

Universal Quality Metrics for Graph Drawings: Which Graphs Excite Us Most?

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Tim Hegemann

Alexander Wolff

Michael Wybrow

Helen C. Purchase

*The 33rd International Symposium on Graph
Drawing and Network Visualization*

At Last Year's GD...

[Deynet, Hegemann, Kempf, Wolff. GD'24]
graph drawing from [Bekos et al. J.DAM 2022]

Previous

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Next

New Upload

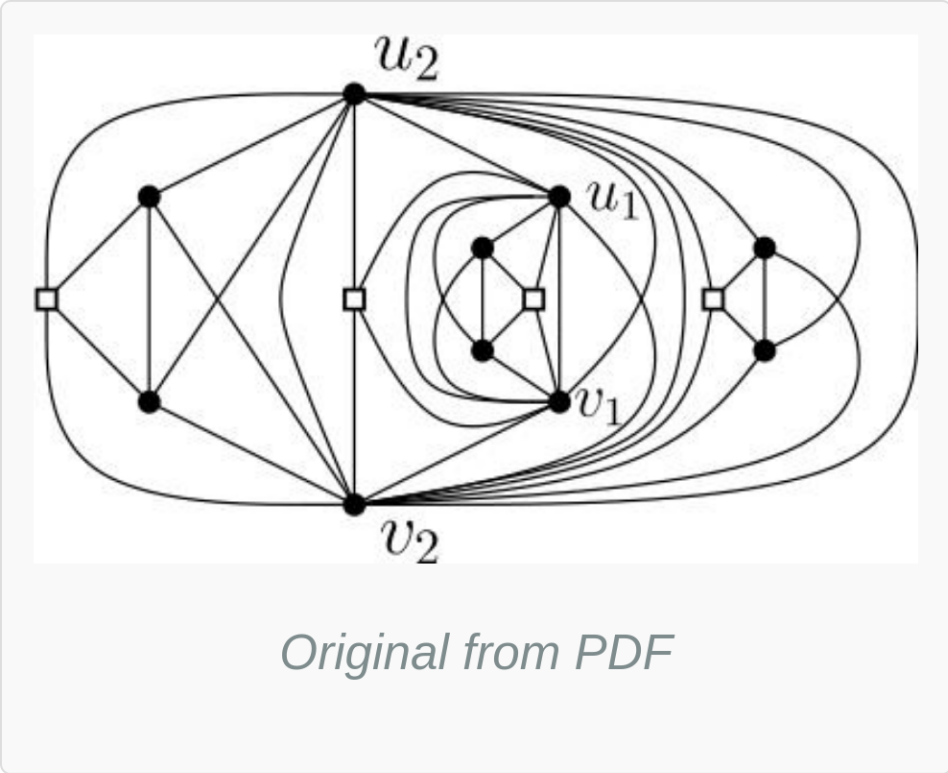
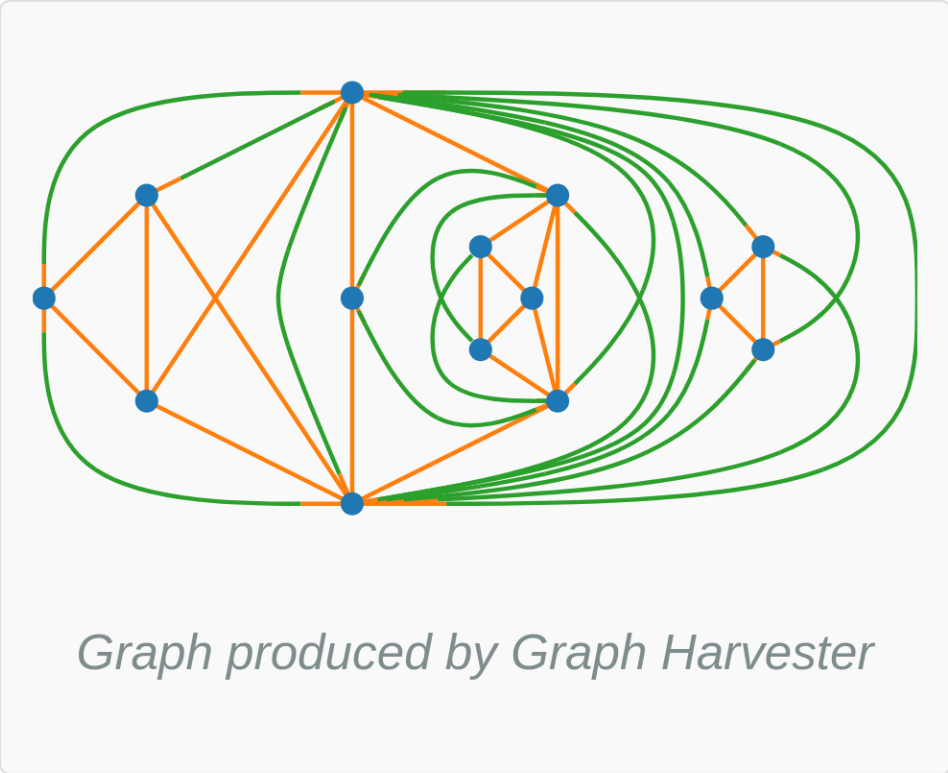


Fig. 8. Illustration for the hierarchical contraction technique. Thick edges are drawn thicker (and red).

Graph6 String	HoG Link
>>graph6<<M`rMEFo{M@x_ooKK? 	Not found on HoG. Add/Edit via this link

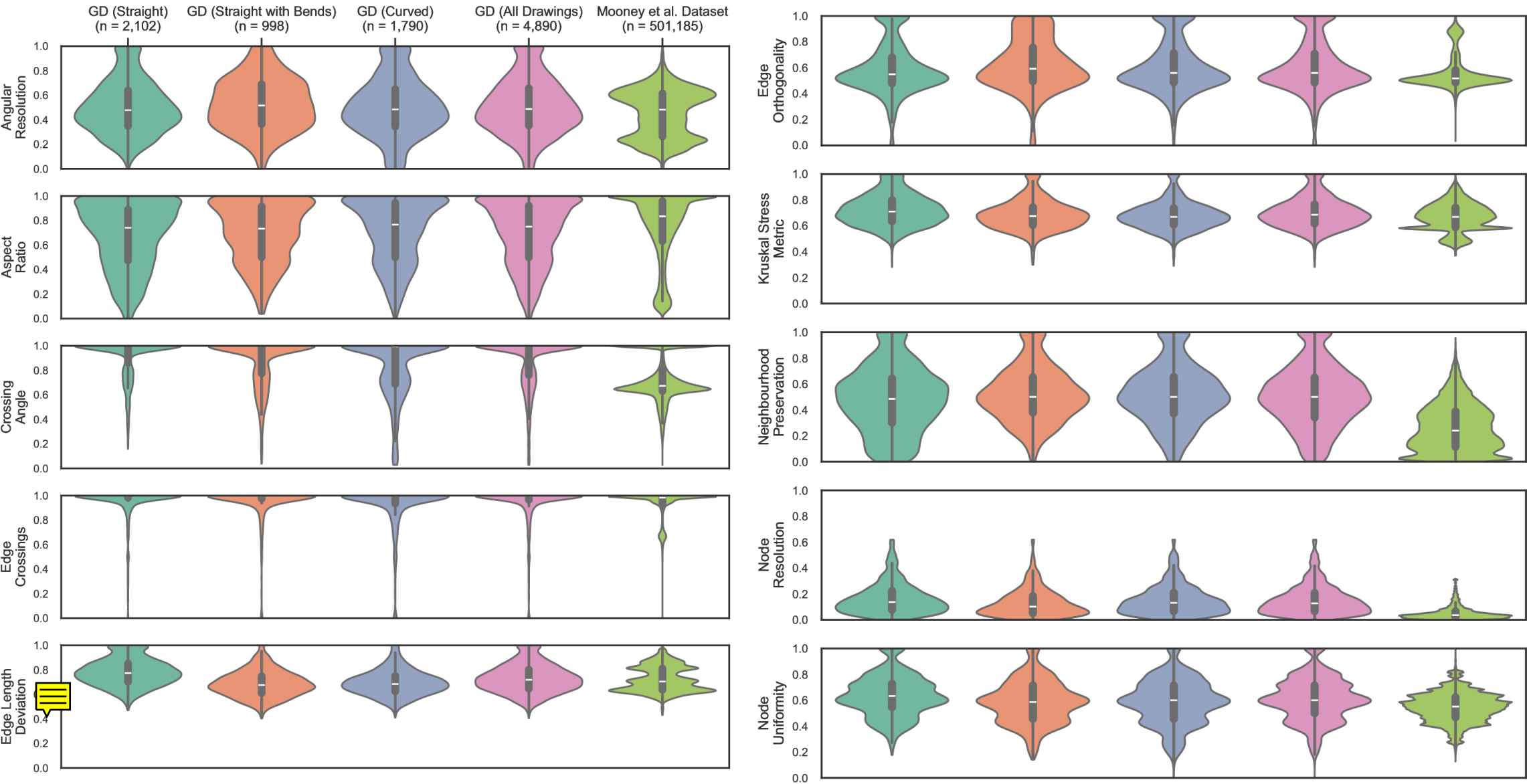
Extracting Drawings

Opportunity: What does the metrics landscape of drawings from GD look like?



Extracting Drawings

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Challenges

- **Extracting drawings**

- detecting figures
- bitmap images
- varied drawing styles
- and many more...

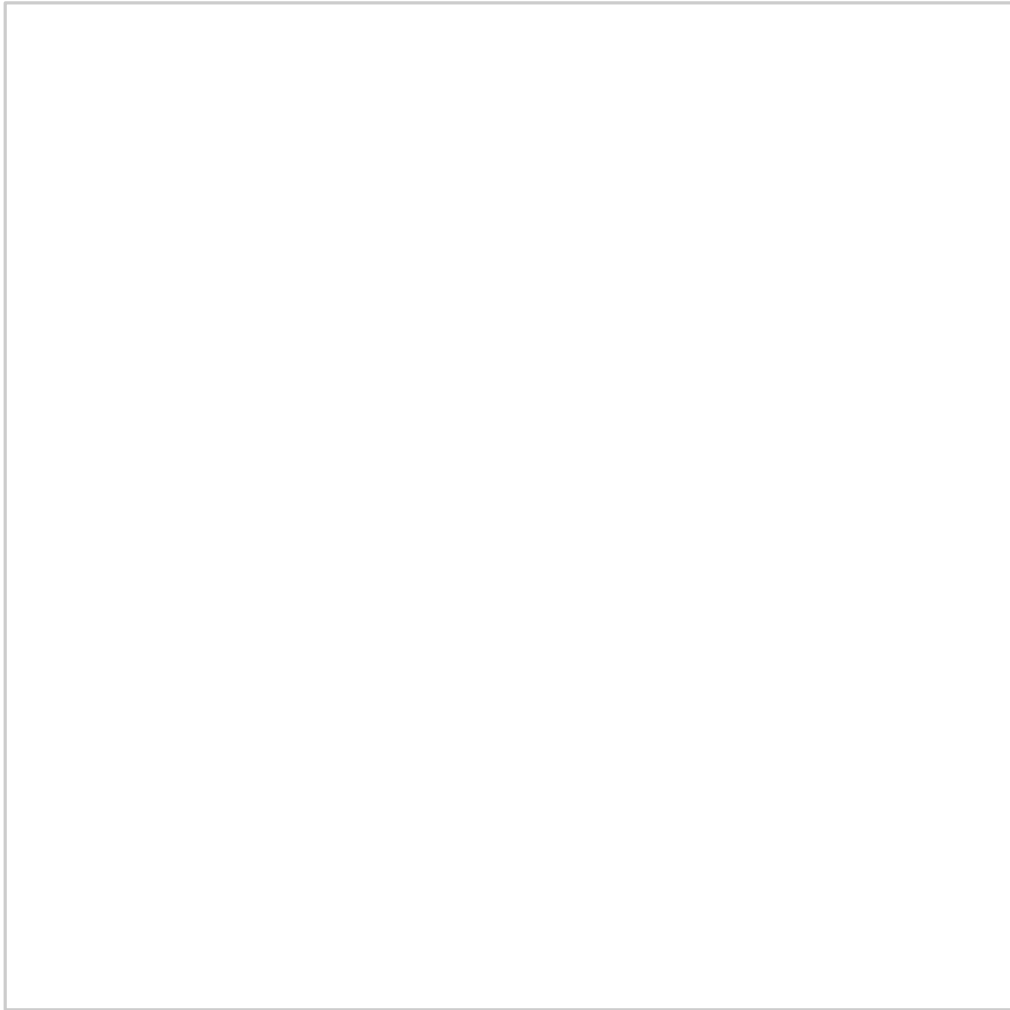
- **Evaluating drawings with curves**

- non-standard representation/format
- existing metrics assume straight-line edges



Challenges: Extracting Graphs

The Graph Harvester Rulebook



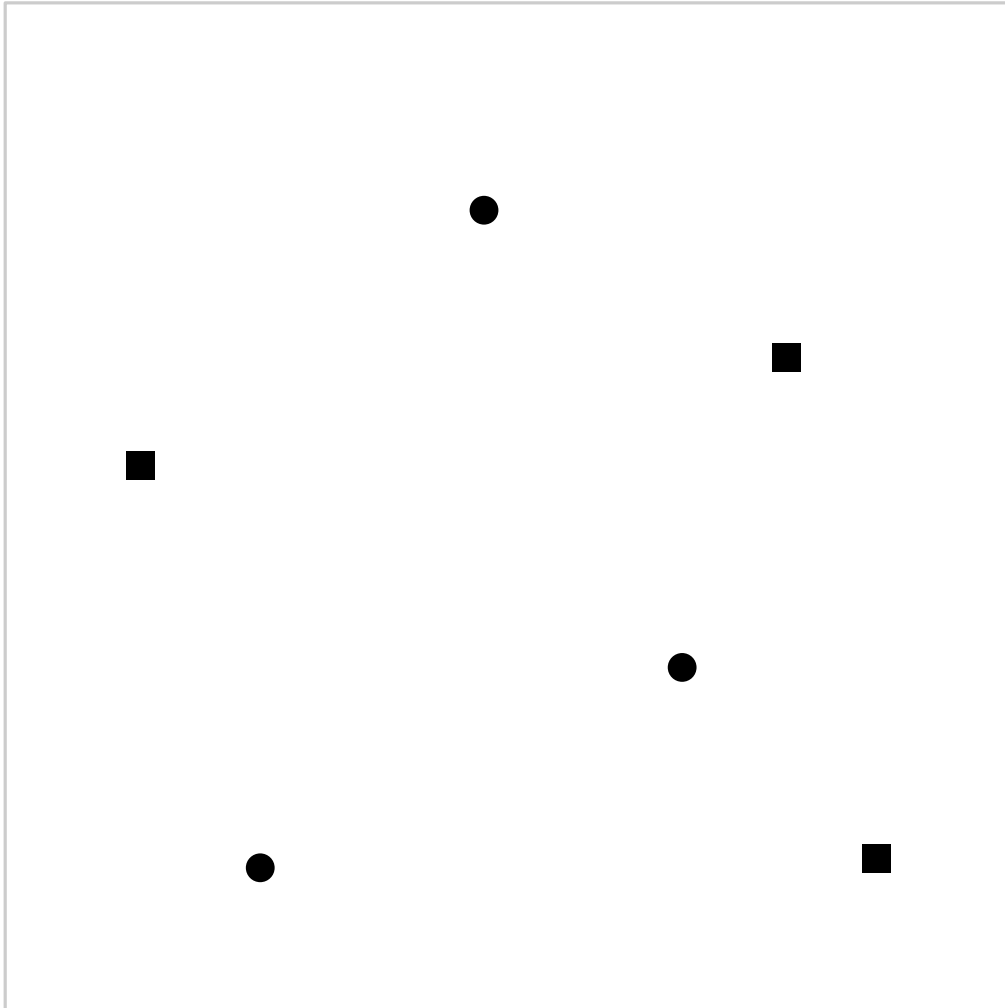
Nodes

- squares or circles
- dark fill or stroke
- clearly separated

Challenges: Extracting Graphs

The Graph Harvester Rulebook

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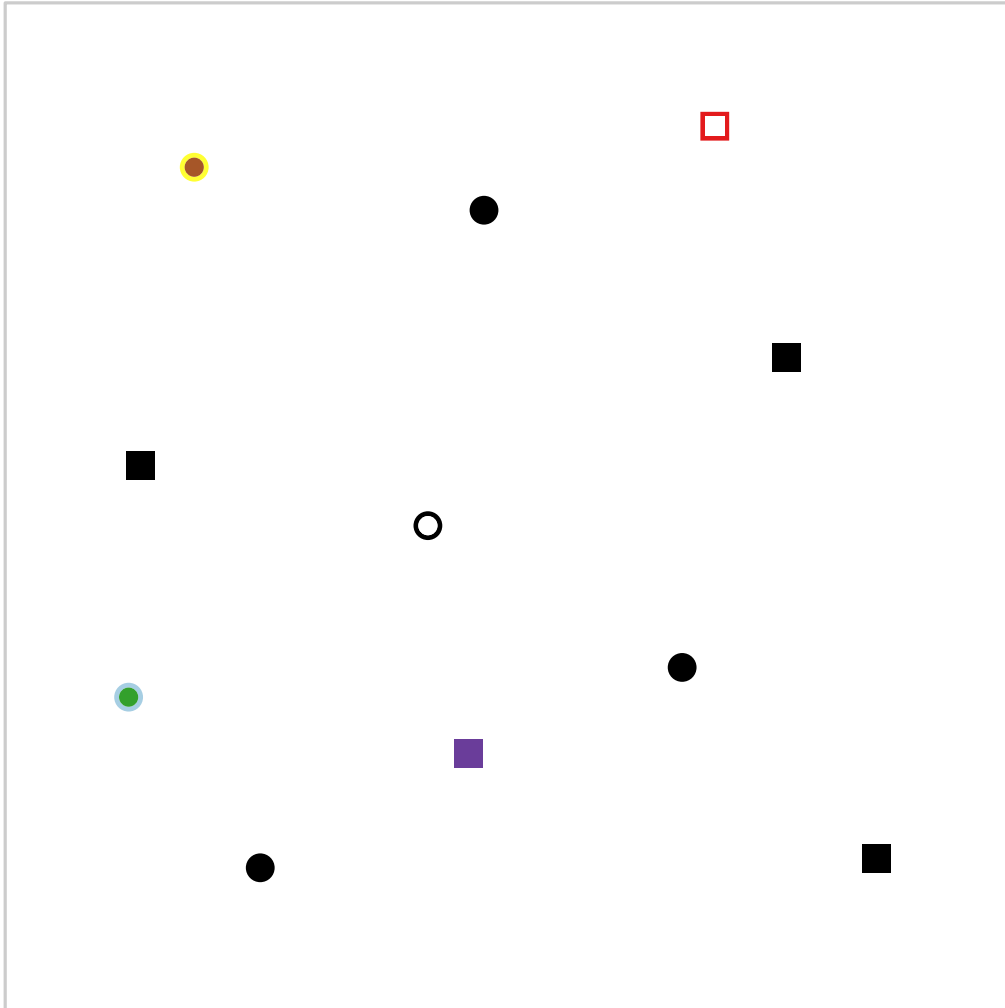


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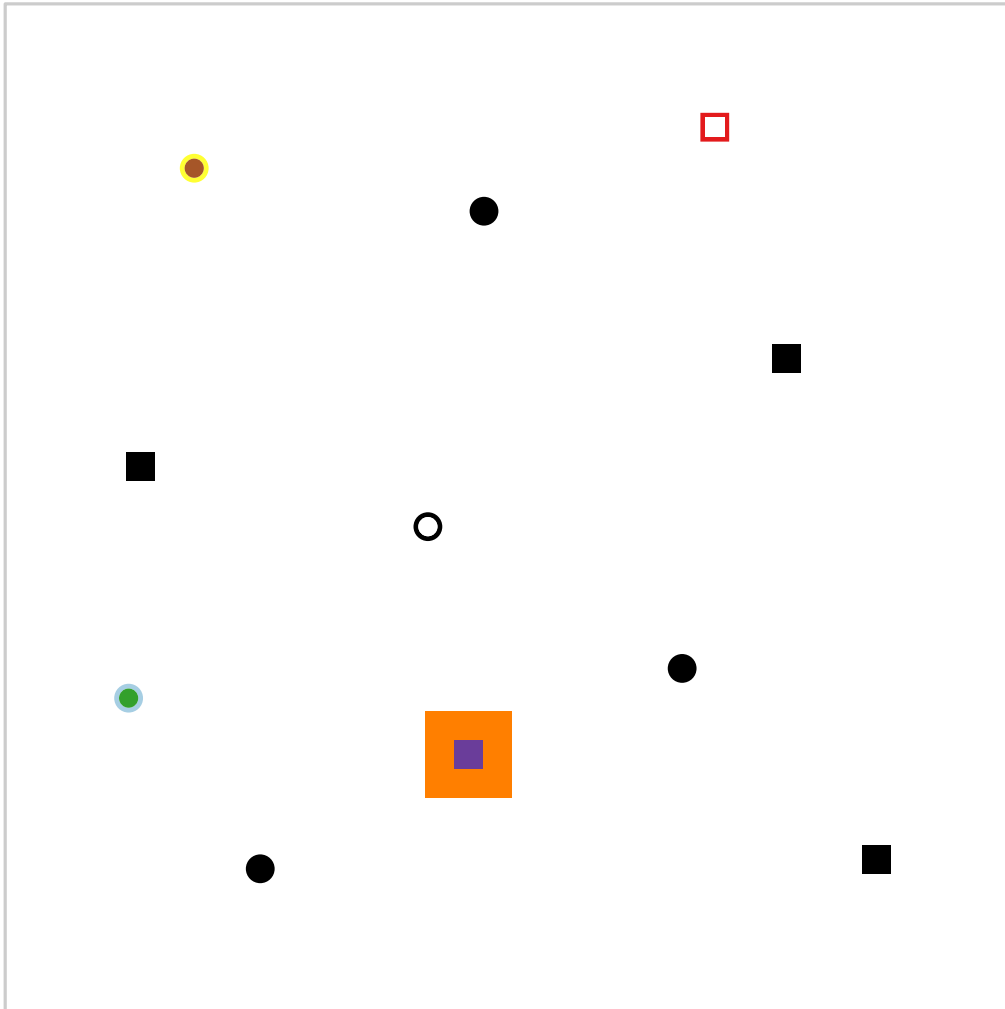


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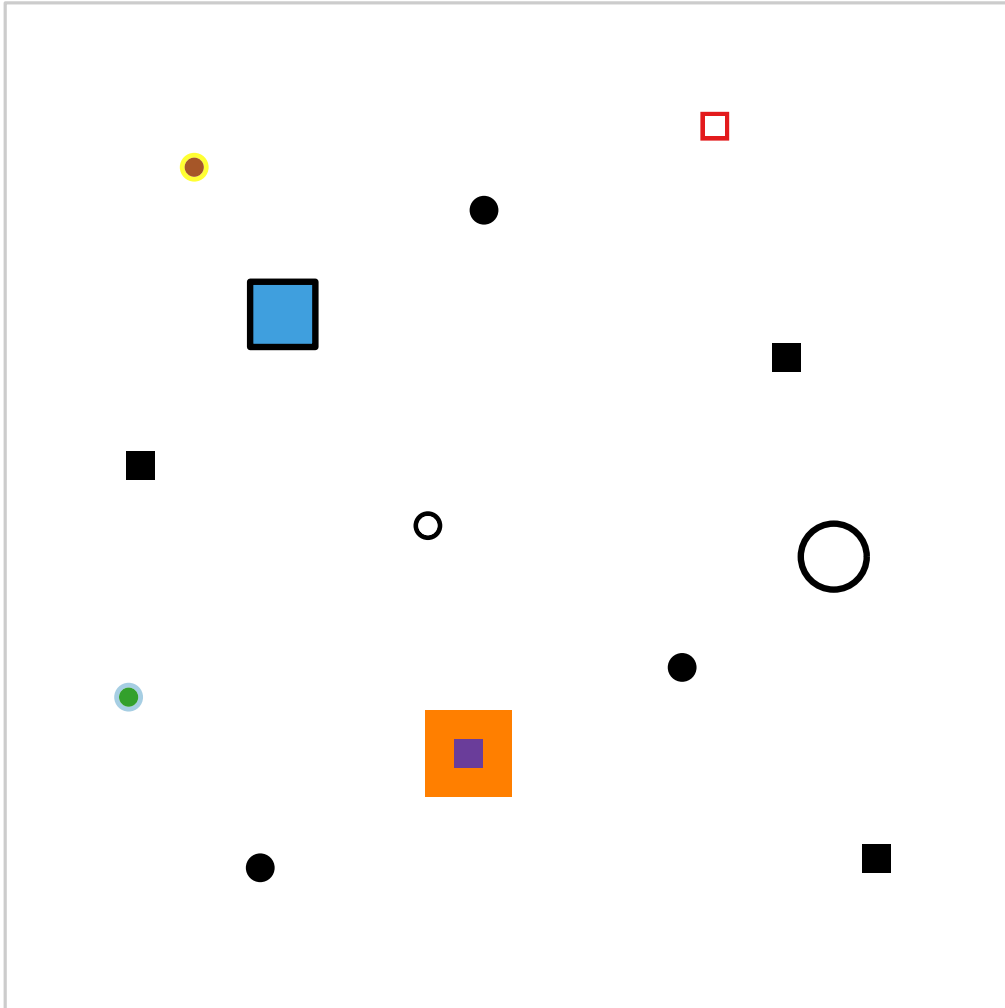


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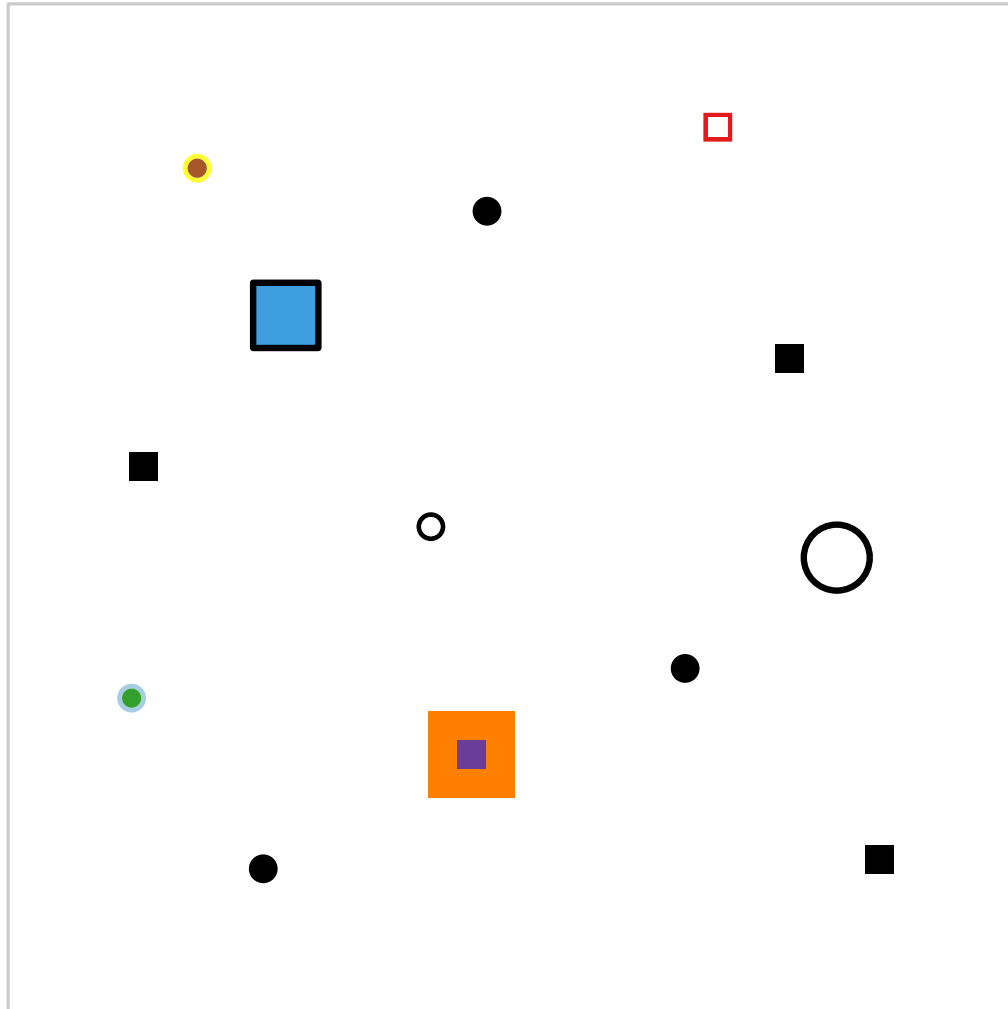
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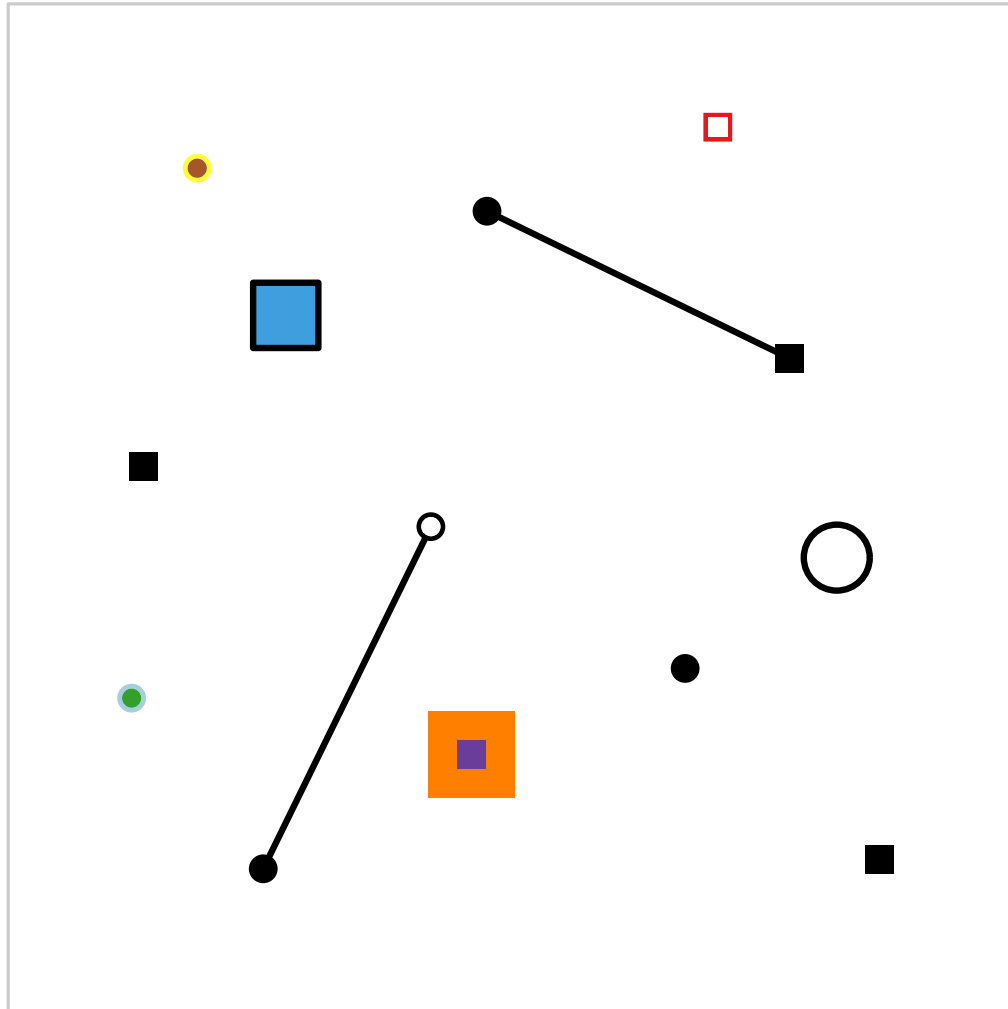
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Edges

- sequence of line segments or Bézier curves
- dark stroke
- one node at each end

Challenges: Extracting Graphs

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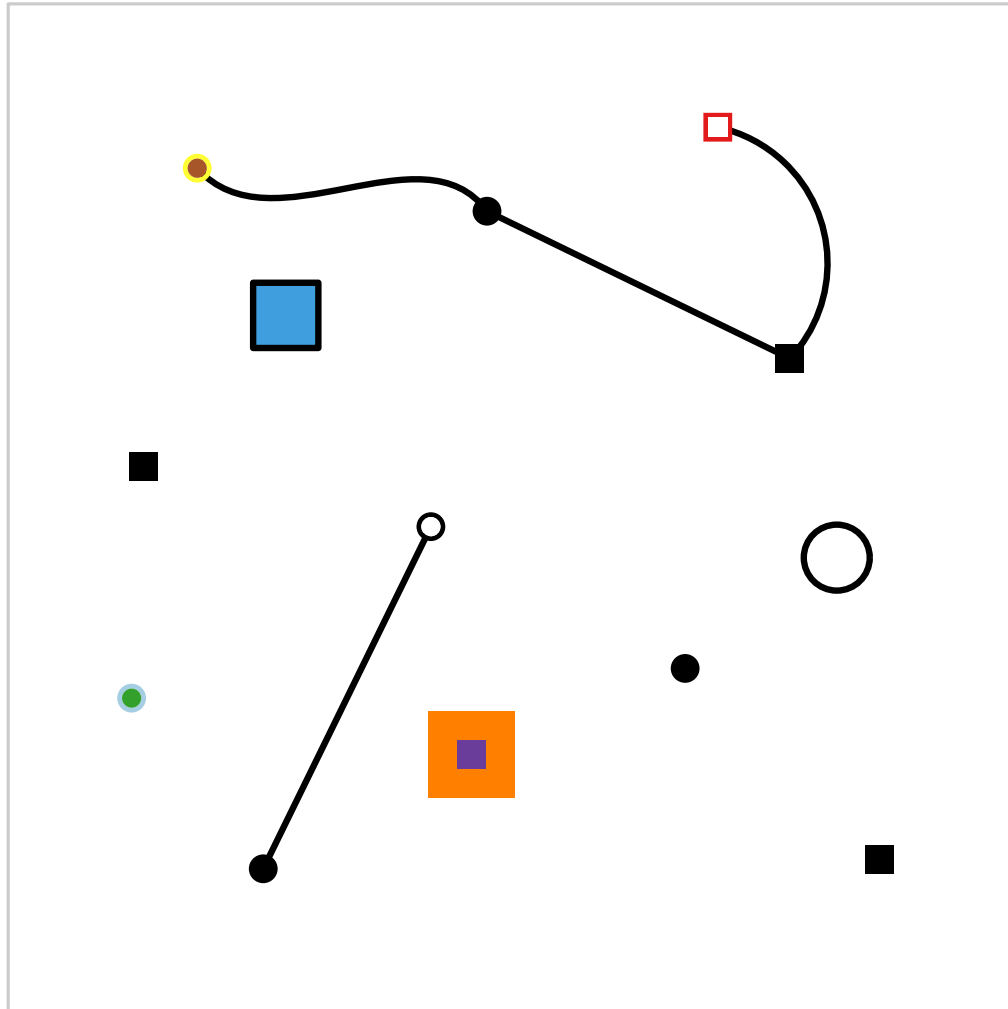
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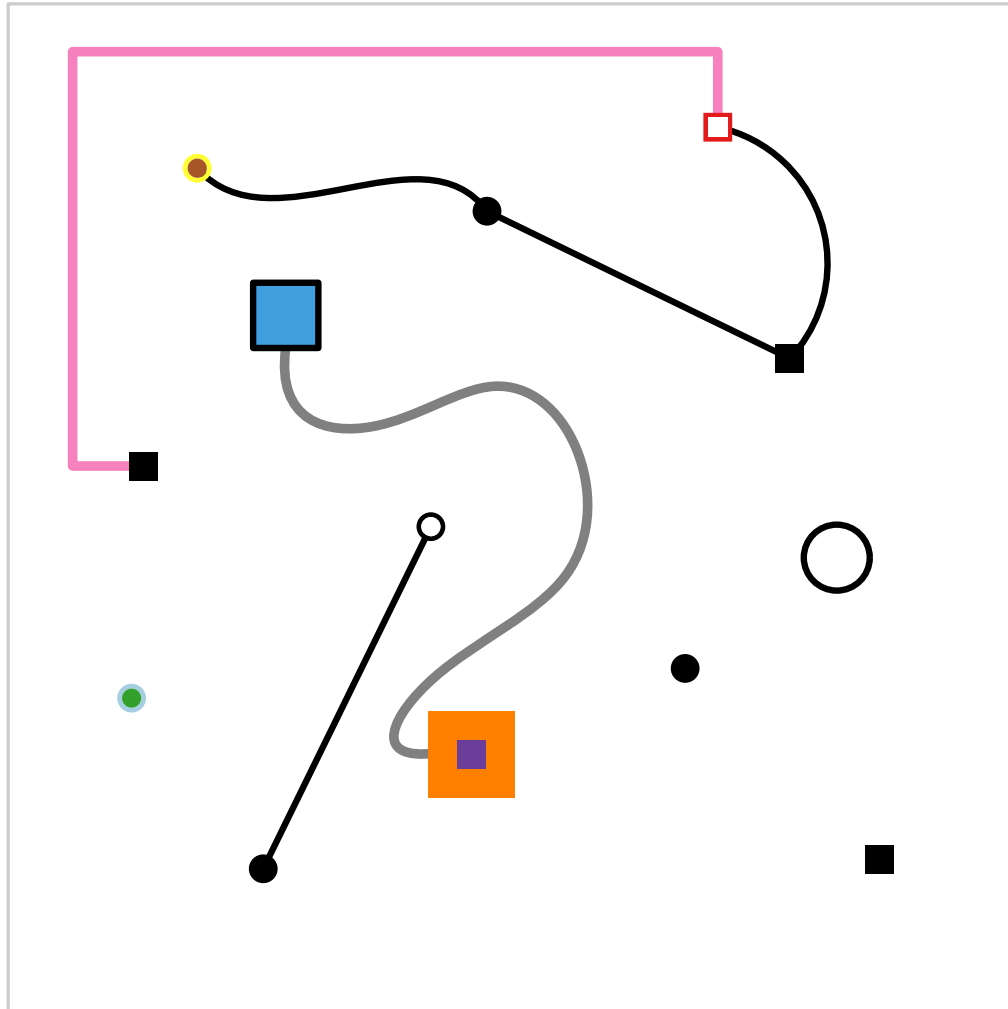
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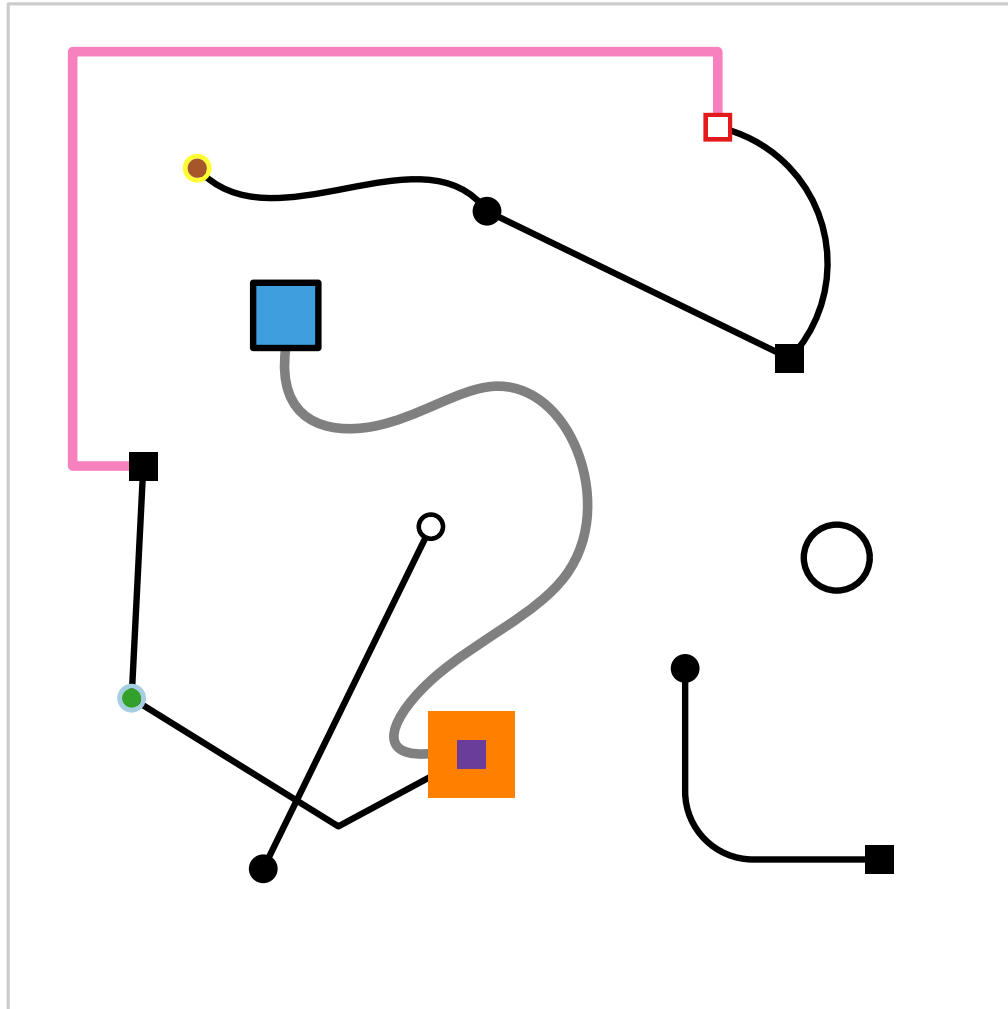
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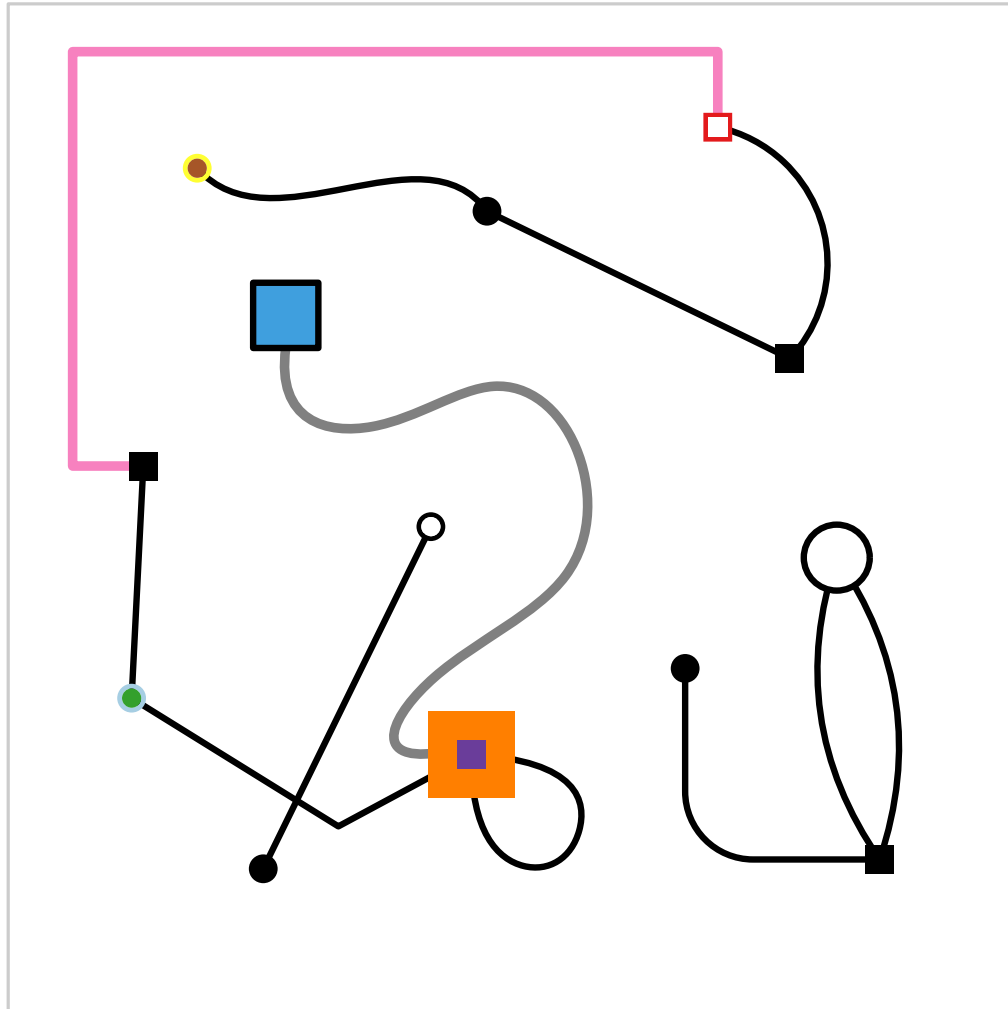
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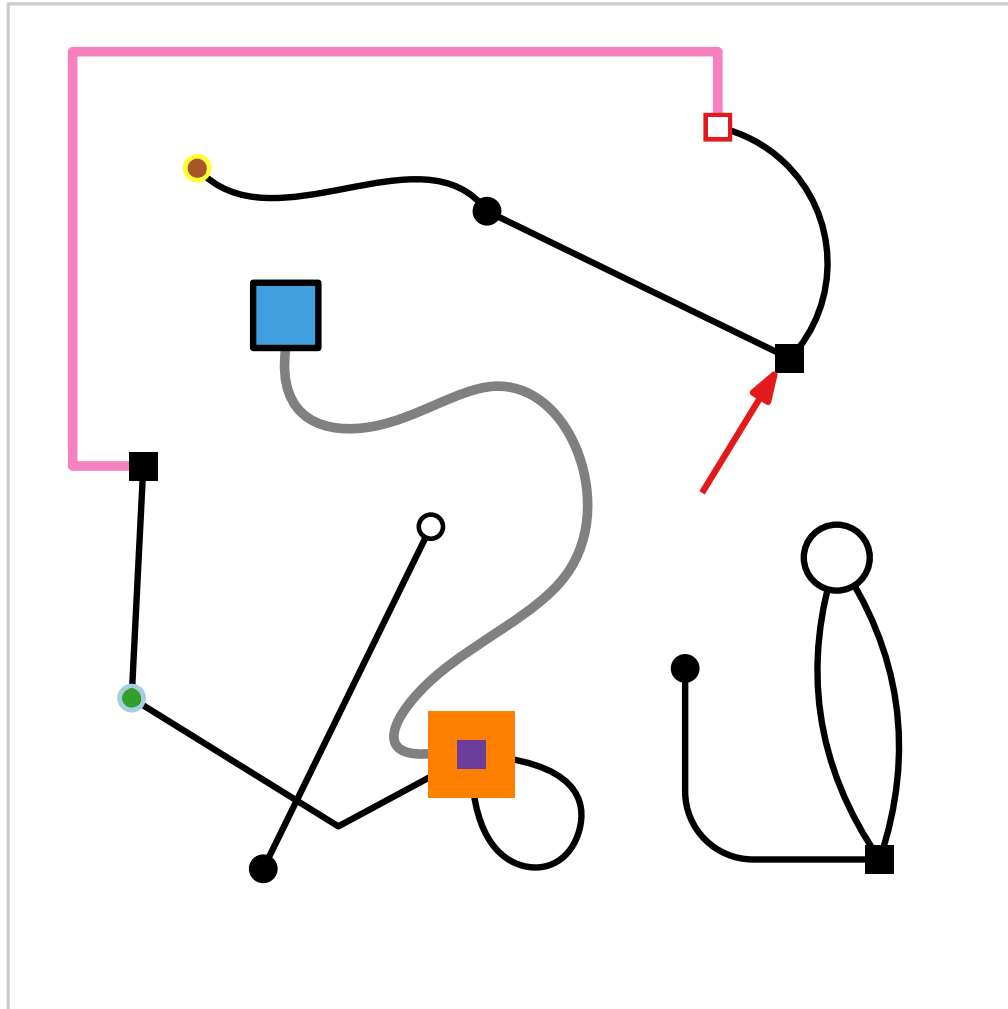
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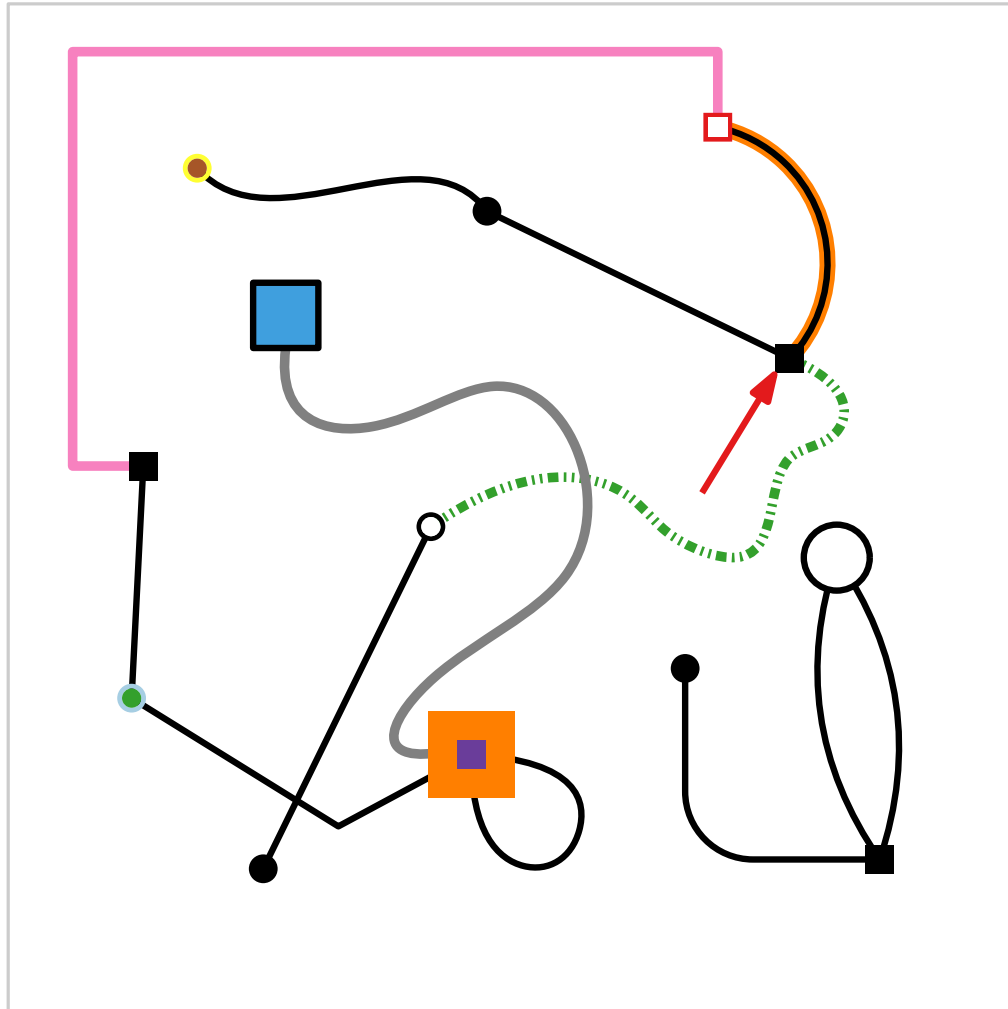
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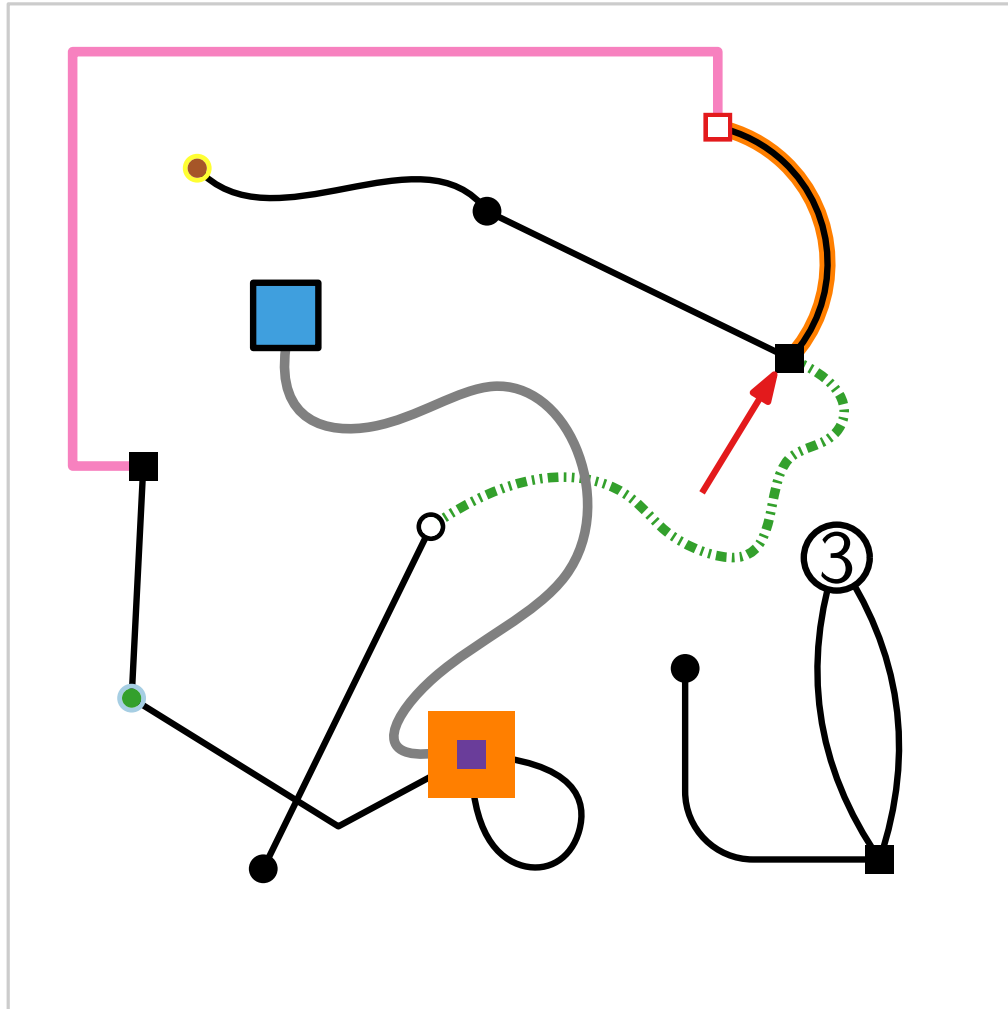
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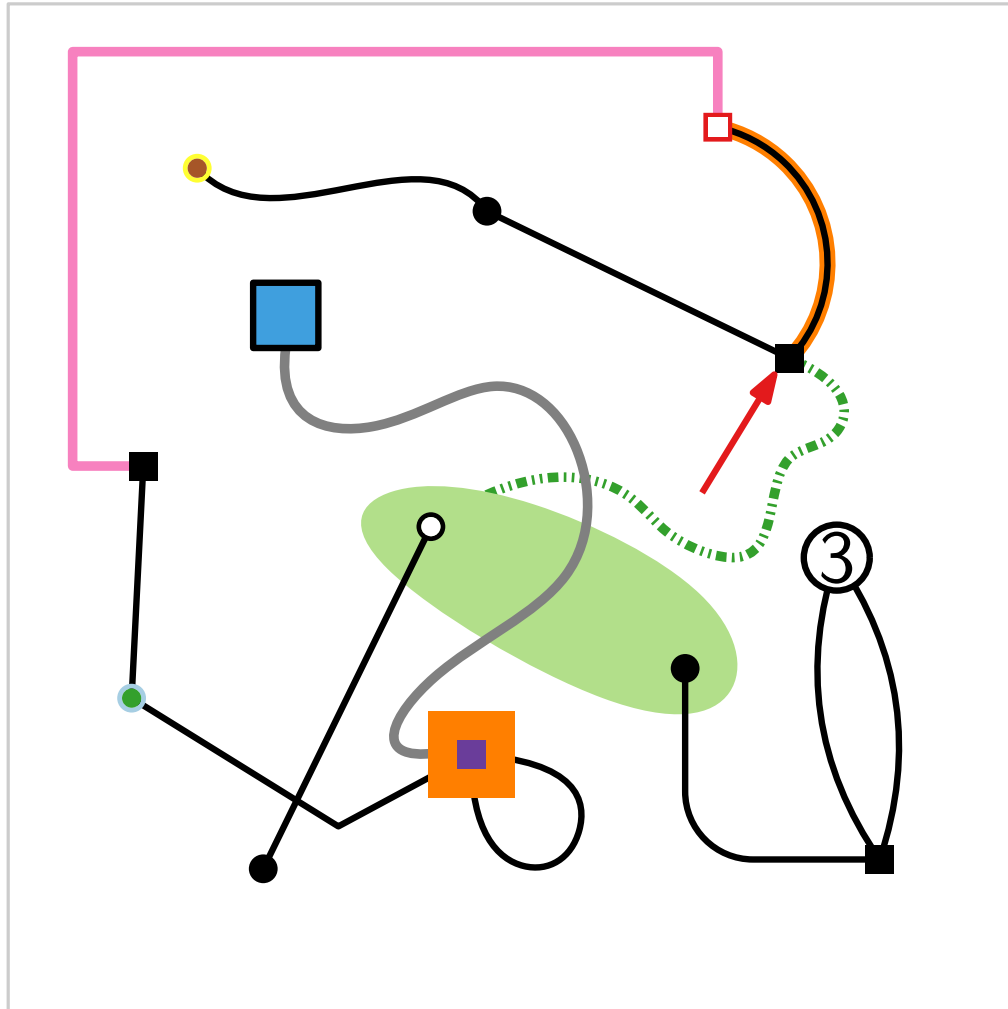
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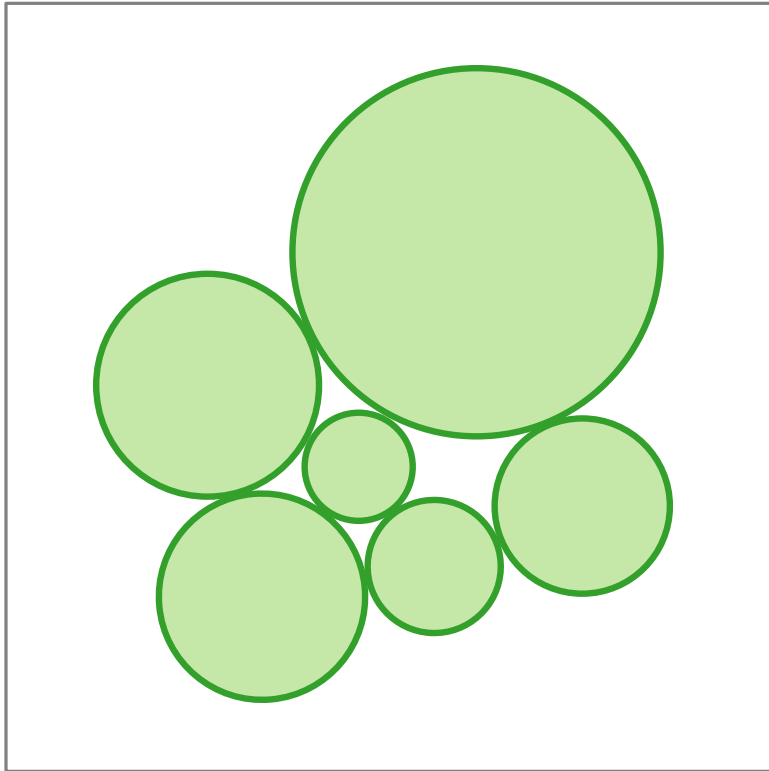
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Challenges: Extracting Drawings

What we don't extract

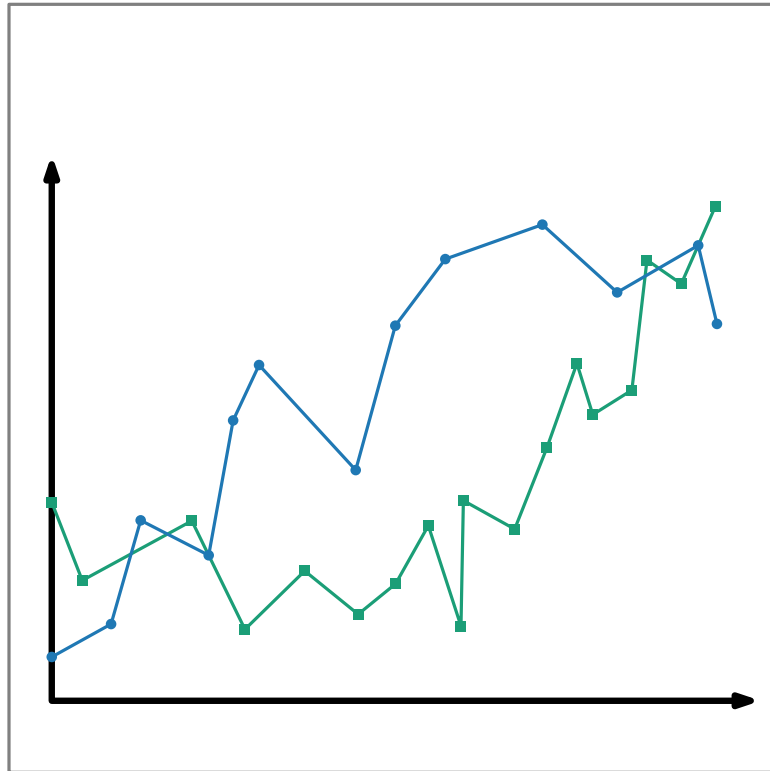


Not a node-link-diagram



Challenges: Extracting Drawings

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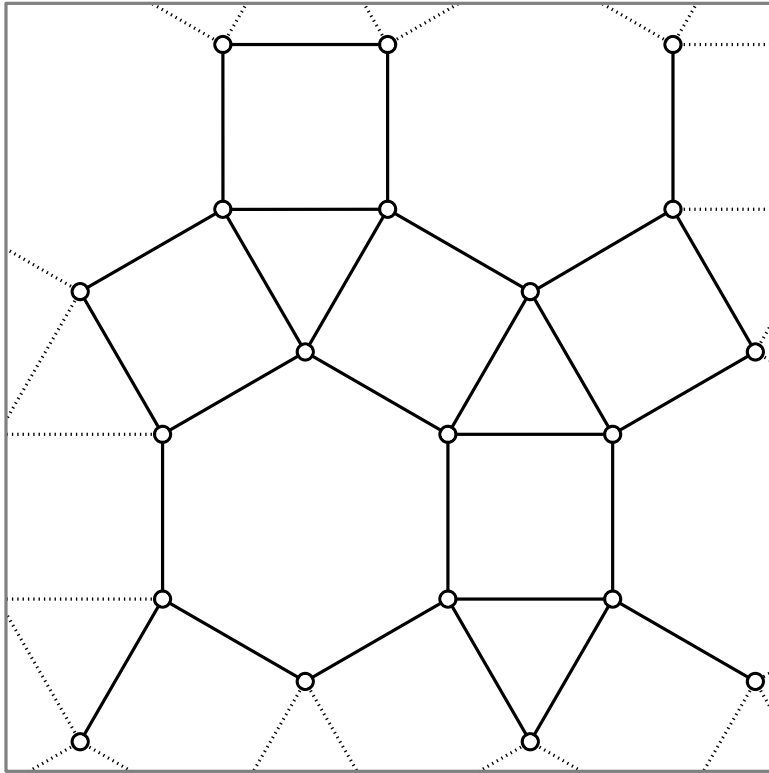
Not a graph drawing

but could be mistaken
for a node-link-diagram



Challenges: Extracting Drawings

What we don't extract

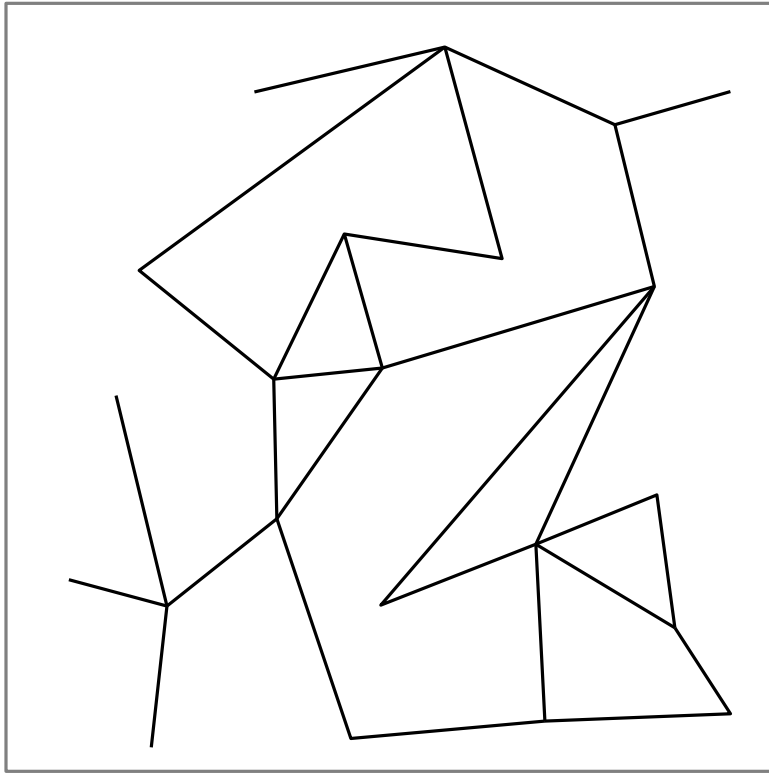


Incomplete drawing



Challenges: Extracting Drawings

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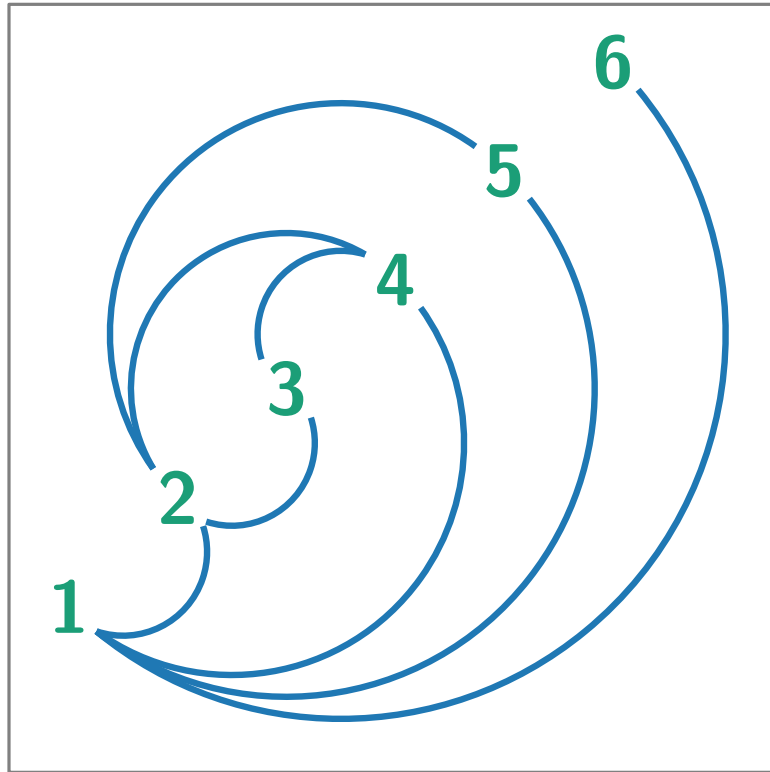


No vertex markers



Challenges: Extracting Drawings

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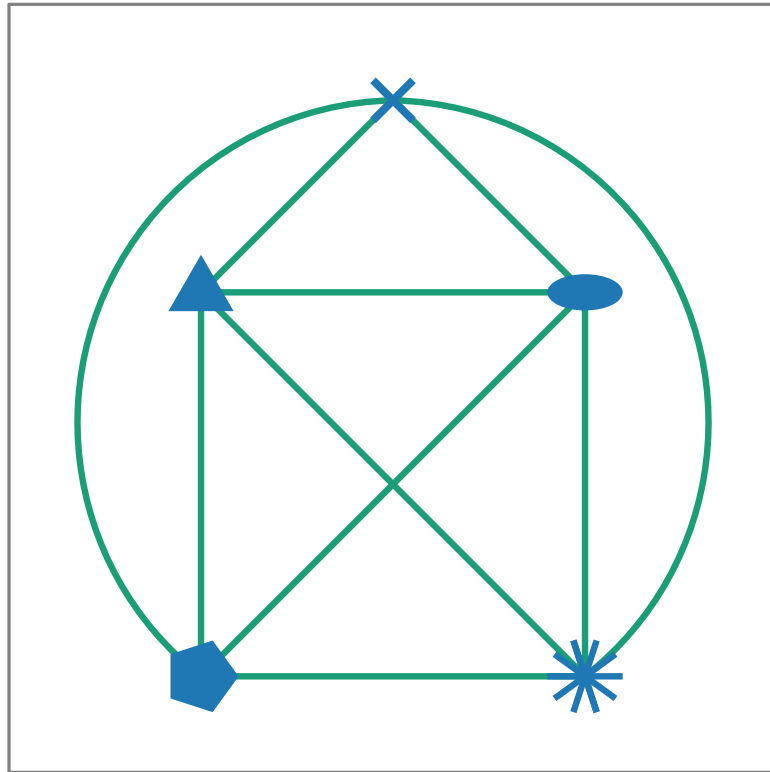


Text-only nodes



Challenges: Extracting Drawings

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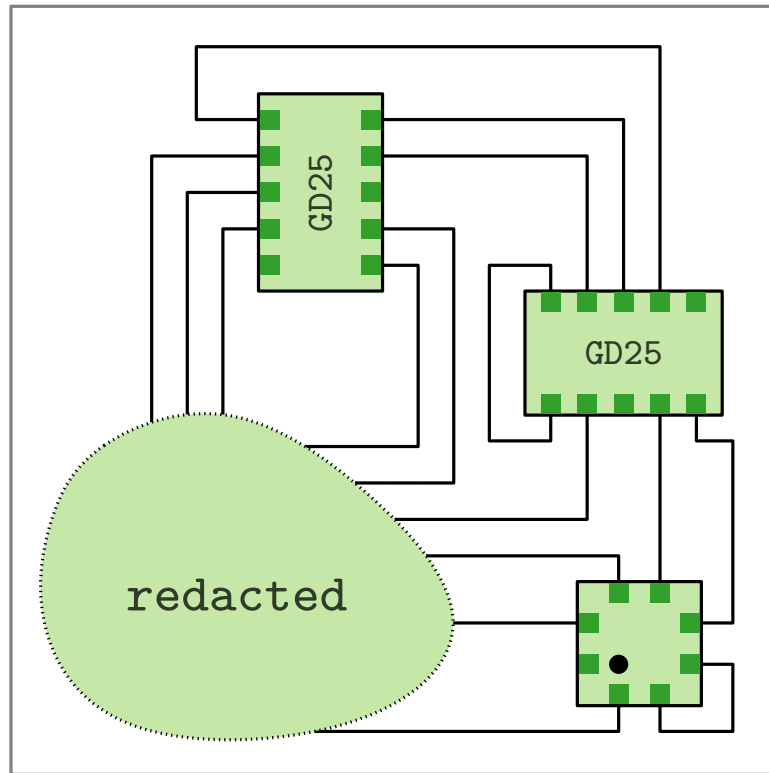


Unusual Node Shapes



Challenges: Extracting Drawings

What we don't extract

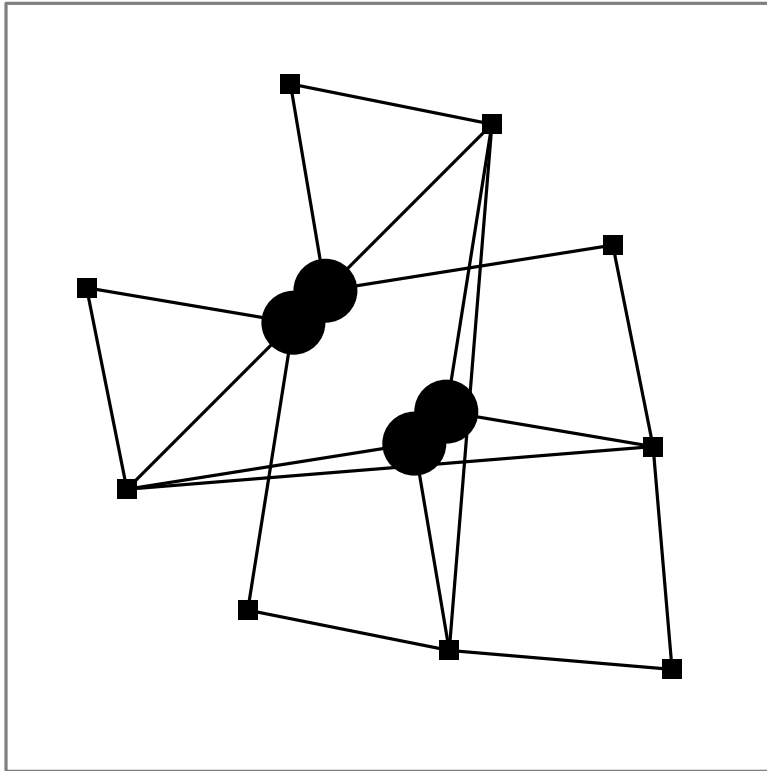


Ports or compose nodes



Challenges: Extracting Drawings

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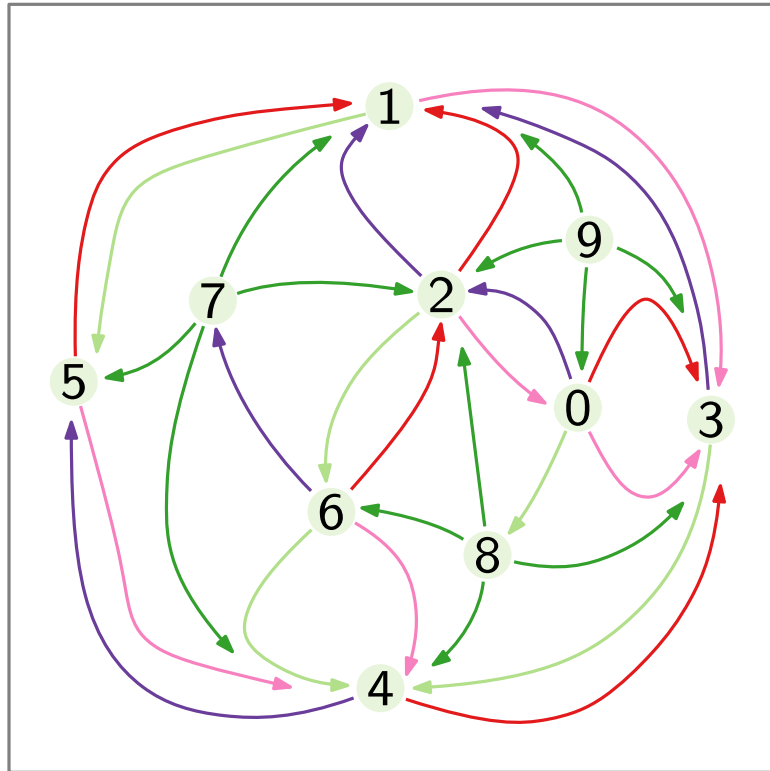


Partially overlapping and/or
ambiguously placed nodes



Challenges: Extracting Drawings

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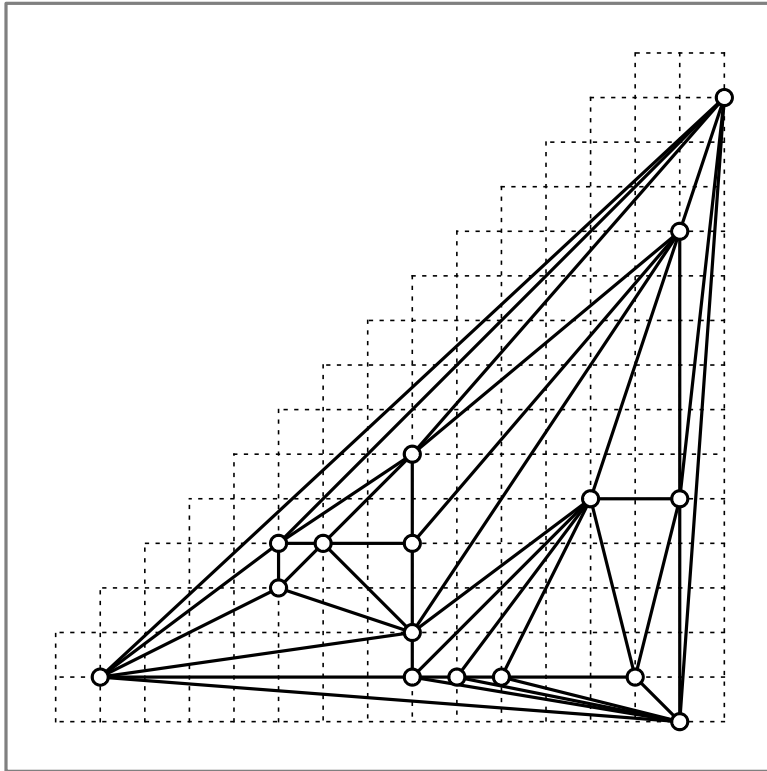


Edges not reaching their target



Challenges: Extracting Drawings

What we don't extract

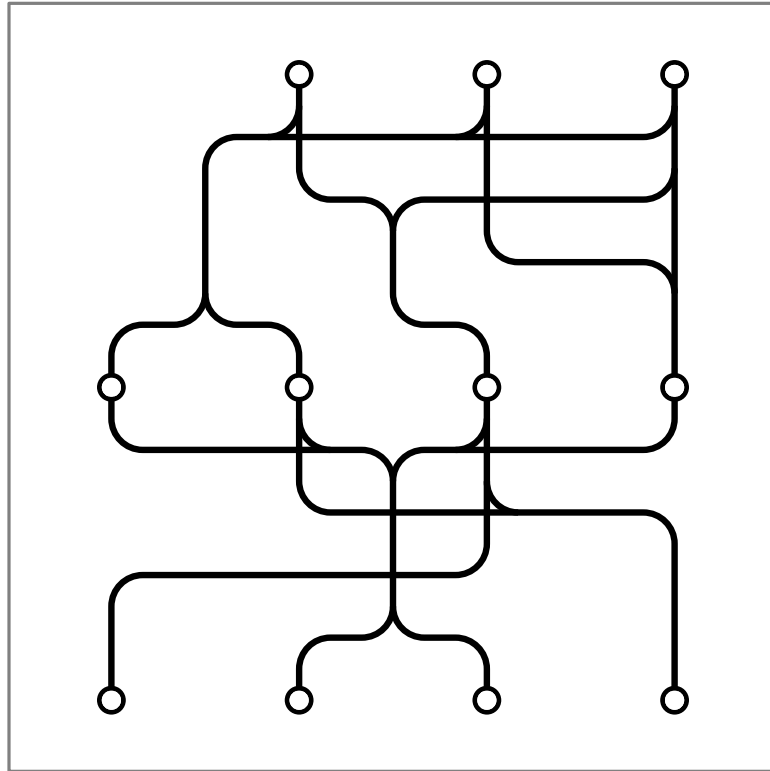


Grid or level lines



Challenges: Extracting Drawings

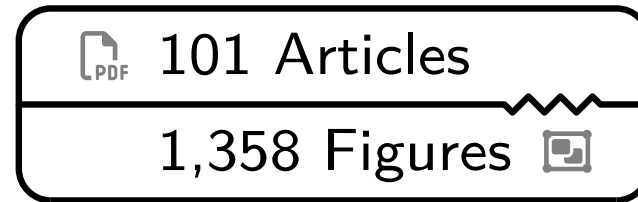
What we don't extract



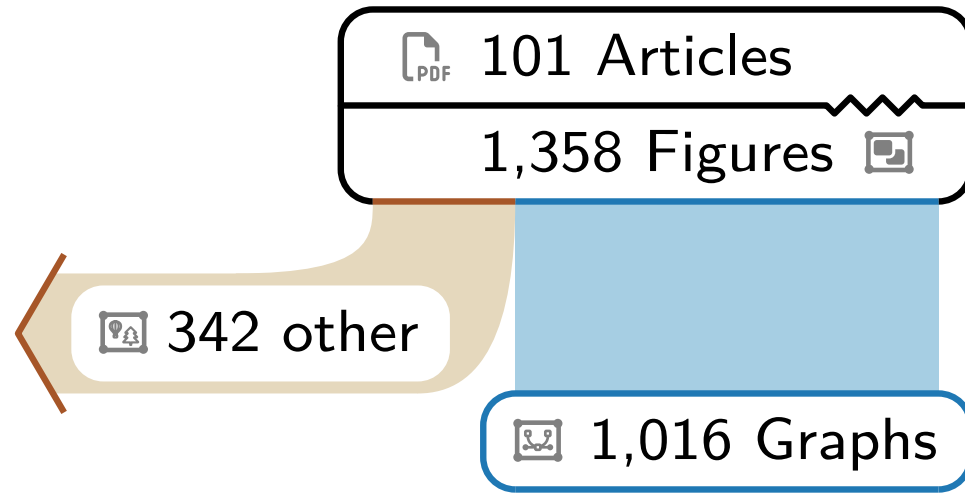
Confluent edges and hyper edges



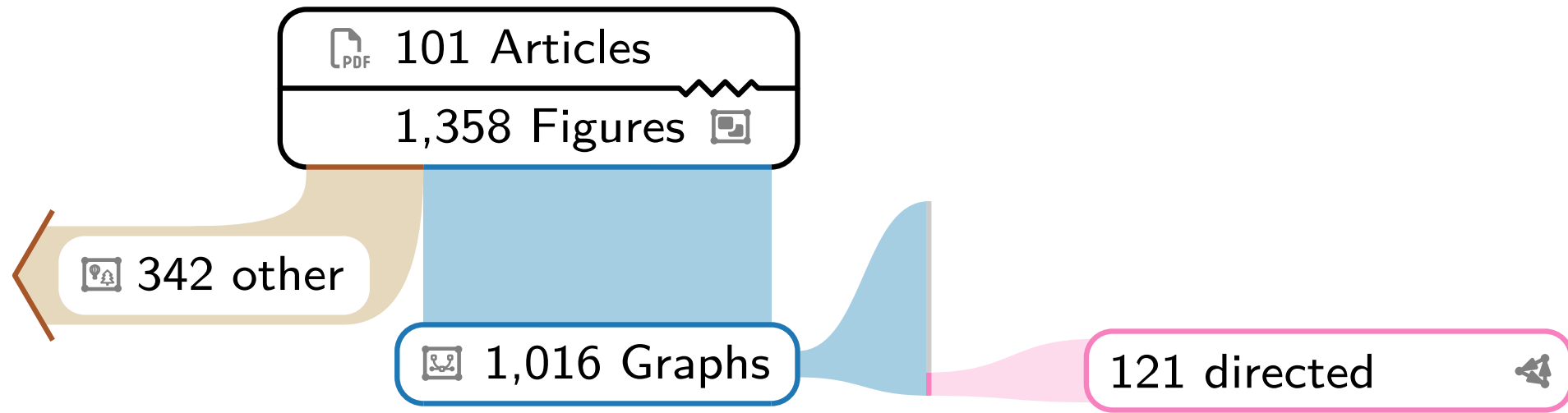
What we Found



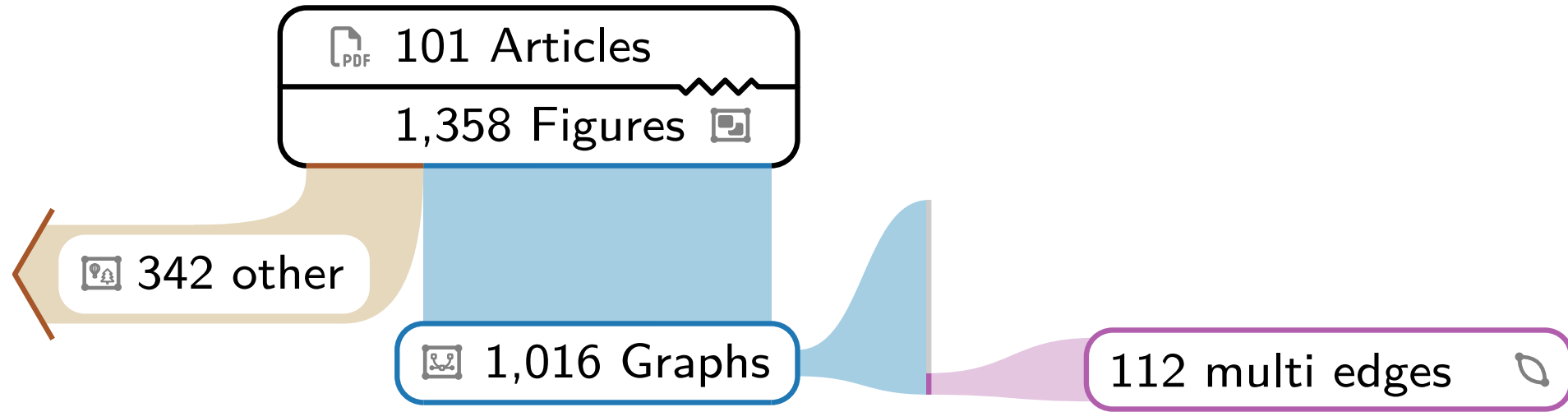
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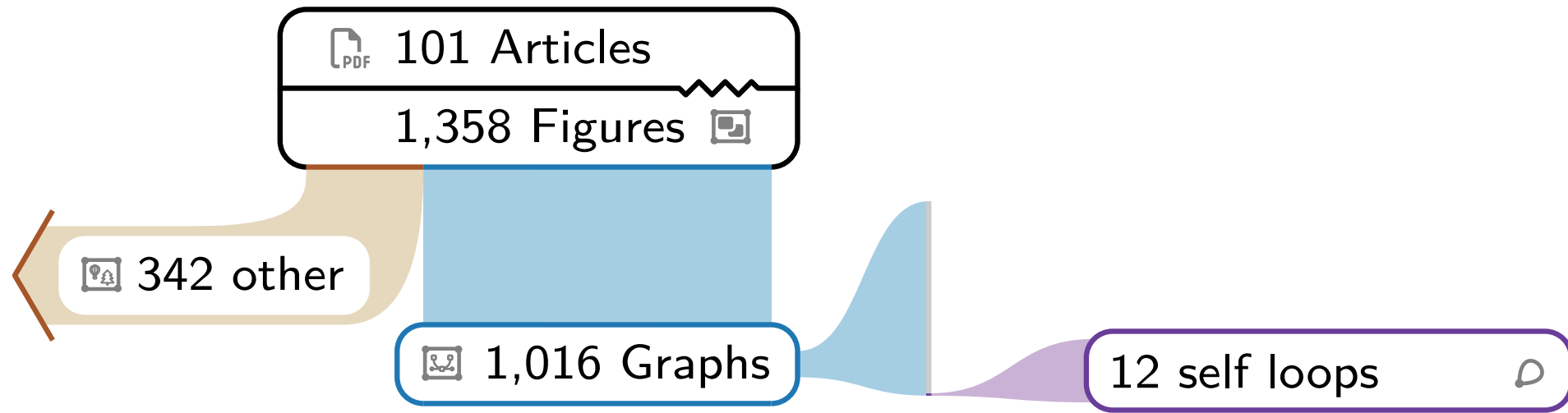
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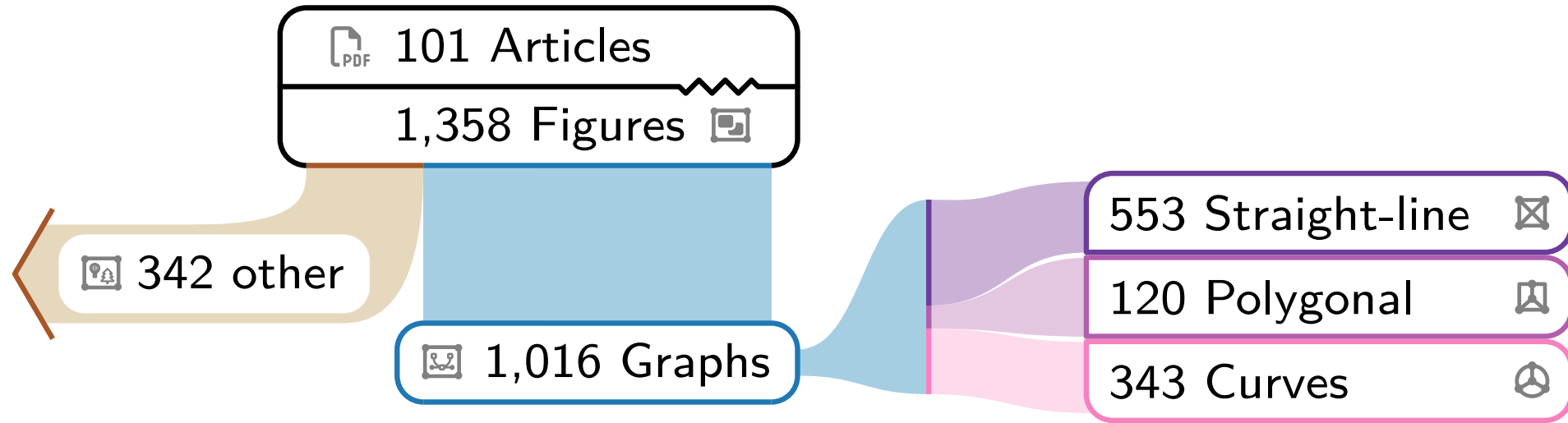
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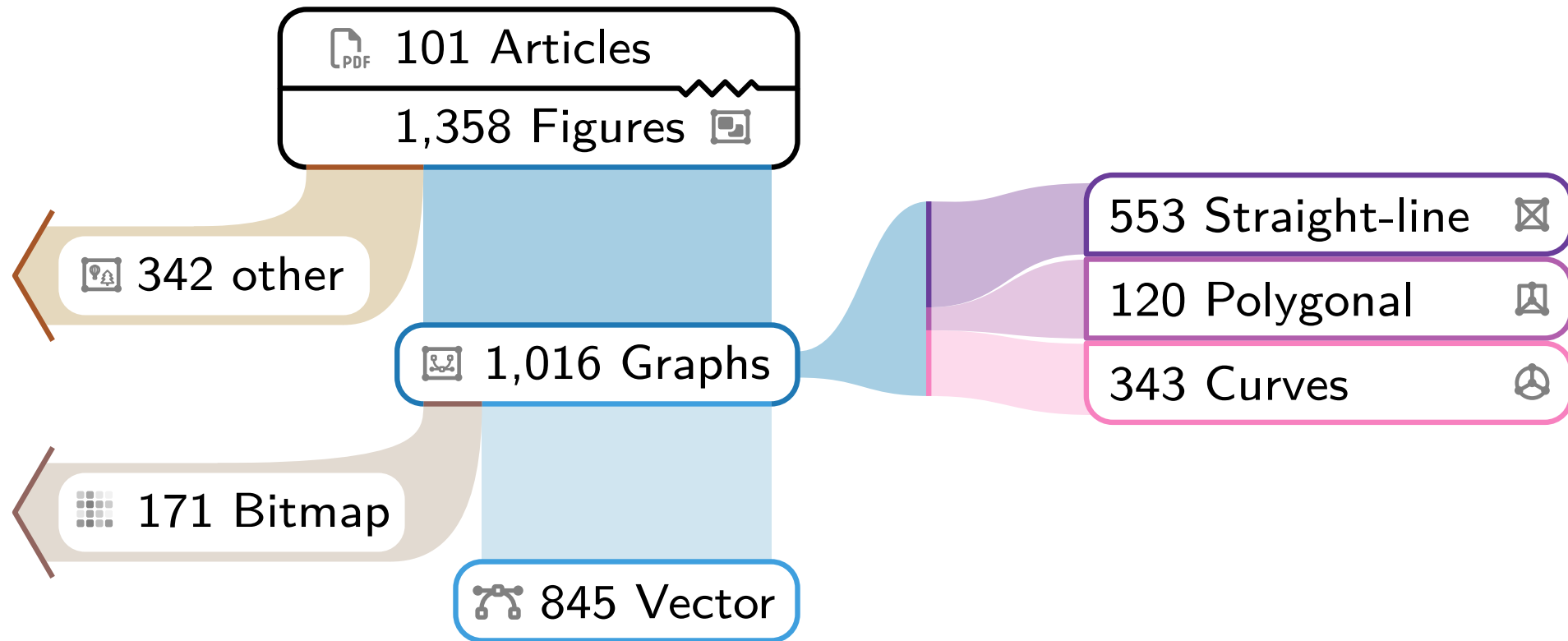
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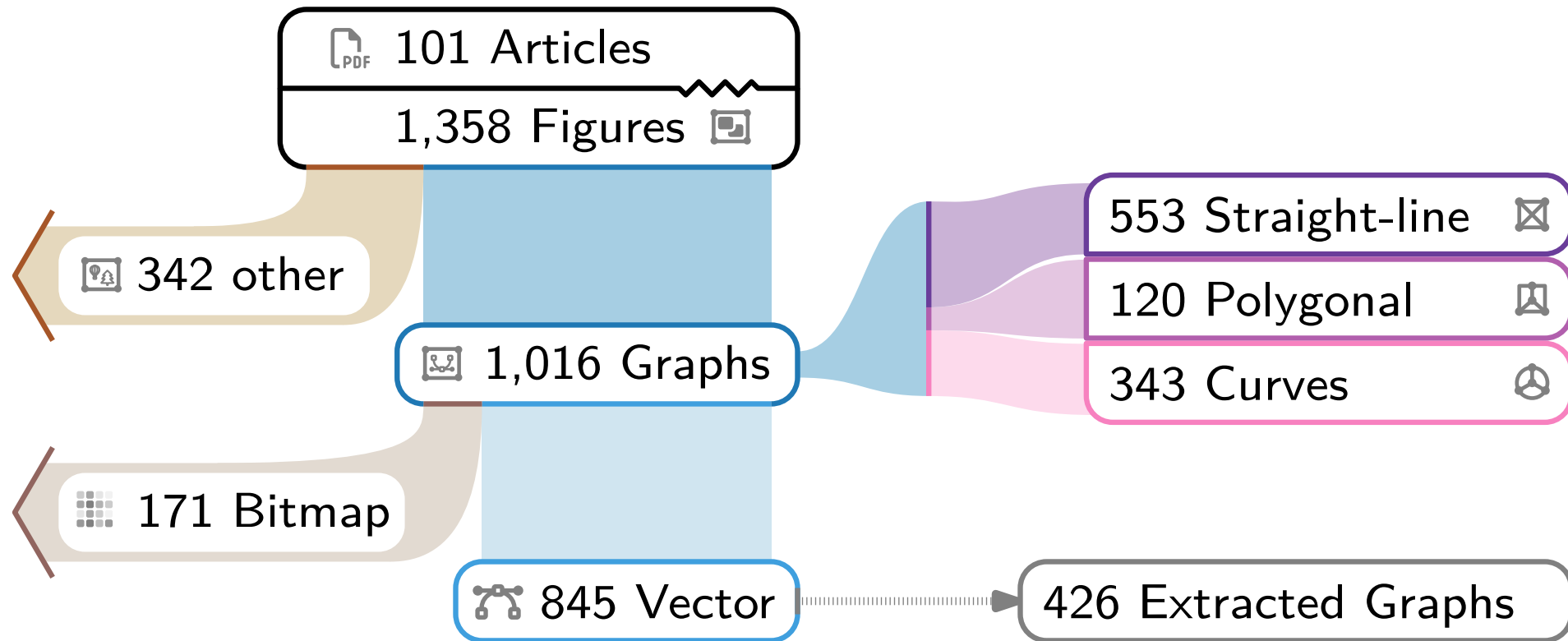
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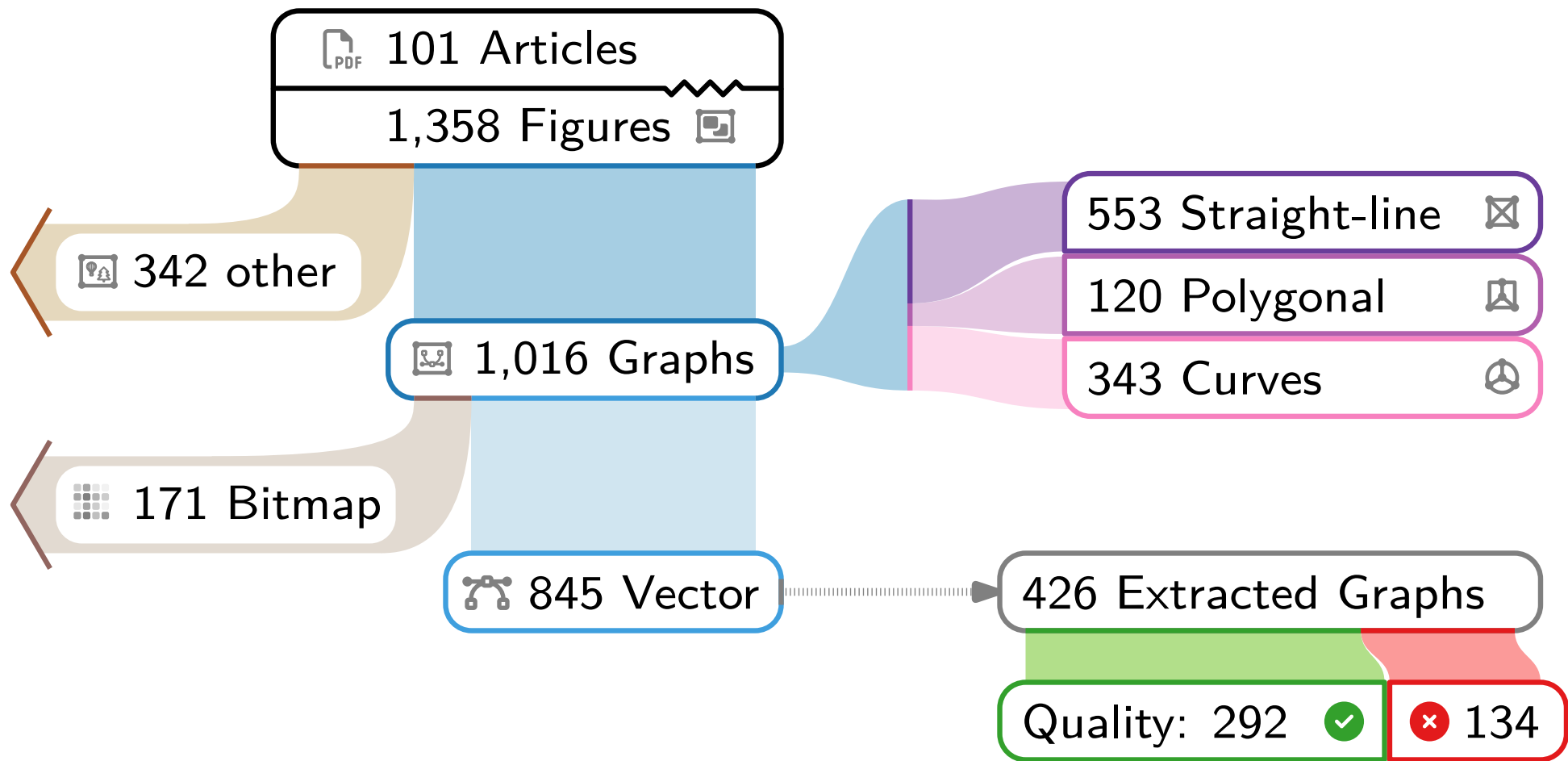
What we Found



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What we Found



Challenges: Evaluating Drawings

Lack of standard representation for curves

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- Some extensions exist (GraphML, DOT) but are not widely deployed/implemented

Challenges: Evaluating Drawings

Lack of standard representation for curves

- Some extensions exist (GraphML, DOT) but are not widely deployed/implemented
- Curves could be approximated with polylines
 - Difficult to extract
 - Unclear how many segments to use

Challenges: Evaluating Drawings

Lack of standard representation for curves

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Lack of standard representation for curves

- Our solution:
GEG (GEG Encodes Graphs)

Challenges: Evaluating Drawings

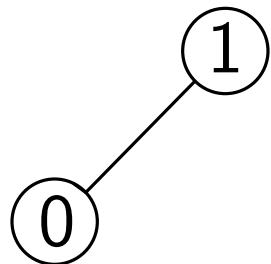
Lack of standard representation for curves

- Our solution:
GEG (GEG Encodes Graphs)
 - JSON based node + edge list
 - Nodes defined by an ID with a position (x,y)
 - Edges defined by node IDs (source→target) and optional *path*

Challenges: Evaluating Drawings

Lack of standard representation for curves

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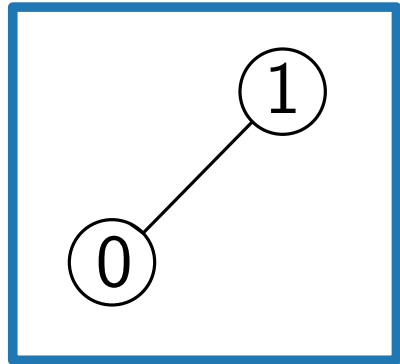


```
{ "graph": { "directed": false },  
  "nodes": [  
    { "id" : "0",  
      "position" : [0,0],  
      "shape" : "ellipse" },  
    { "id" : "1",  
      "position" : [1,1],  
      "shape" : "ellipse" },  
  ],  
  "edges": [  
    { "id" : "2",  
      "source" : "0",  
      "target" : "1",  
      "polyline" : false,  
      "path" : "M0,0 L1,1" },  
  ]  
}
```

Challenges: Evaluating Drawings

Lack of standard representation for curves

- Edge geometries represented by SVG paths

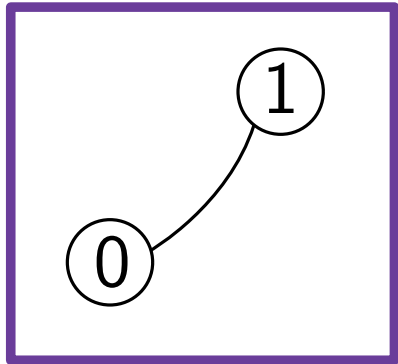


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{ "graph": { "directed": false },
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  ],
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    { "id" : "2",
      "source" : "0",
      "target" : "1",
      "polyline" : false,
      "path" : "M0,0 L1,1" },
  ]
}
```


Challenges: Evaluating Drawings

Lack of standard representation for curves

- Edge geometries represented by SVG paths



```
"path" : "M0,0 Q0.5,0 1,1";
```

Challenges: Evaluating Drawings

Metrics typically assume straight-line edges

- **Aspect Ratio (Asp):** Bounding box should be 'square'
- **Angular Resolution (AR):** Maximise the minimum angle between adjacent edges
- **Crossing Angle (CA):** Edges cross at right angles
- **Edge Crossings (EC):** Minimise the number of edge crossings
- **Edge Length Deviation (ELD):** Make edge lengths uniform
- **Edge Orthogonality (EO):** Keep edges vertical or horizontal
- **Neighborhood Preservation (NP):** K-nearest neighbours in the graph positioned close together in the drawing
- **Node Resolution (NR):** Avoid overlapping (or very close) nodes
- **Node Uniformity (NU):** Distribute nodes evenly in the plane
- **Stress (KSM):** Geometric distances matches graph-theoretic distance

Challenges: Evaluating Drawings

Some are defined on node positions only, and require no changes

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Challenges: Evaluating Drawings

Some only require changes in their implementations

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Challenges: Evaluating Drawings

[Mooney, Purchase, Wybrow, Kobourov]
Pacific VIS 2024

Some require definitional adjustments

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Edge Length Deviation

Edge Length Deviation (ELD) of a drawing D is the average relative deviation of edge lengths from an ideal value:

$$\text{ELD}(D) = 1 / \left(1 + \frac{1}{|E(D)|} \sum_{e \in E(D)} \left| \frac{L(e) - L_{\text{ideal}}(D)}{L_{\text{ideal}}(D)} \right| \right)$$

where $L(e)$ is the geometric length of edge e , either as the arc length of a curved path or the summed Euclidean length of straight-line segments, and $L_{\text{ideal}}(D) = (\sum_{e \in E(D)} L(e)) / |E(D)|$ is the average edge length of D .



Edge Length Deviation

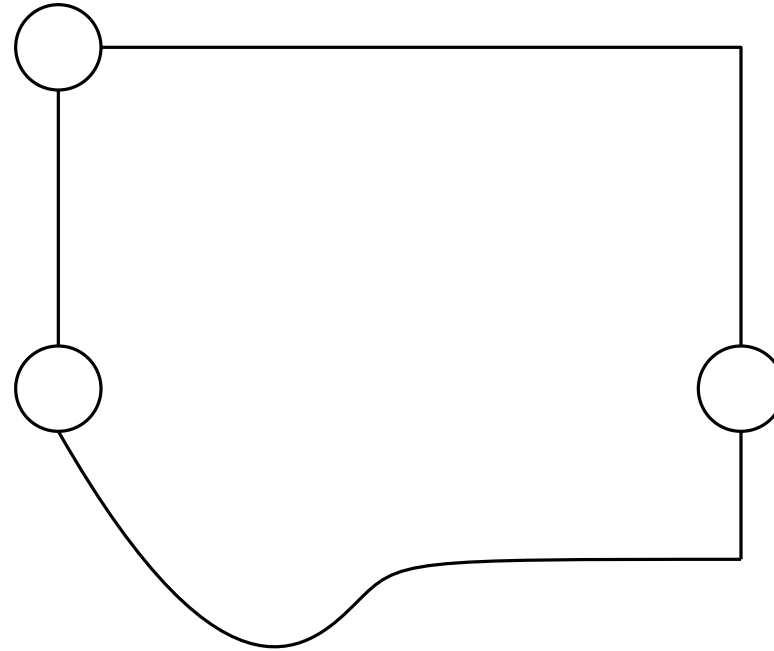
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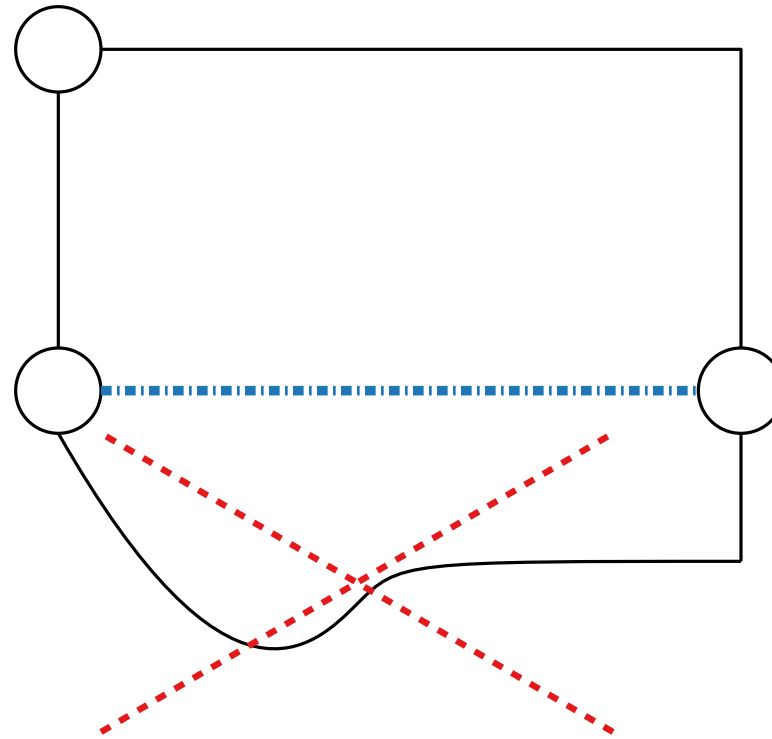
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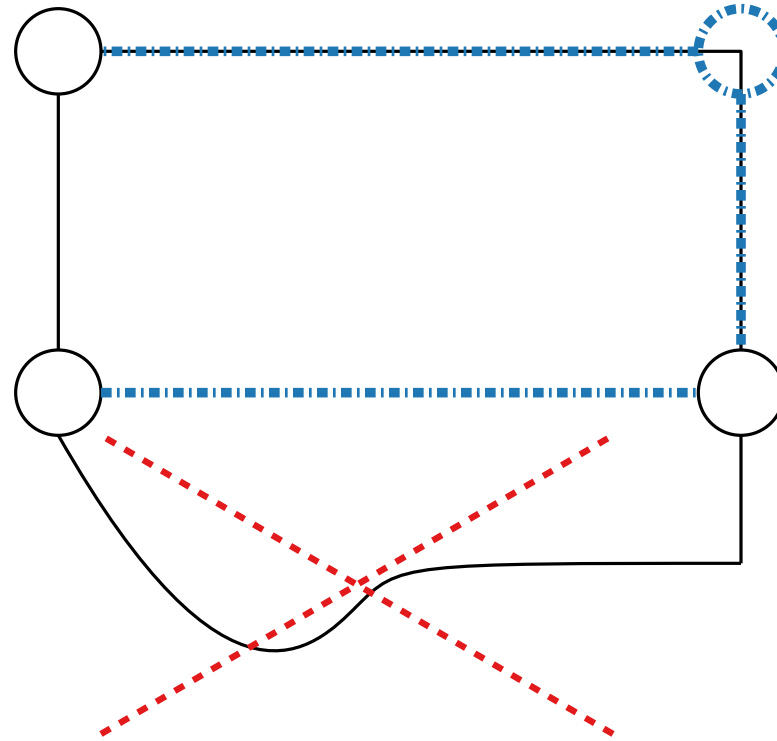
Edge Length Deviation



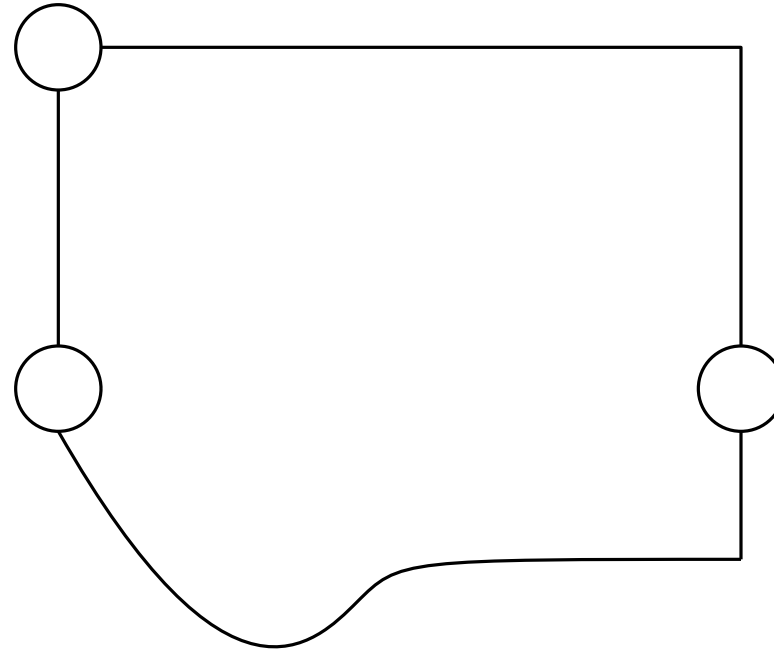
Edge Length Deviation



Edge Length Deviation



Edge Length Deviation



Edge Orthogonality

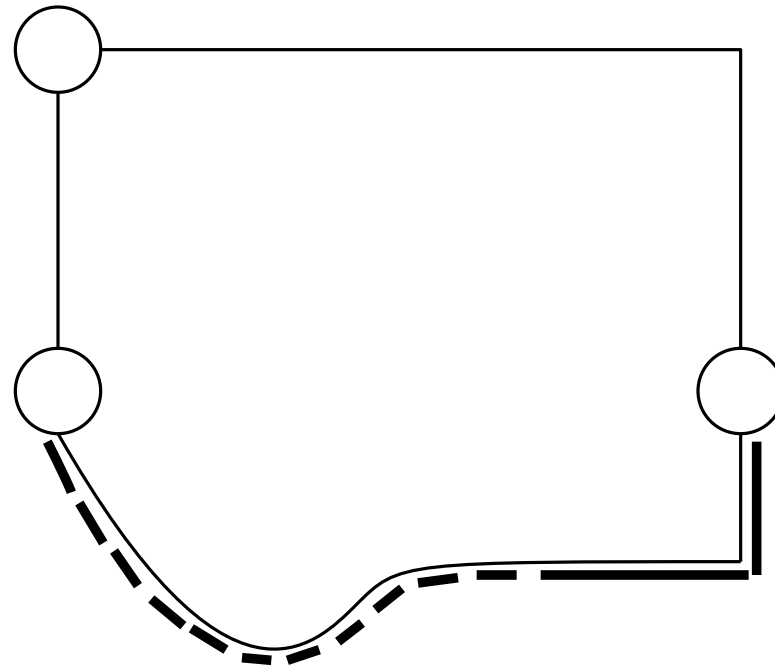
Edge Orthogonality (EO) of a drawing D is the average angular deviation of edges from the horizontal or vertical axes:

$$\text{EO}(D) = 1 - \frac{1}{|E(D)|} \sum_{e \in E(D)} \delta_e, \text{ where}$$

$$\delta_e = \sum_{j=1}^{k_e} \frac{\min(\theta_{e,j}, |90^\circ - \theta_{e,j}|, 180^\circ - \theta_{e,j})}{45^\circ} \cdot \frac{\ell_{e,j}}{\tilde{L}(e)}$$

is the length-weighted orthogonality deviation of edge e , each edge e is approximated by a polygonal line $P(e)$ with k_e straight-line segments, $\theta_{e,j}$ is the absolute angle between segment j of $P(e)$ and the horizontal axis, $\ell_{e,j}$ is the length of segment j of $P(e)$, and $\tilde{L}(e) = \sum_{j=1}^{k_e} \ell_{e,j}$ is the total length of $P(e)$.

Edge Orthogonality



GD Proceedings: The Papers

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Q: How many papers contain drawings?

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A: 71.4% (740/1,037)*

*Not all drawings were successfully extracted

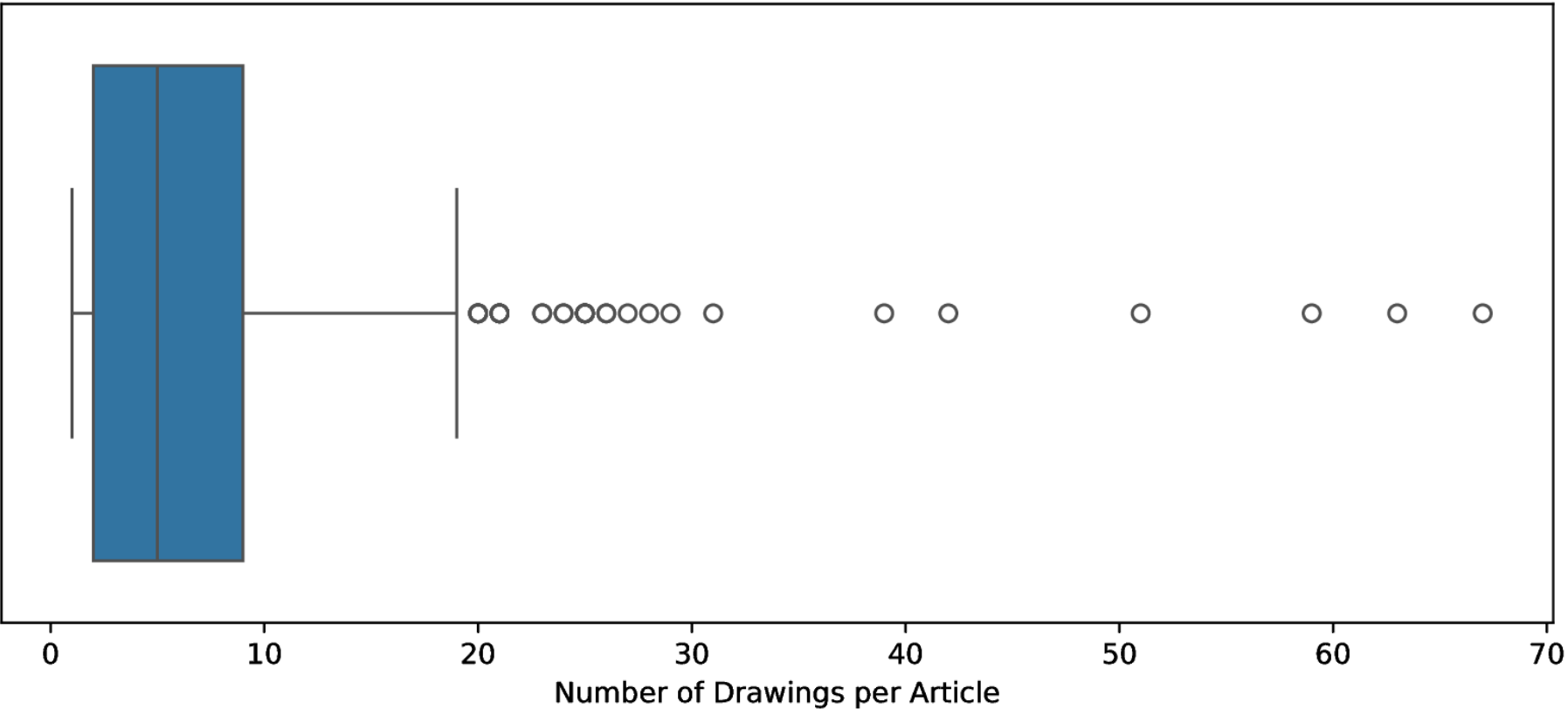
GD Proceedings: The Papers

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Distribution of Drawings per Article (excluding Articles Without Drawings)



Median 5
drawings per
paper

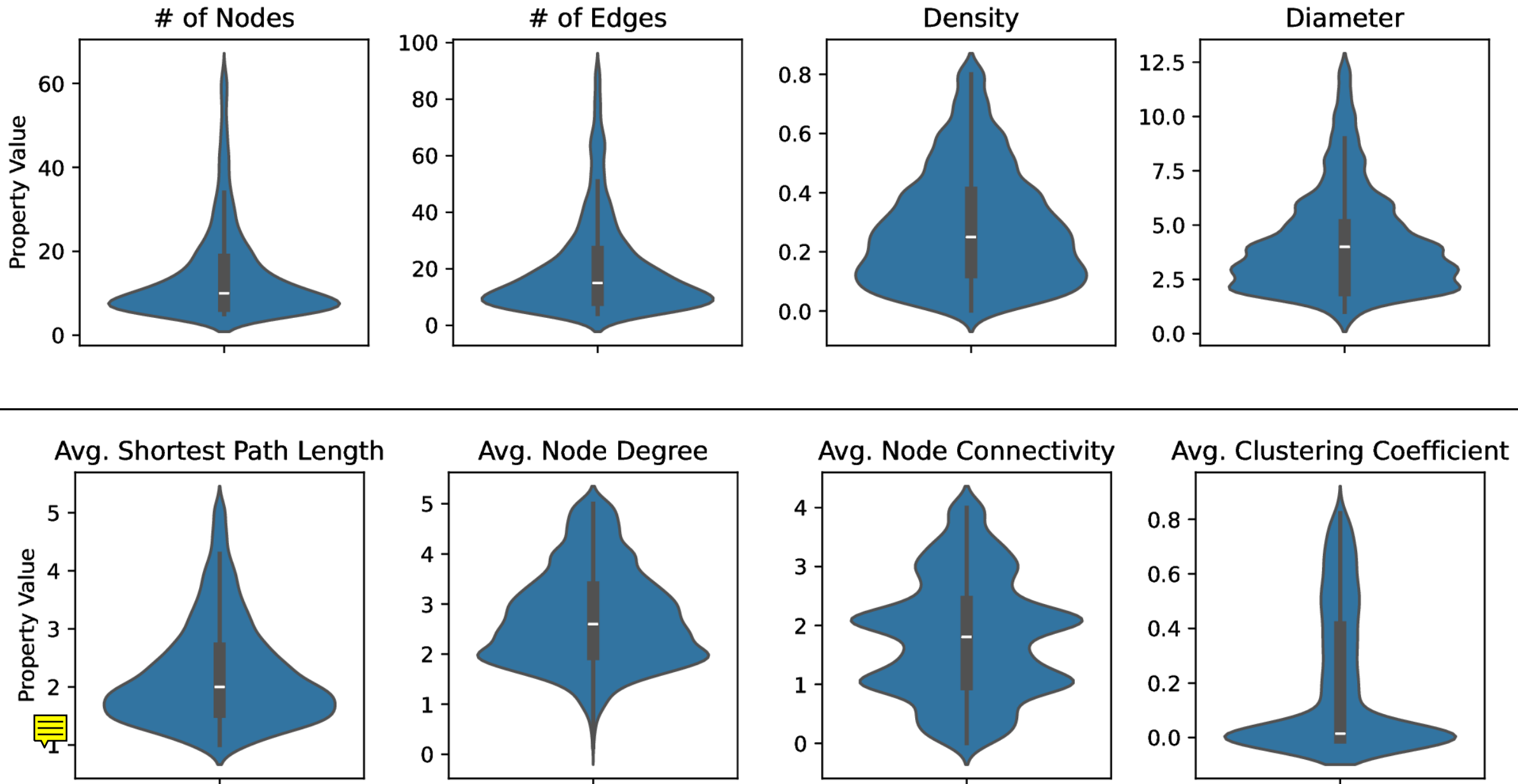
GD Proceedings: The Graphs

We extracted 4,890 graph drawings

- 77.1% connected
- 17.6% multi-graphs
- 86.1% planar
 - but only 57.4% drawn without crossings



GD Proceedings: The Graphs



GD Proceedings: The Drawings

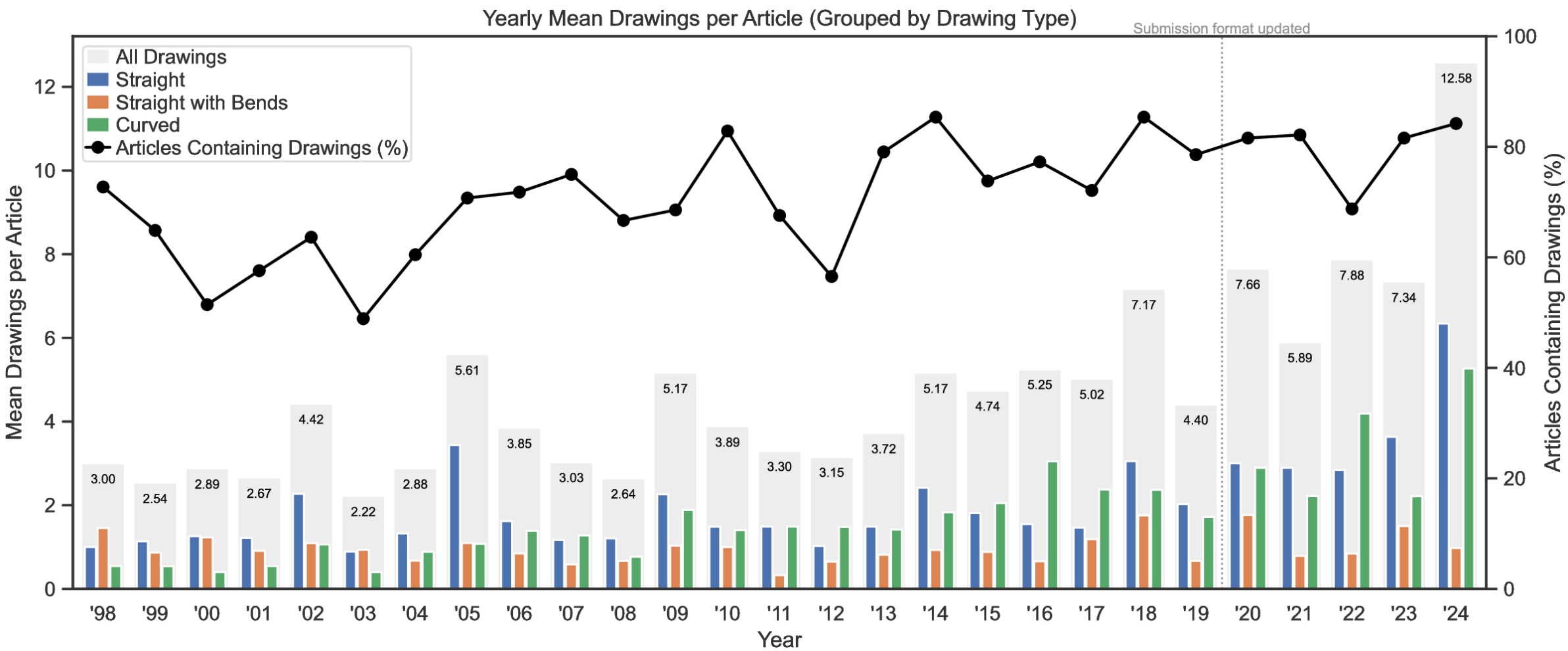
We categorise the extracted drawings into three sets based on edge geometry:

- **Straight** (43.0%), **Polygonal** (20.4%), **Curved** (36.6%)

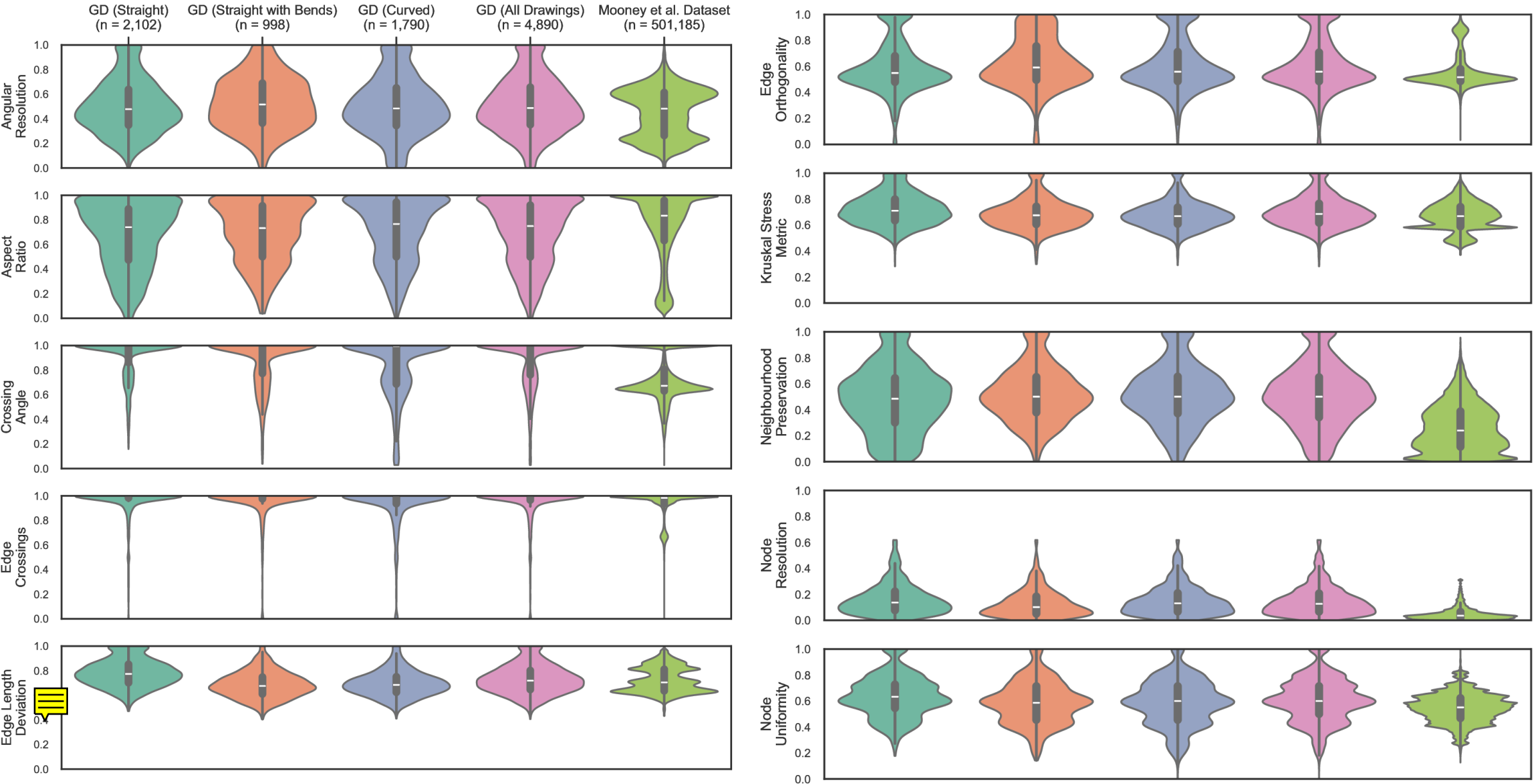
GD Proceedings: The Drawings

We categorise the extracted drawings into three sets based on edge geometry:

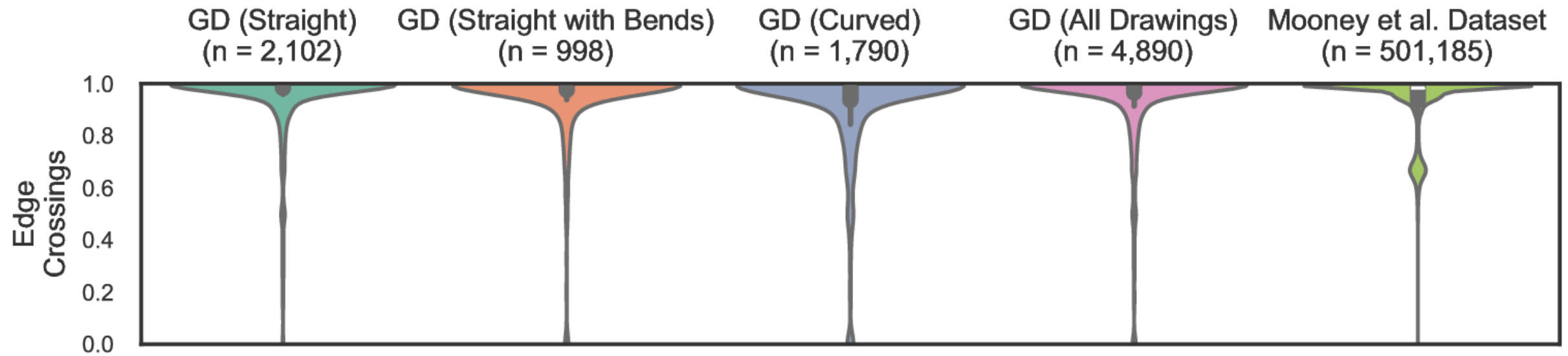
- **Straight** (43.0%), **Polygonal** (20.4%), **Curved** (36.6%)



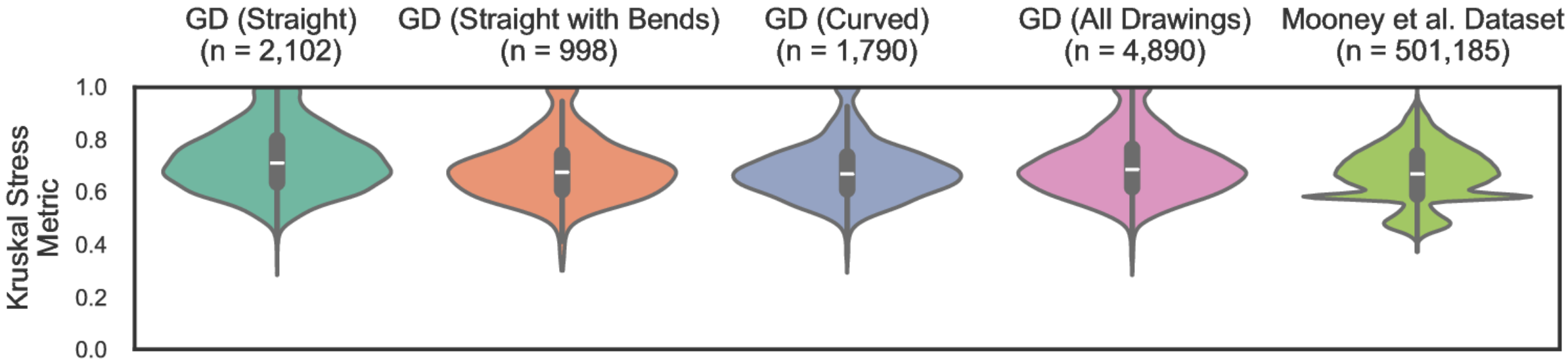
GD Proceedings: The Landscape



GD Proceedings: The Landscape



GD Proceedings: The Landscape



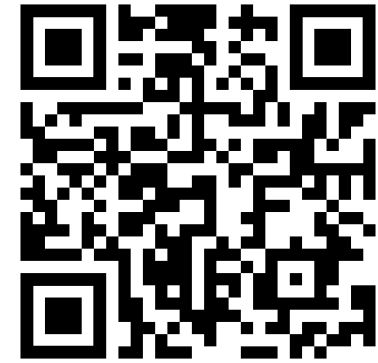
Conclusion

- Extended Graph Harvester to extract graph drawings from PDFs
- Redefined and implemented metrics, generalized to support complex edge geometries
- Explored the metrics landscape of the GD proceedings from 1998-2024

To support future analysis:

- Use vector images (not bitmap)
- Use vertex markers
- Avoid annotations that can be mistaken for edges

Metrics: <https://github.com/gavjmooney/geg>



Dataset: <https://github.com/hegetim/gd-collection>

