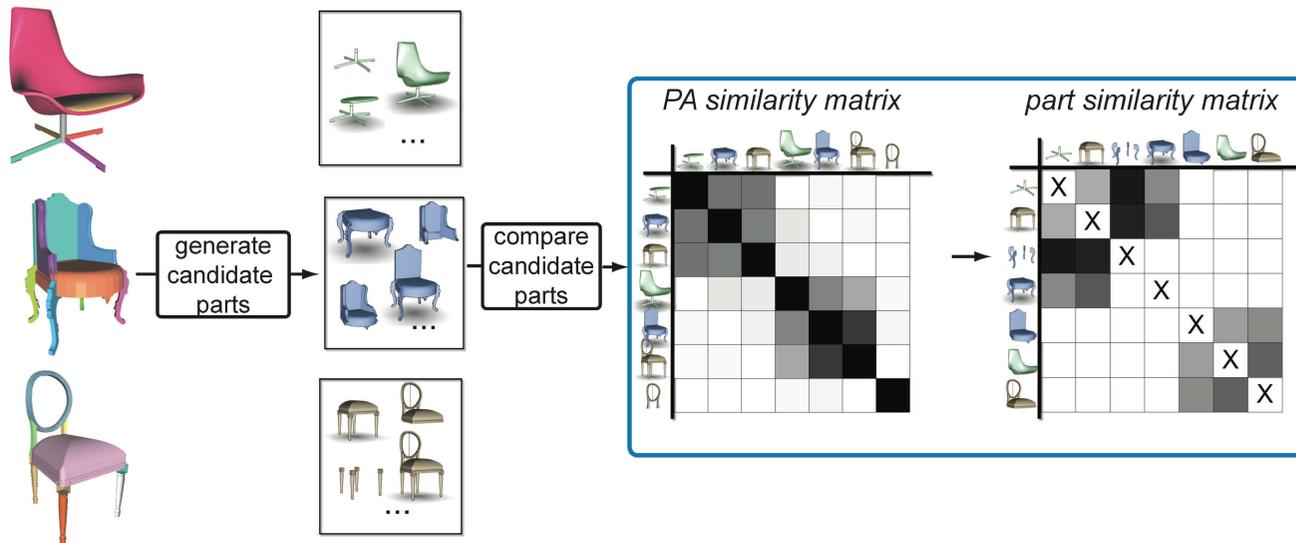
- Candidate *PA*-s generation
- Comparing *PA*-s

# Algorithm



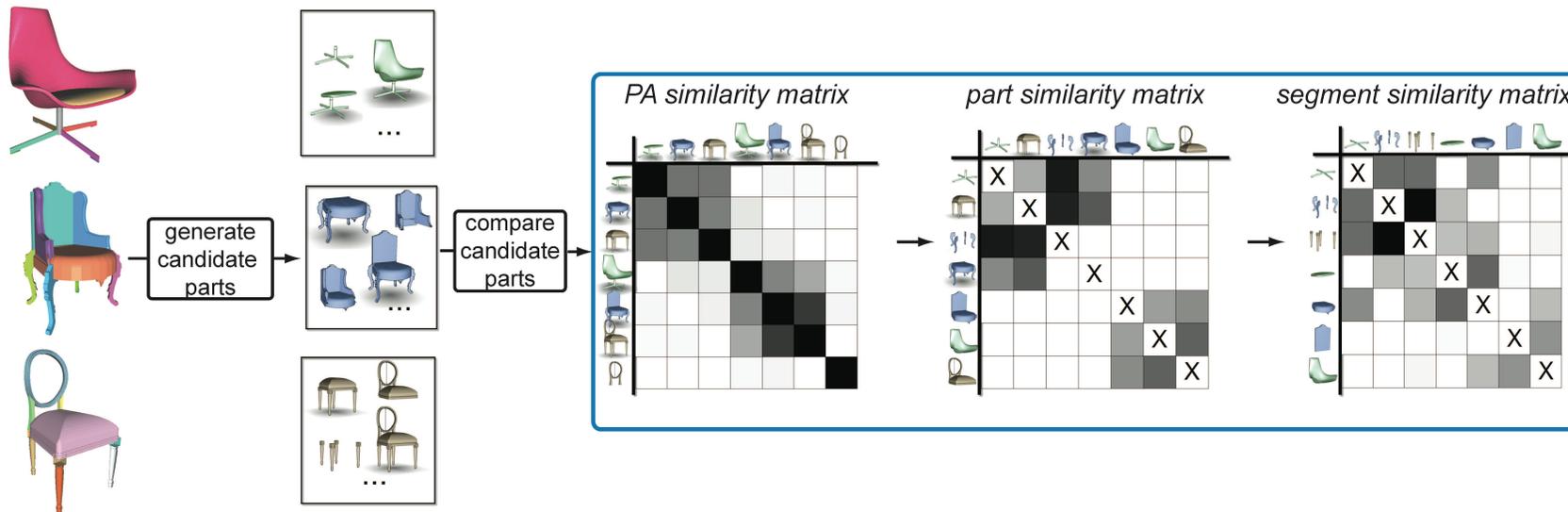
- Candidate *PA*-s generation
- Comparing *PA*-s
  - *PA* similarity matrix (M1)

# Algorithm



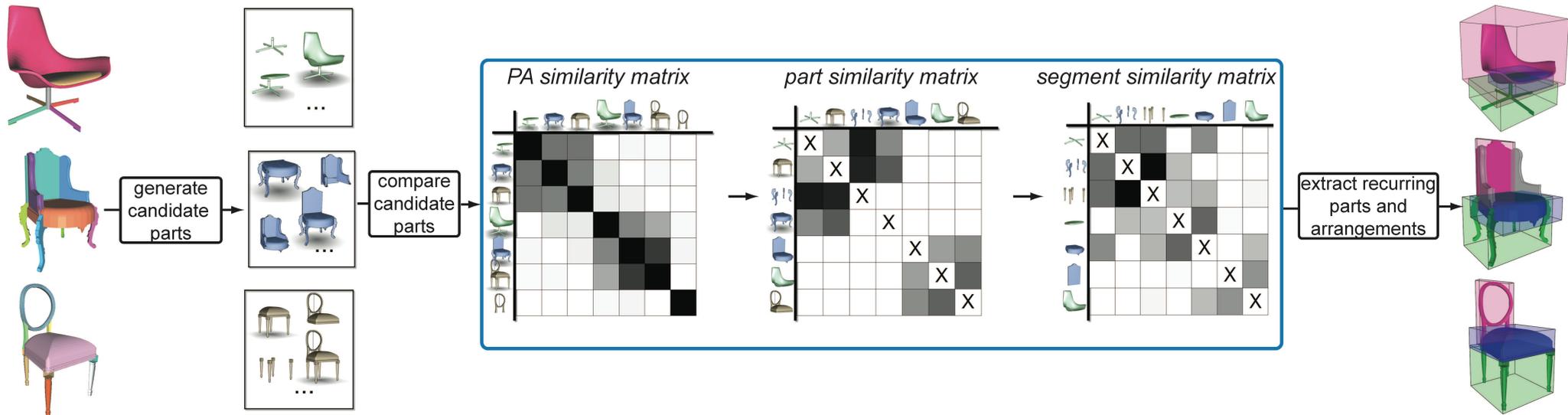
- Candidate *PA*-s generation
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  - Part similarity matrix (M2)

# Algorithm



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

# Algorithm

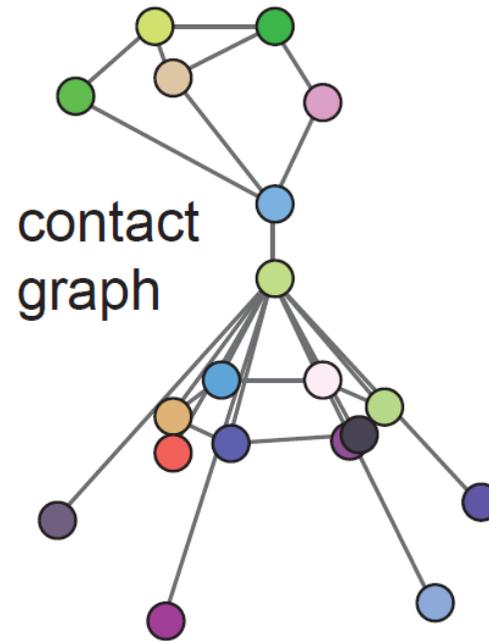
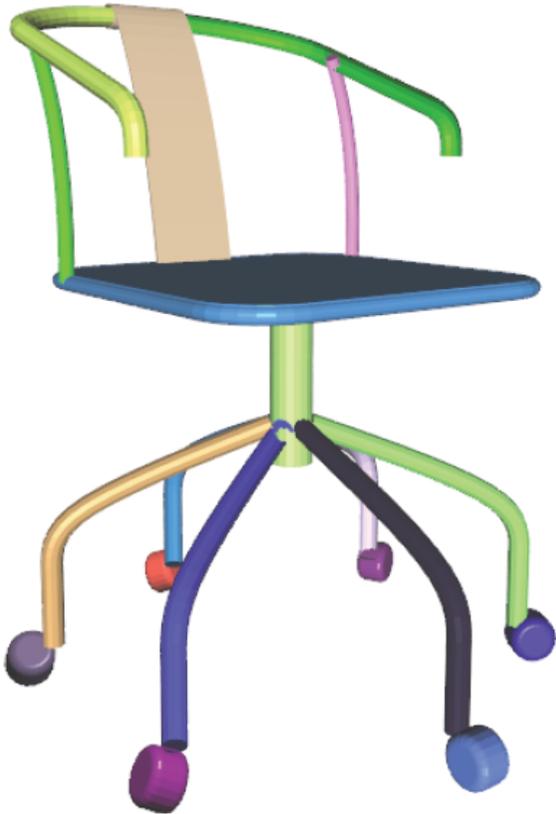


- Candidate *PA*-s generation
- Comparing *PA*-s
  - *PA* similarity matrix (M1)
  - Part similarity matrix (M2)
  - Component similarity matrix (M3)
- Recurring Arrangements Extraction

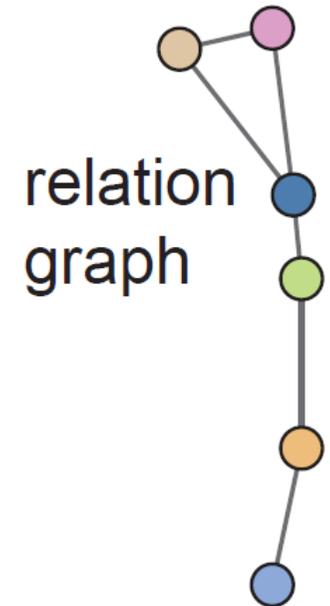
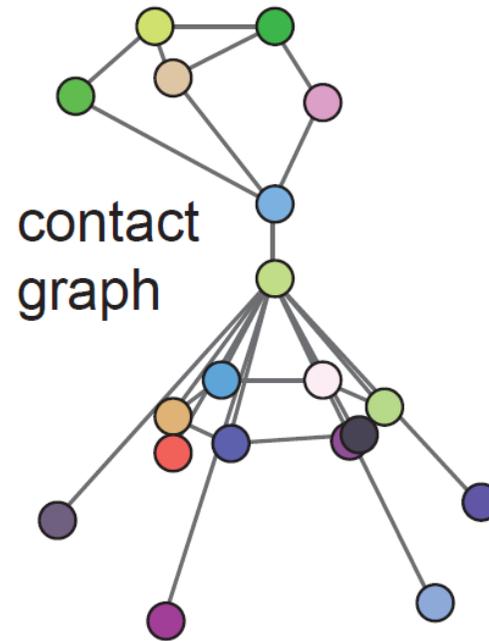
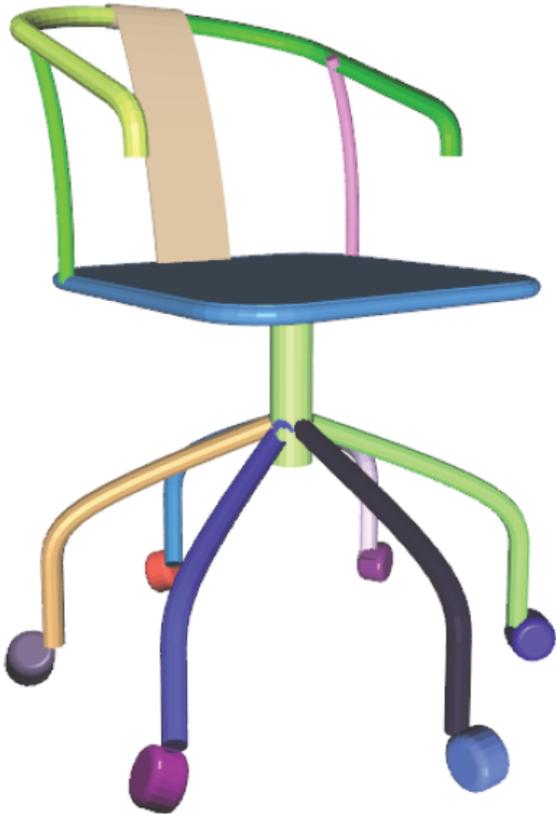
# Relation Graph



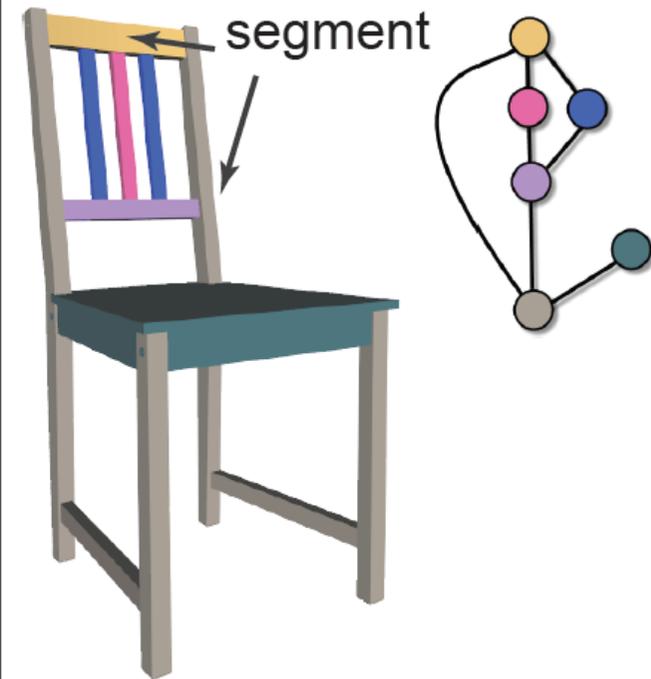
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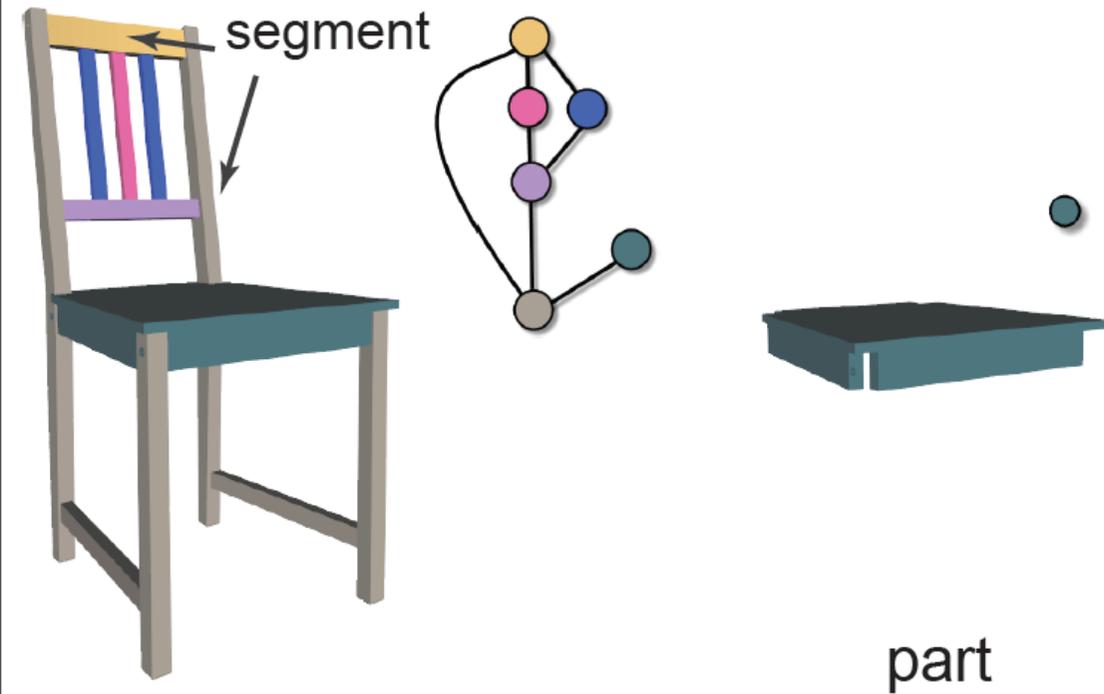
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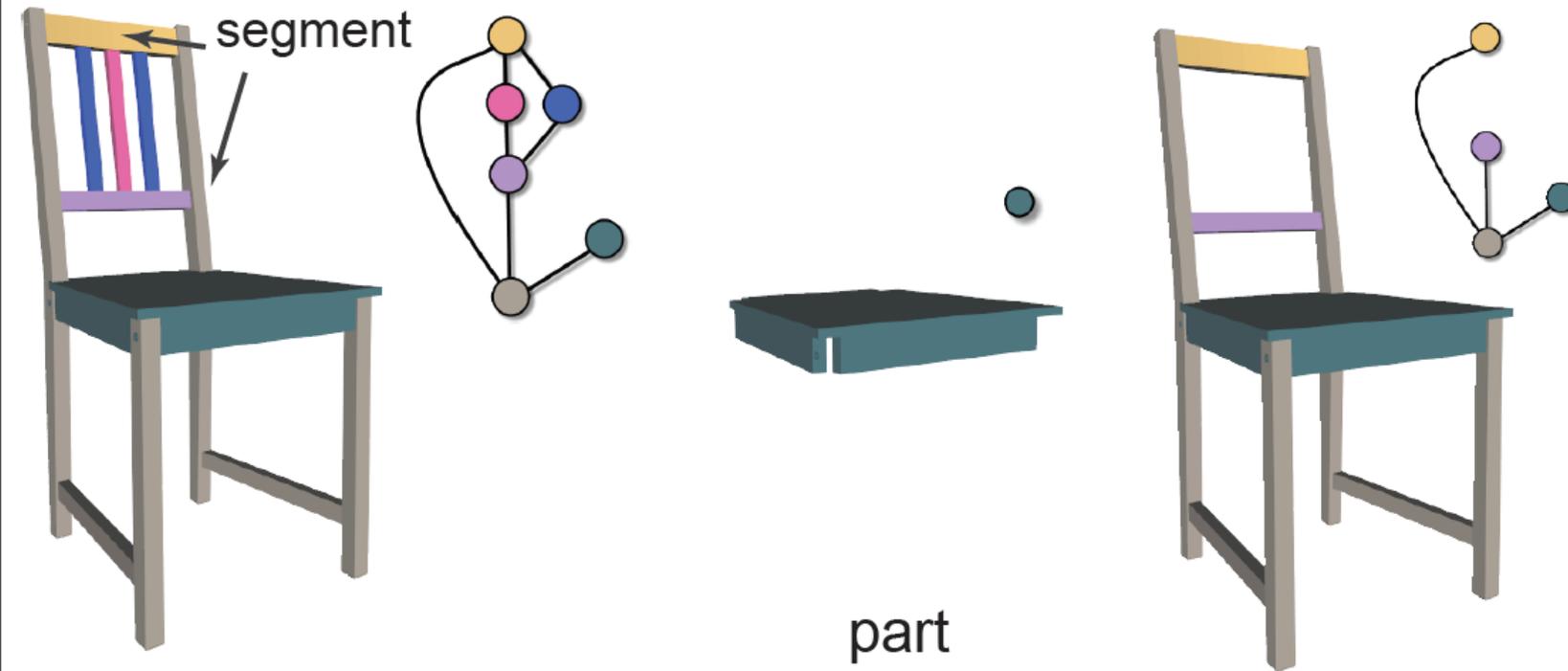
# What are Valid Parts?



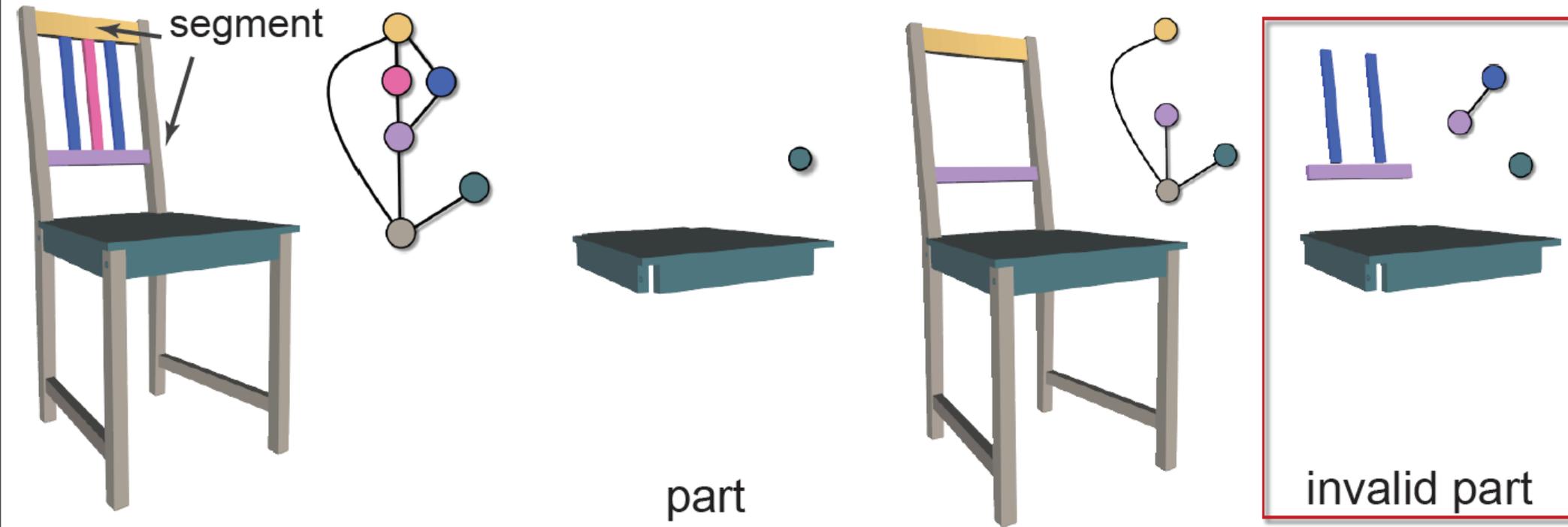
# What are Valid Parts?



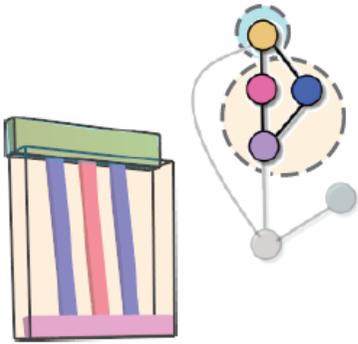
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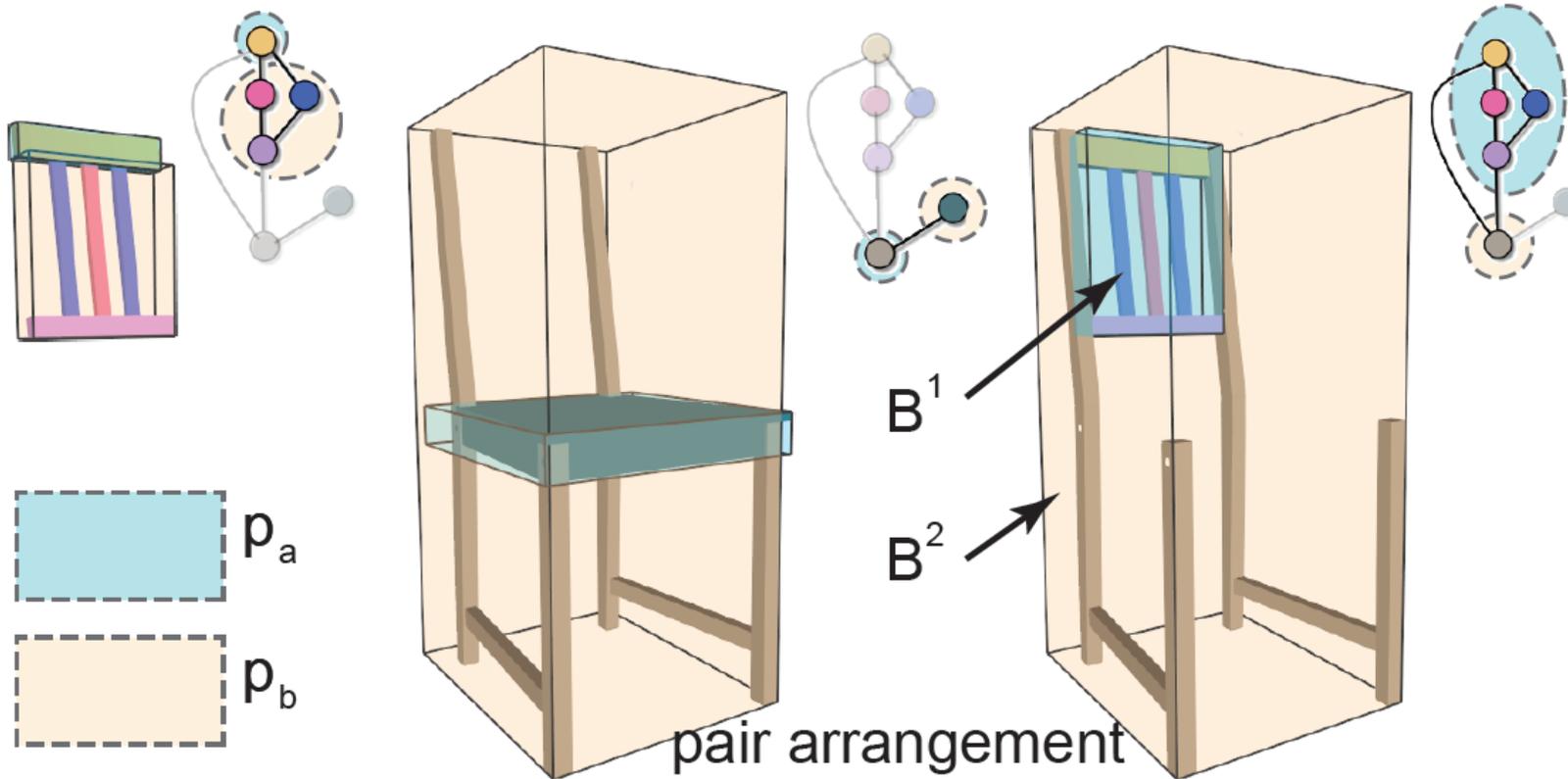
# What are Valid Parts?



# What are Valid Part Pairs?

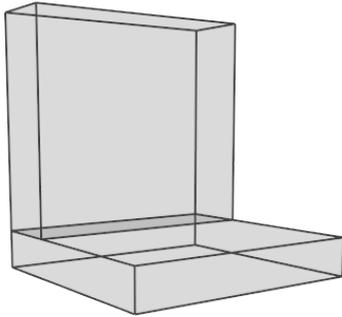


# What are Valid Part Pairs?

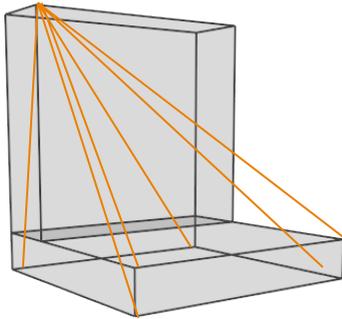




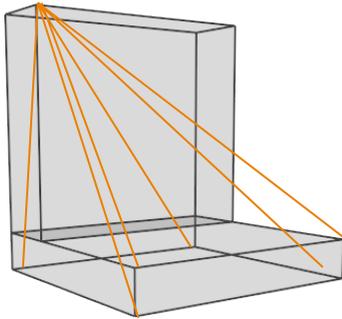
# Comparing PA-s



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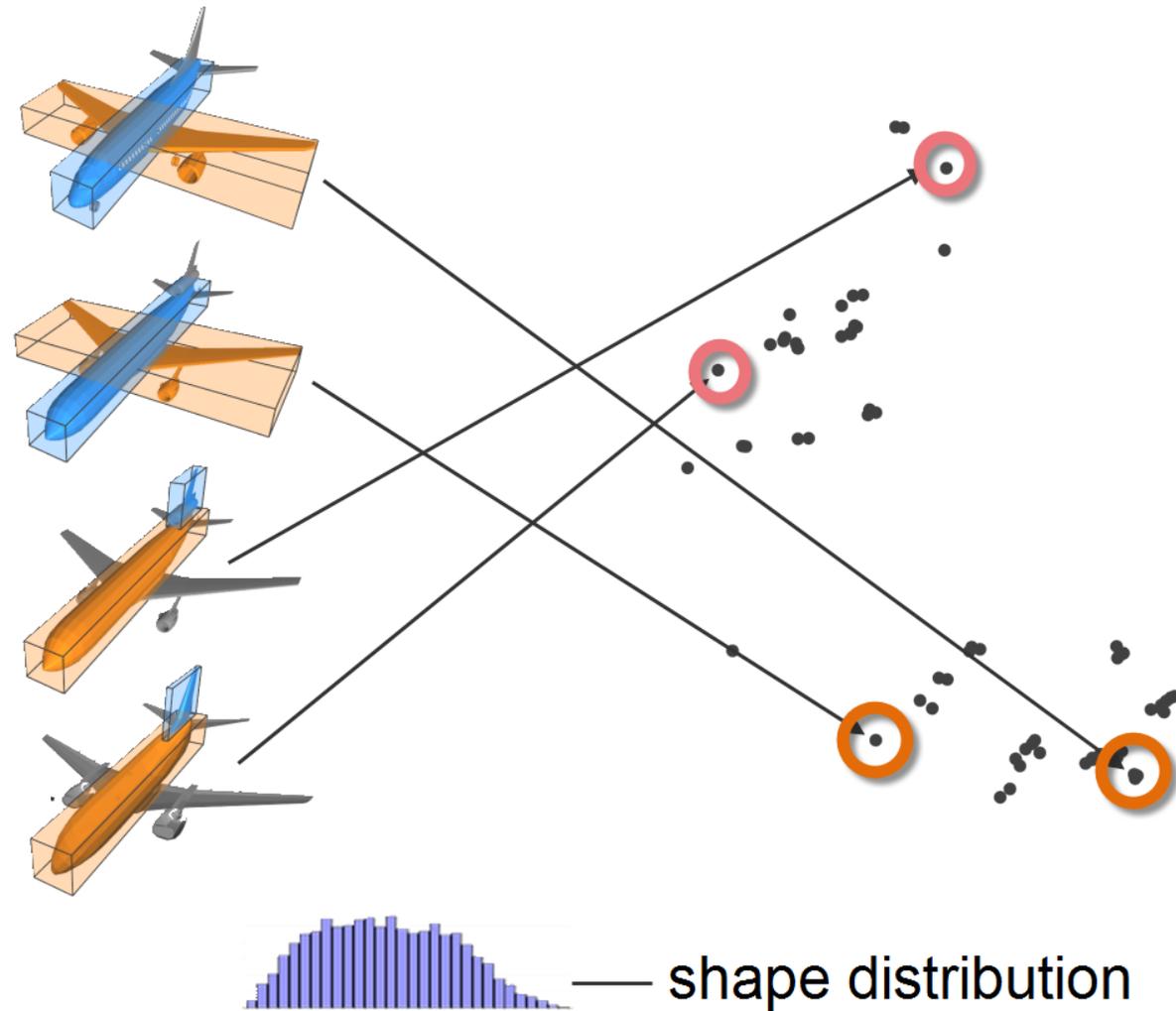


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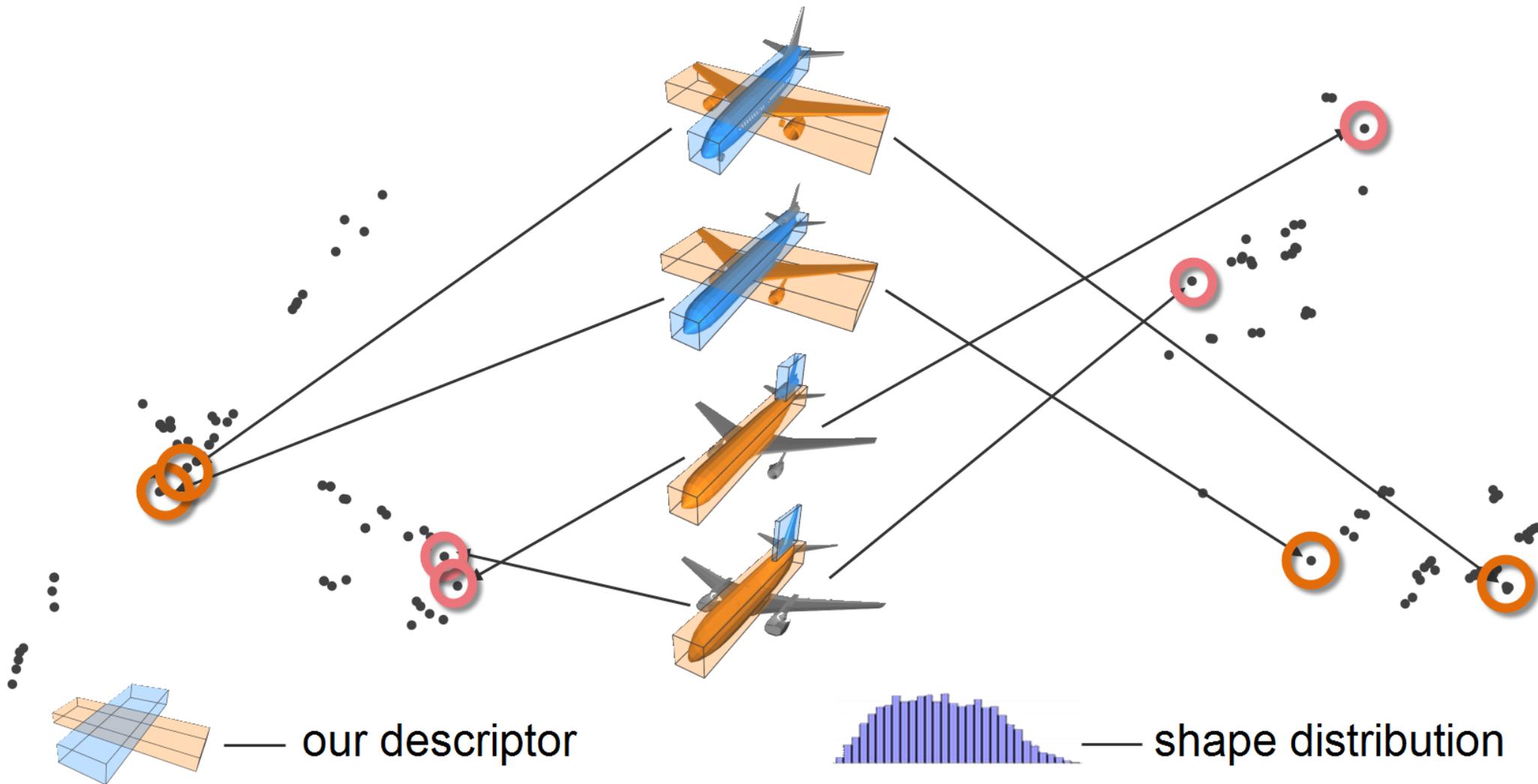


$$\mathcal{S}(s_{ab}) := \{ \|\mathbf{v}_i(B^1) - \mathbf{v}_j(B^2)\| \}$$

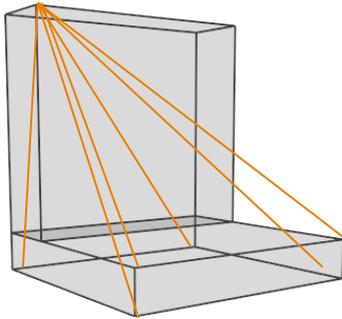
# Comparing Arrangements



# Comparing Arrangements

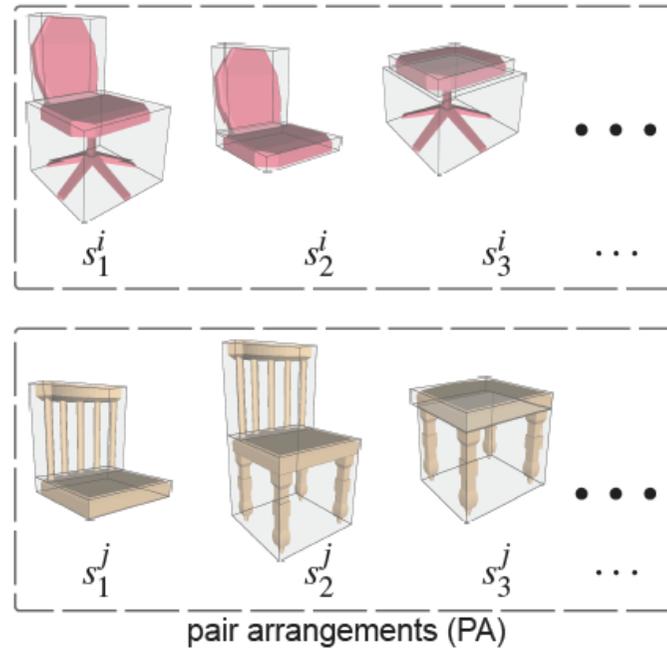
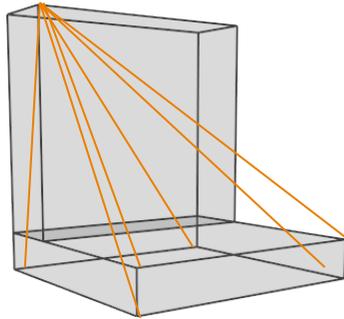


# PA Similarity Matrix



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

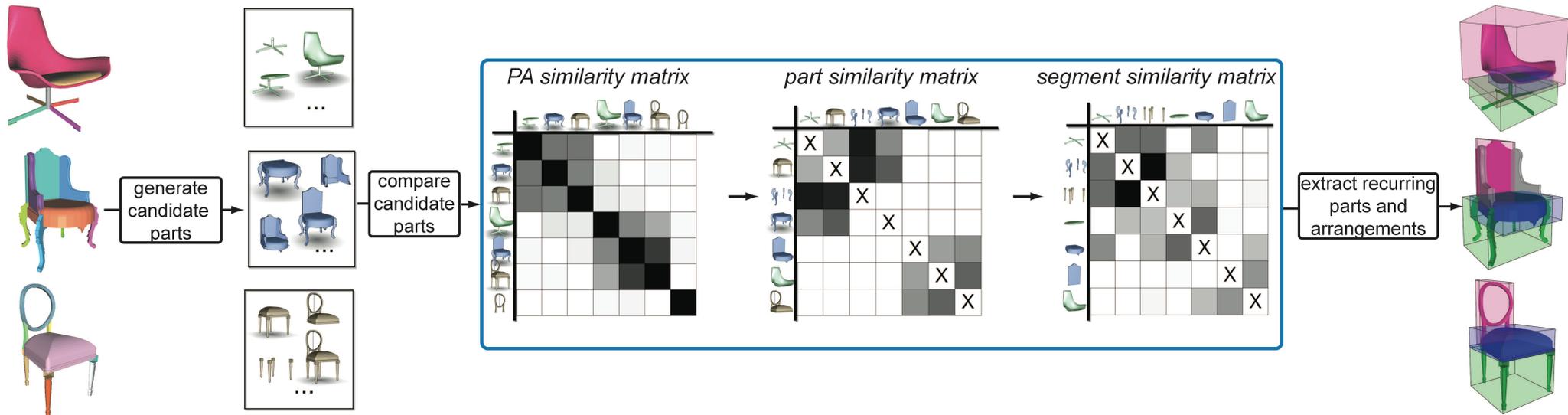
# PA Similarity Matrix



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

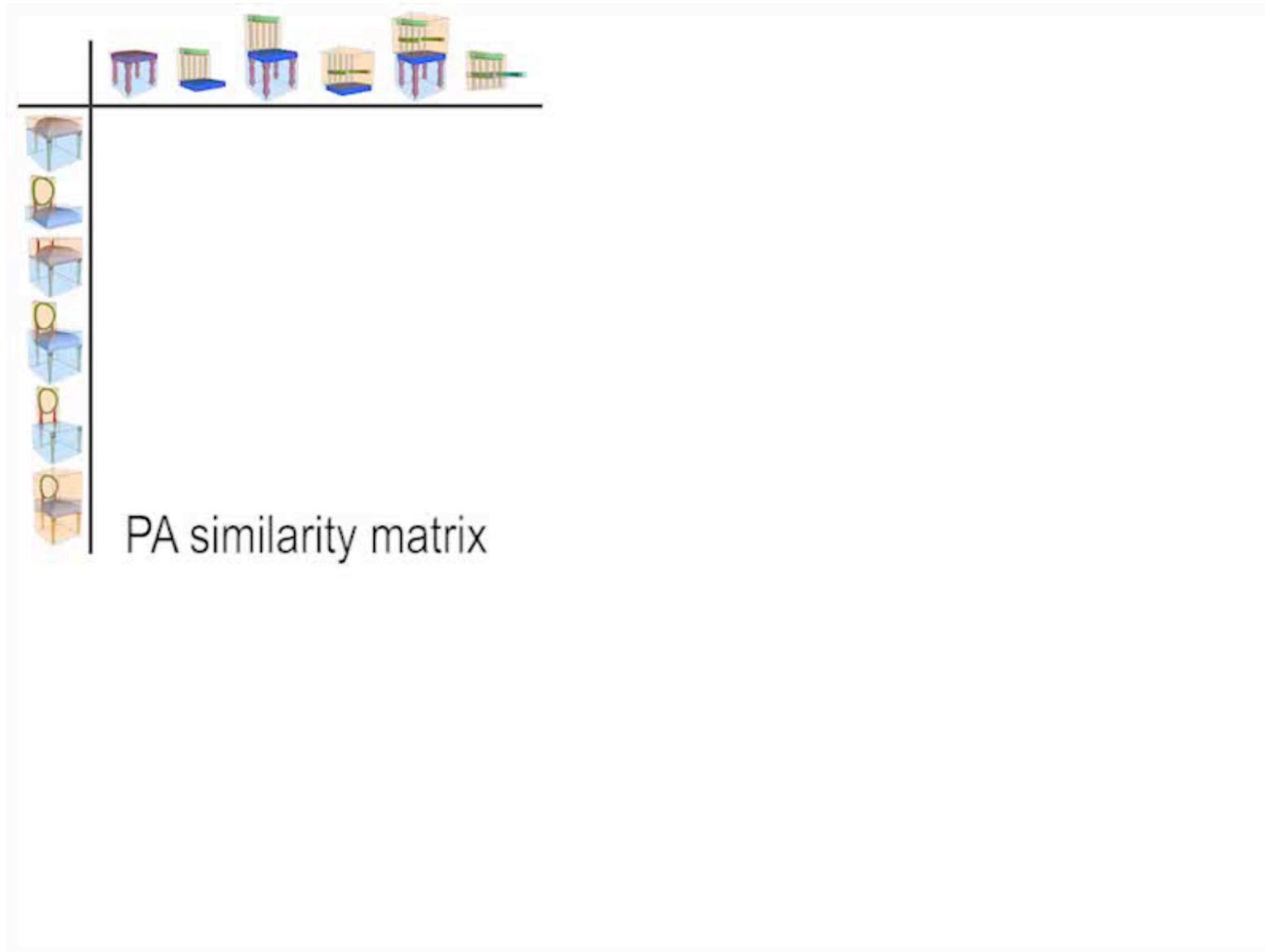
$$\mathcal{S}(s_{ab}) := \{\|\mathbf{v}_i(B^1) - \mathbf{v}_j(B^2)\|\}$$

# Algorithm



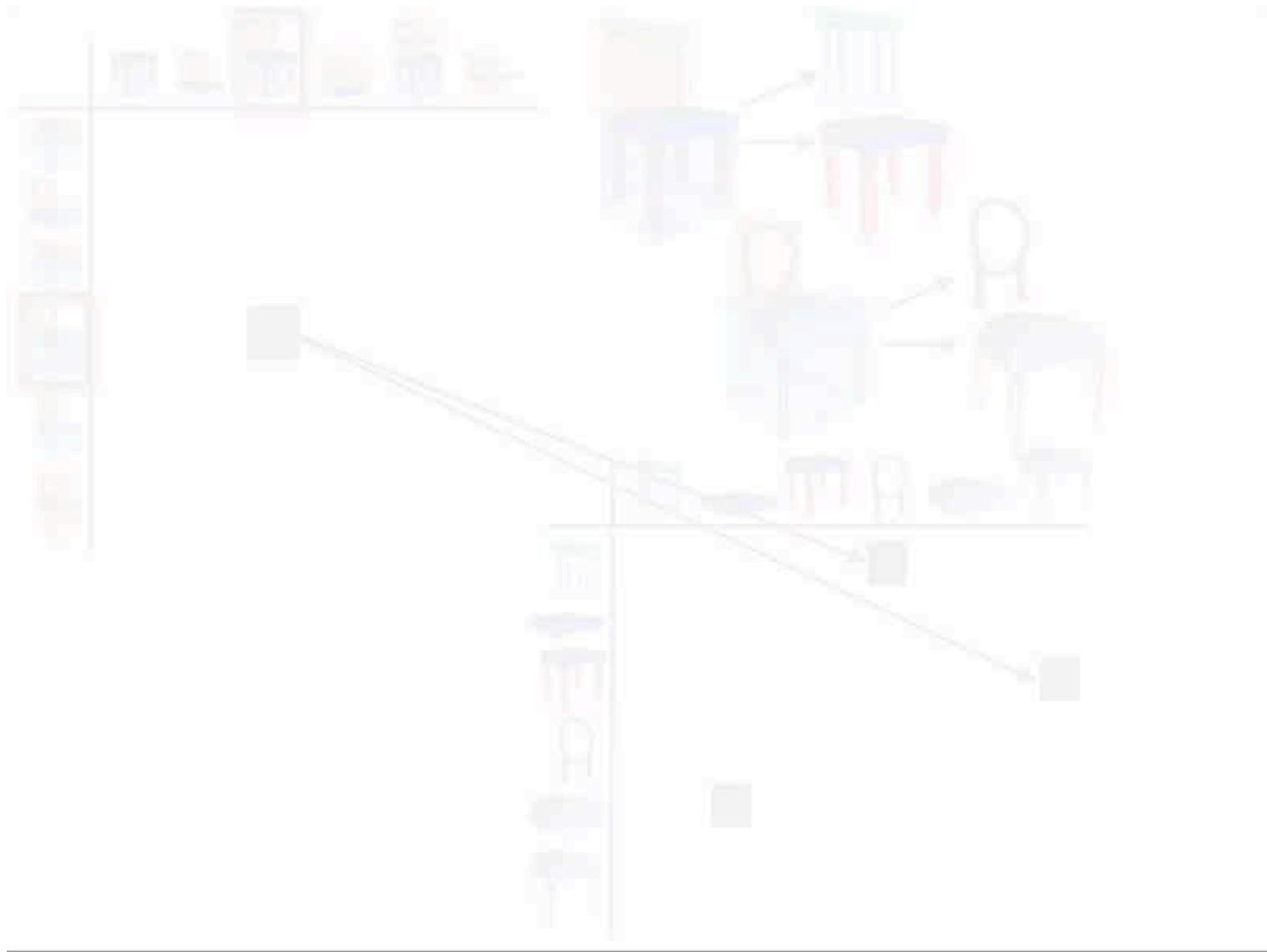
- Candidate *PA*-s generation
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- Recurring Arrangements Extraction

# $PA \Rightarrow$ Part Similarity



# *PA* $\Rightarrow$ *Part Similarity*

# Part $\Rightarrow$ Segment Similarity



# *Part* ⇒ *Segment Similarity*

# Extracting Recurring PAs



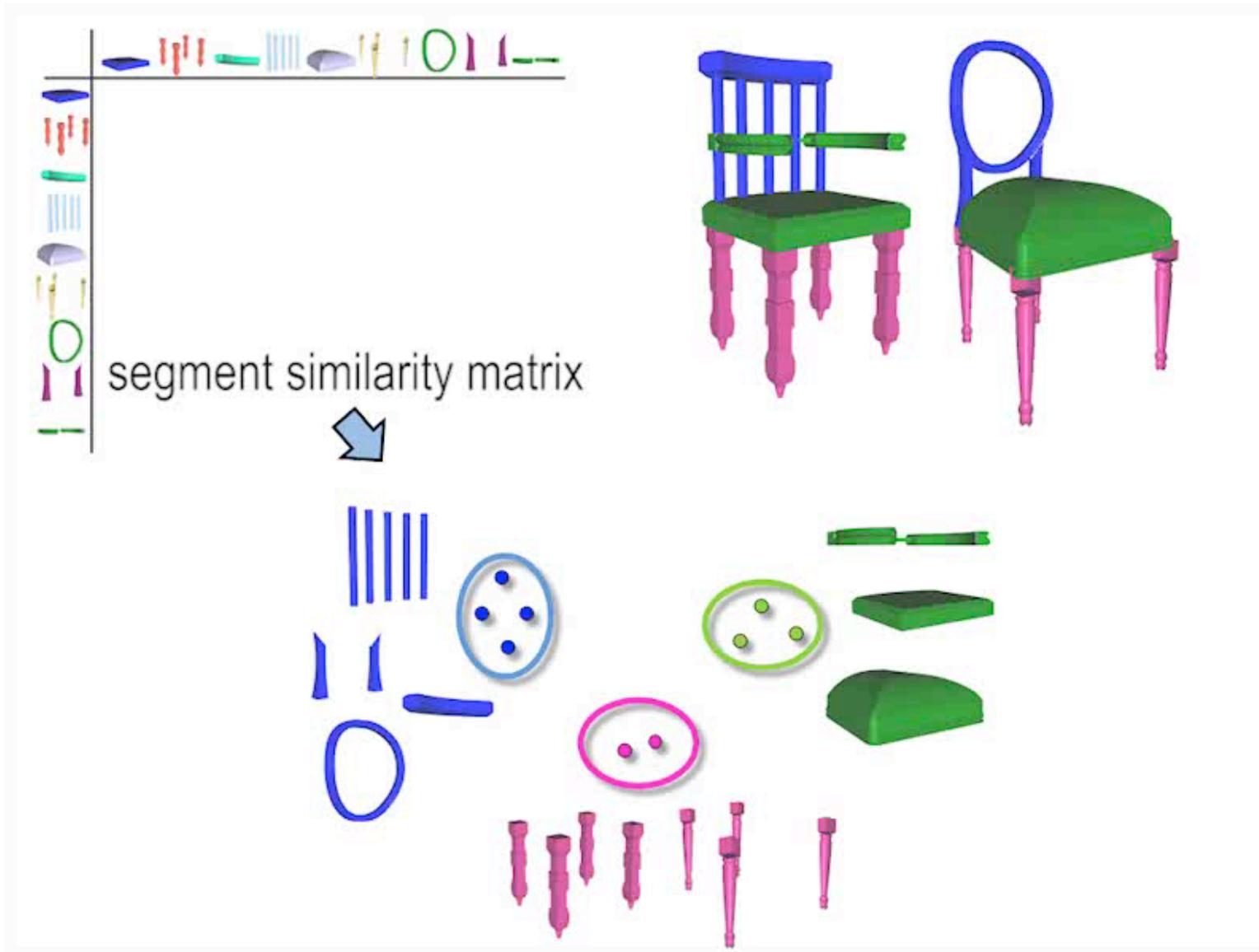
# Extracting Recurring PAs



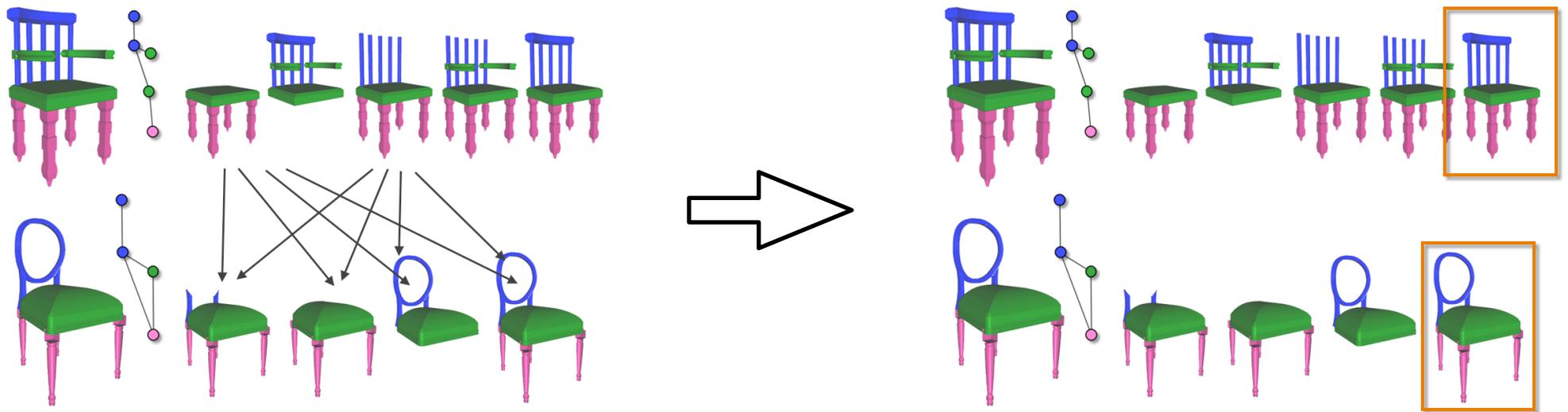
# Final Step: Part Selection



# Final Step: Part Selection



# MRF-based Labelling Problem



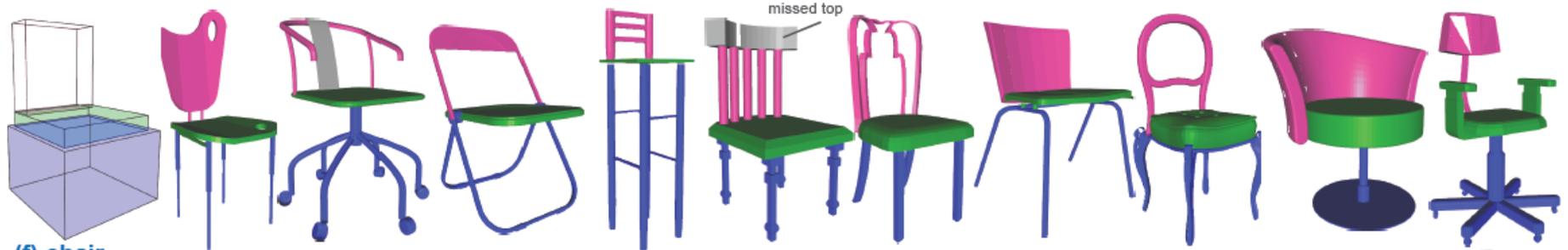
$$\{l_i\}^* := \arg \min_{\{l_i\}} \sum E(M_i \rightarrow l_j^k) + \sum_{i,j} E(M_i \rightarrow l_i^k, M_j \rightarrow l_j^l)$$

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

# Results



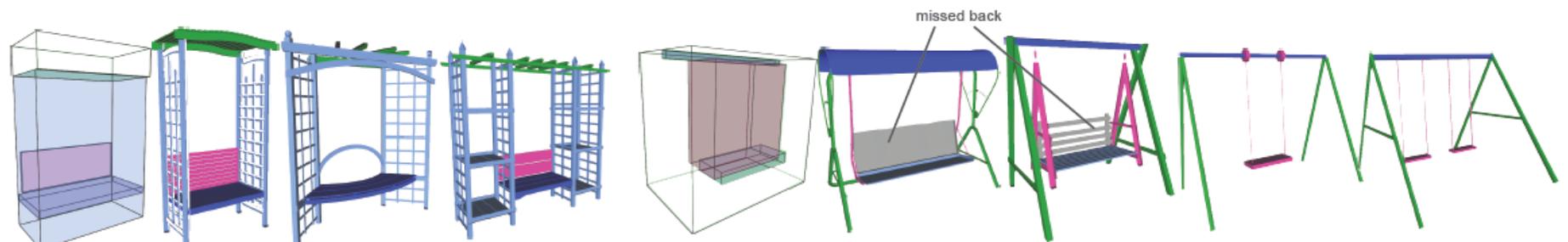
# Further Results



(f) chair



(g) infant bed

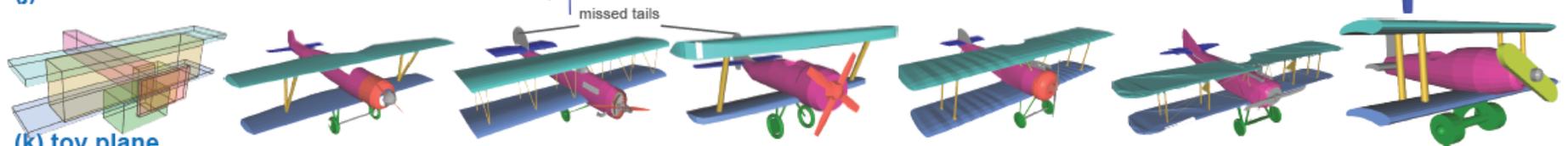


(h) bus stop

(i) swing

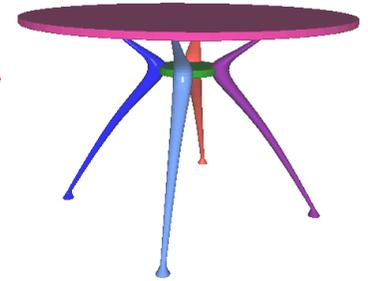
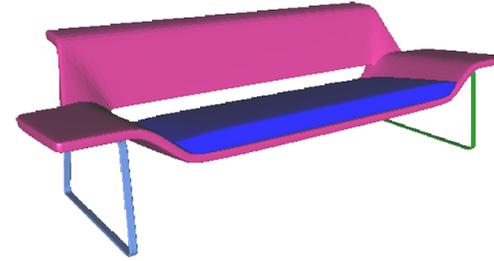
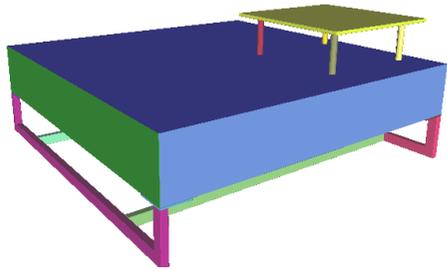


(j) table

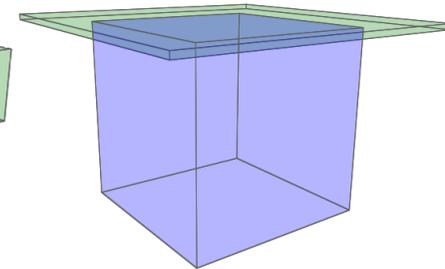
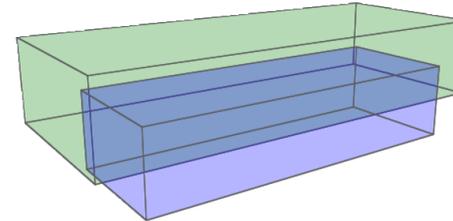
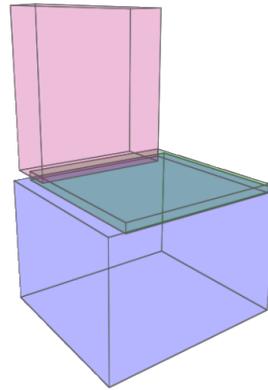
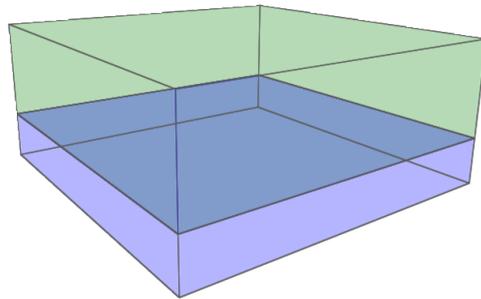
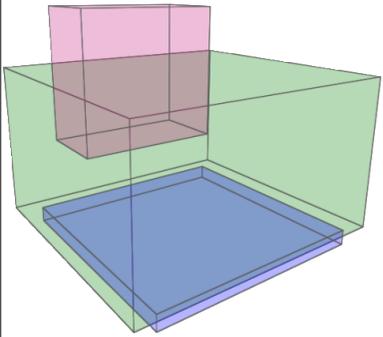
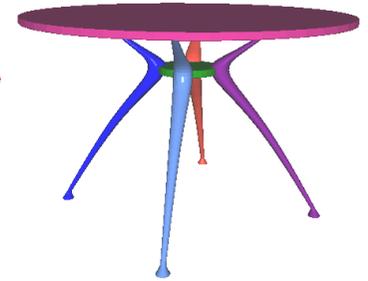
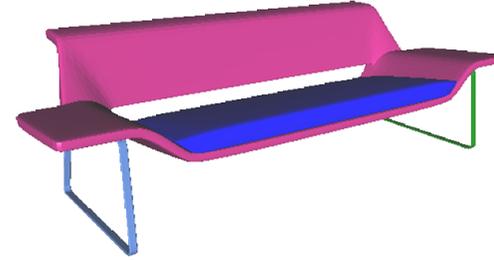
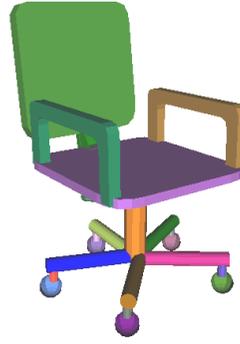
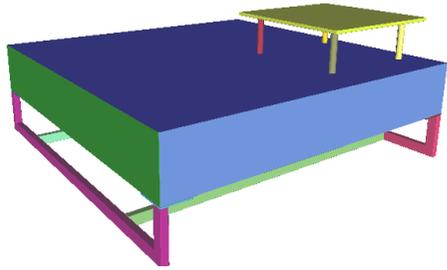


(k) toy plane

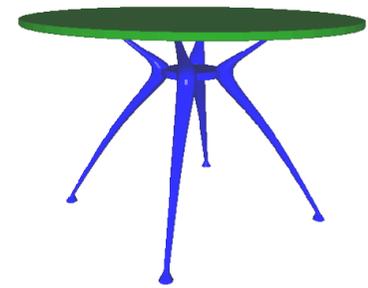
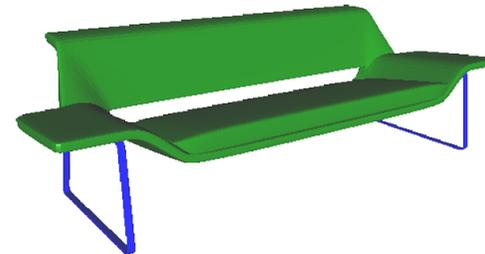
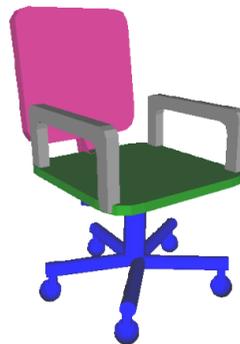
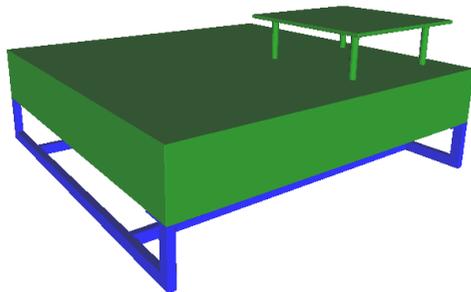
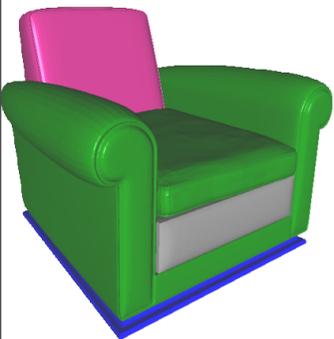
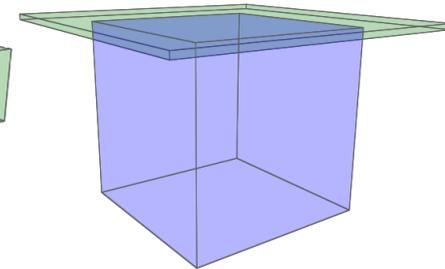
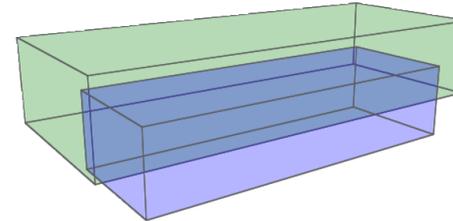
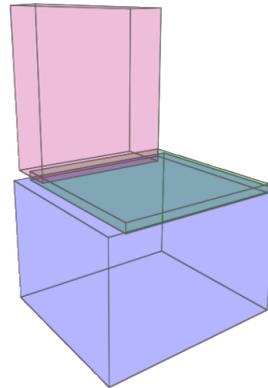
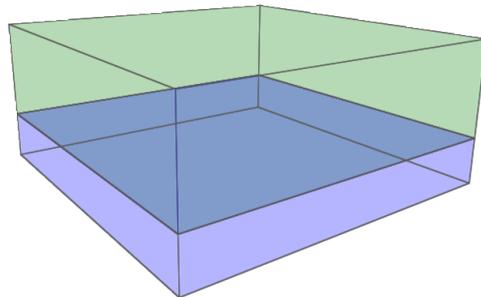
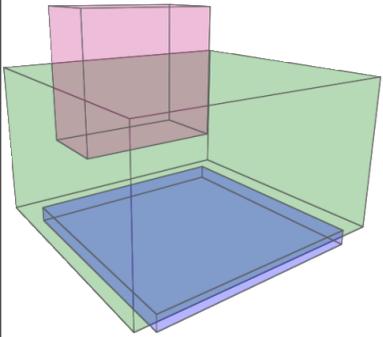
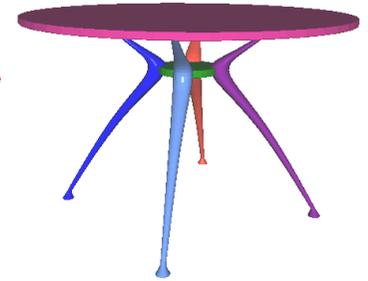
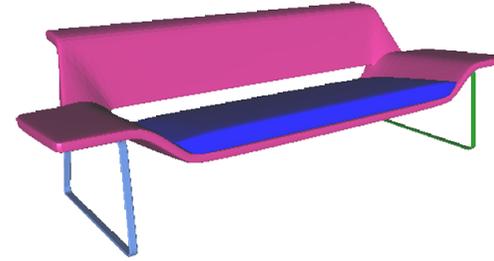
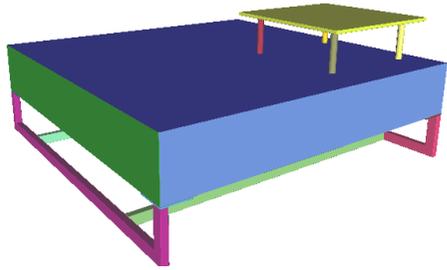
# Mixed Models



# Mixed Models



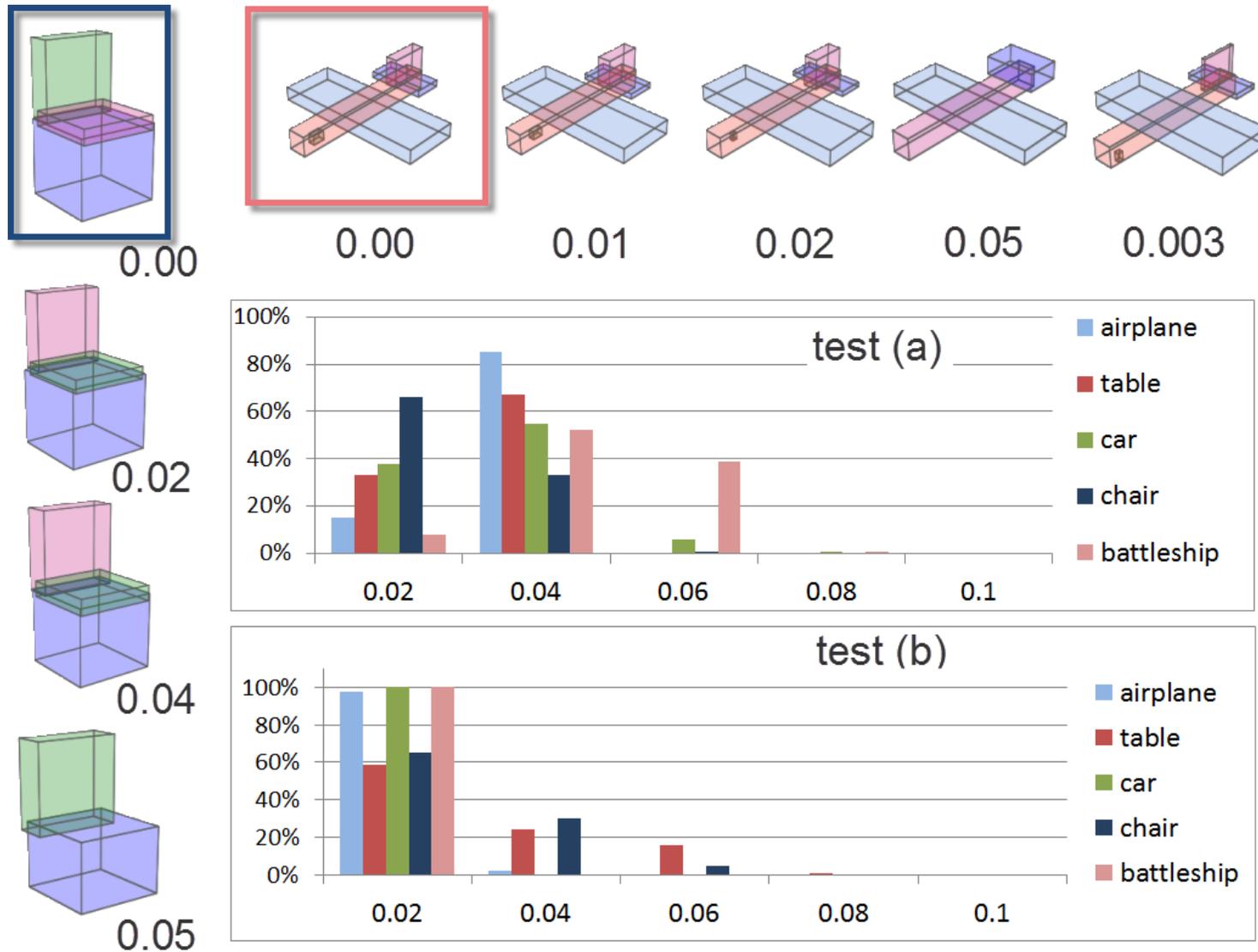
# Mixed Models



# 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

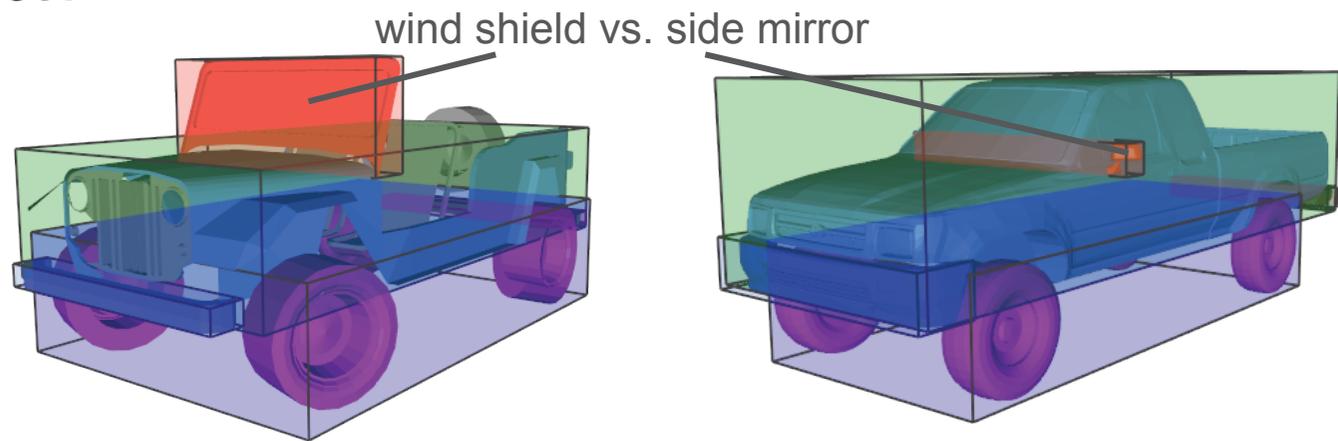
# Summary and Future Work

# Summary and Future Work

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

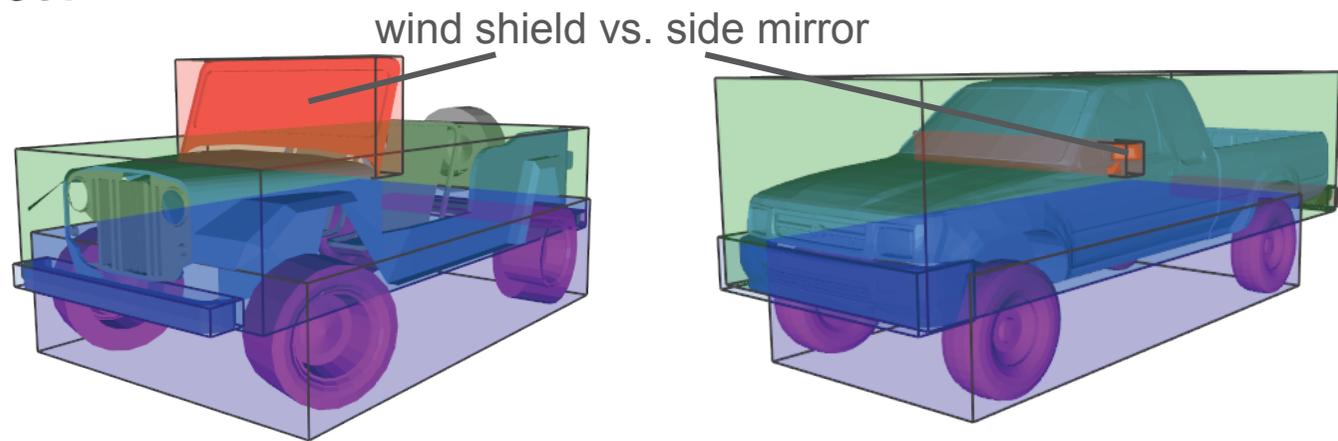
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# Summary and Future Work

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



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

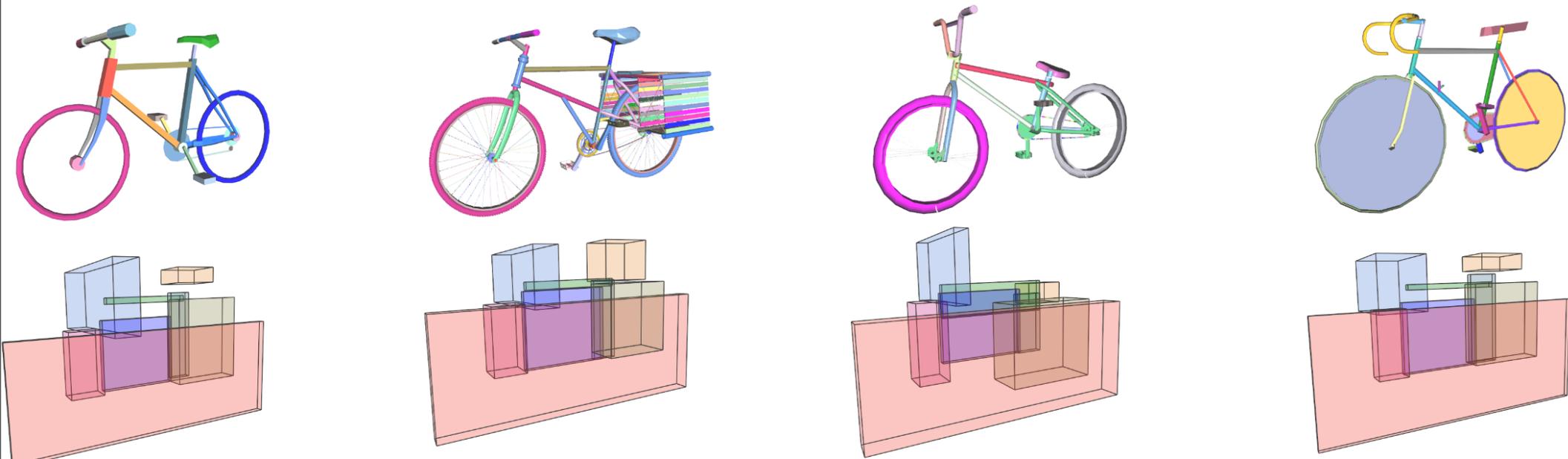
# Acknowledgements



- Maks Ovsjanikov
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- Charlotte Rakhit (video voiceover)
  
- Marie Curie CIG



# Thank You!!



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

(code + data available)