

# The permuton tree



**Benoît Corsini**

joint work with Victor Dubach  
and Valentin Féray

# Table of Content

 Binary search trees

 Permutons

 Our results

 The conditions

# Table of Content

 Binary search trees

 Permutons

 Our results

 The conditions

# Motivation

# Motivation



# Motivation



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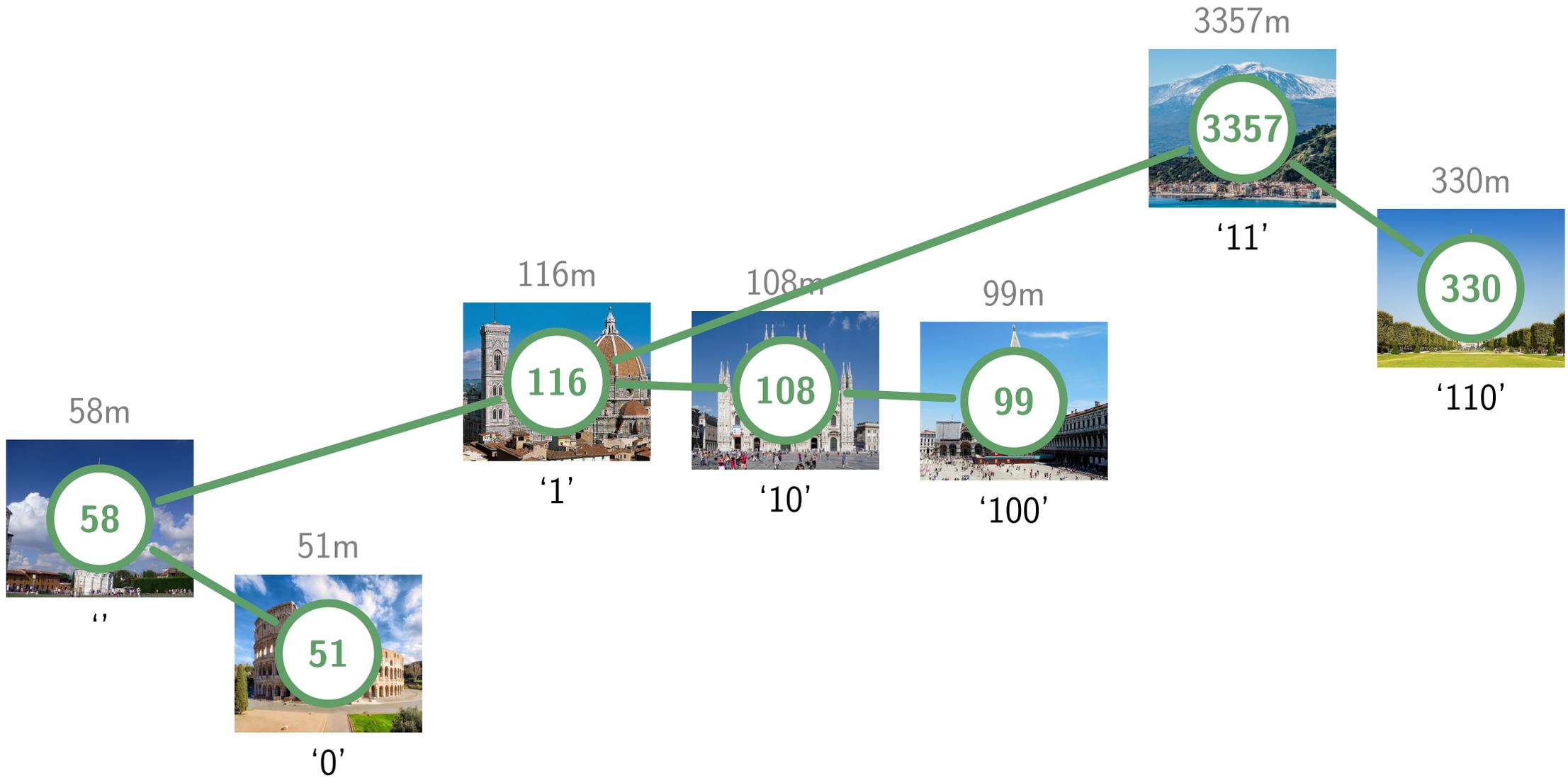
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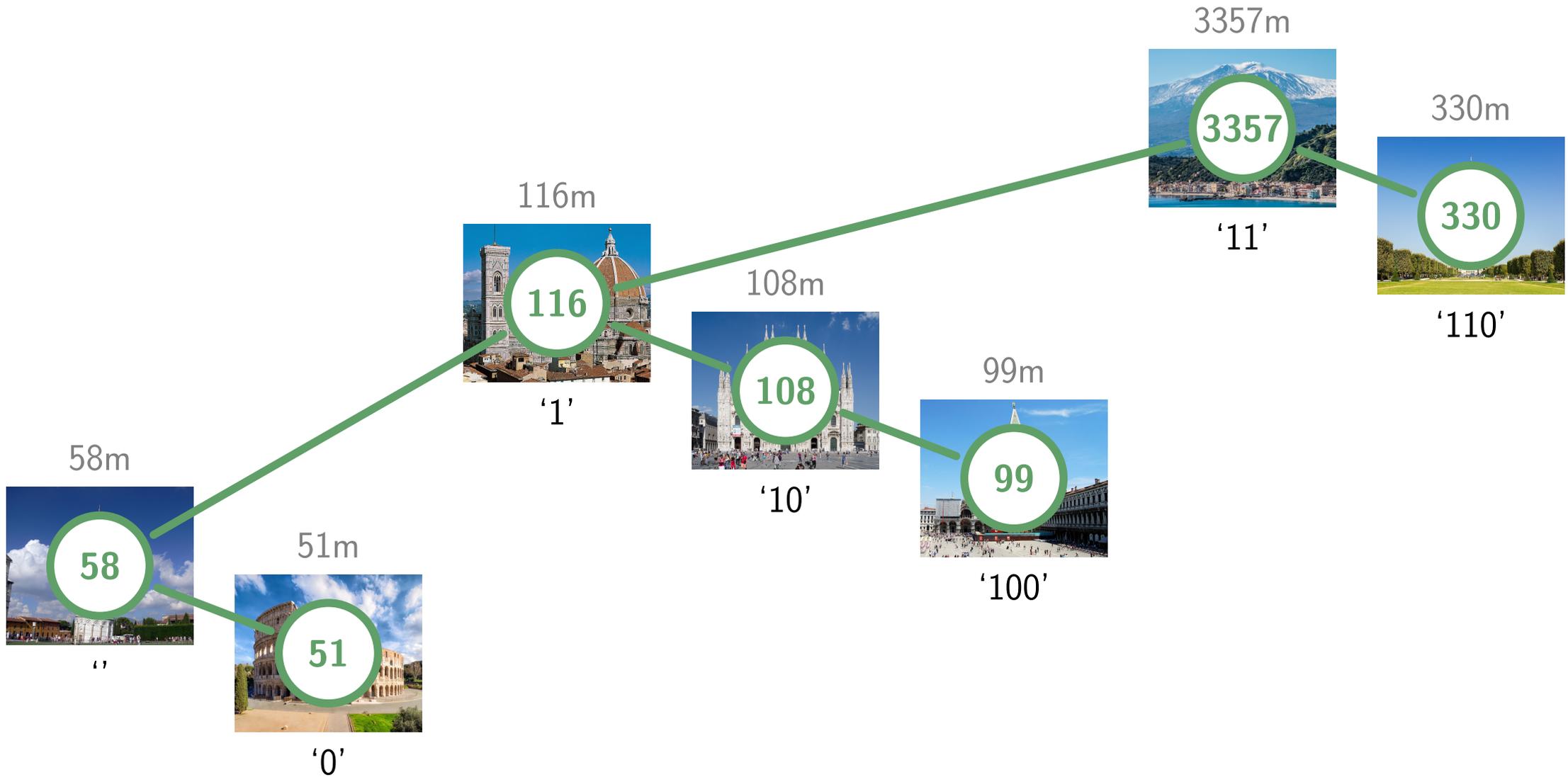


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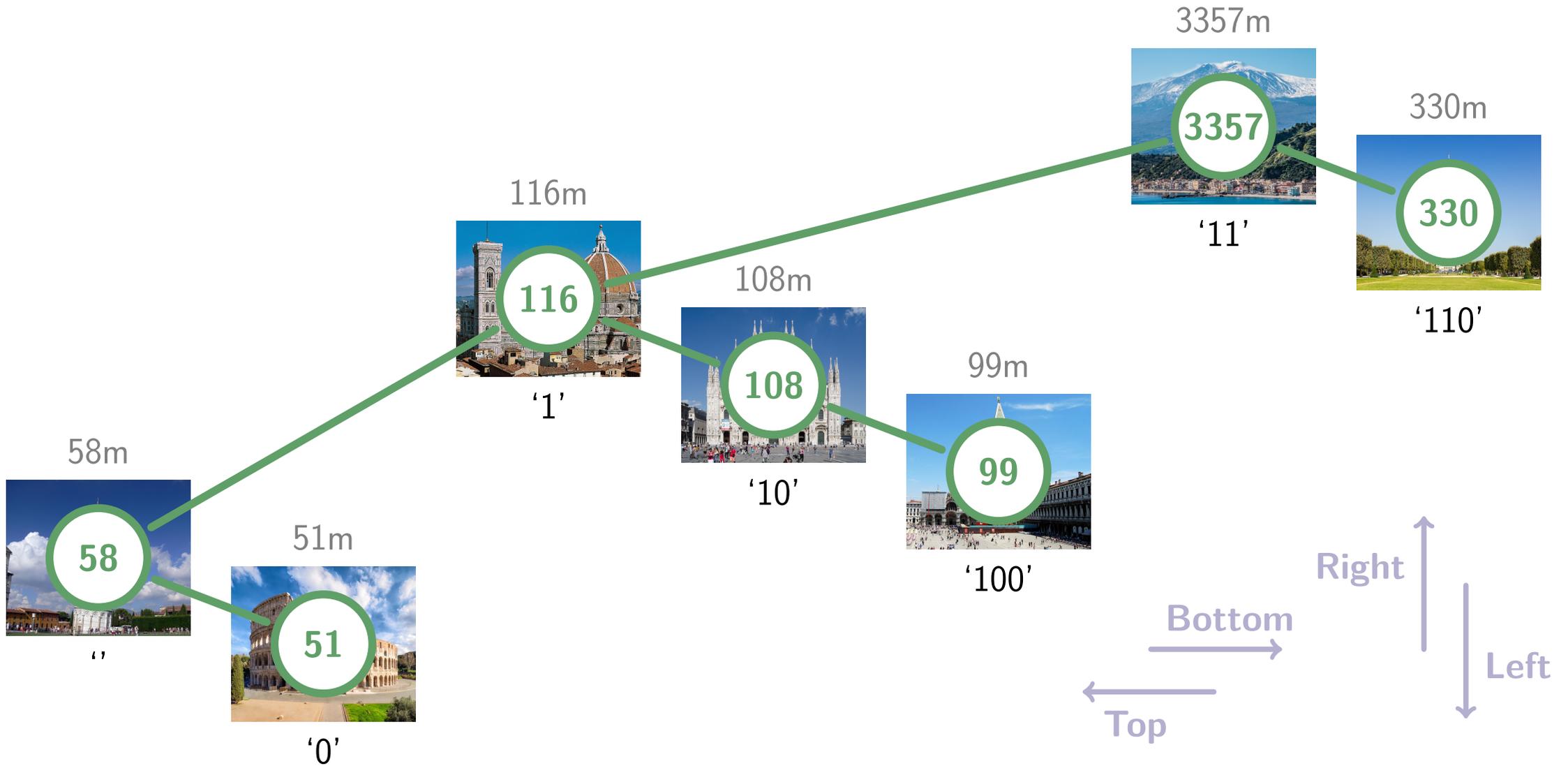
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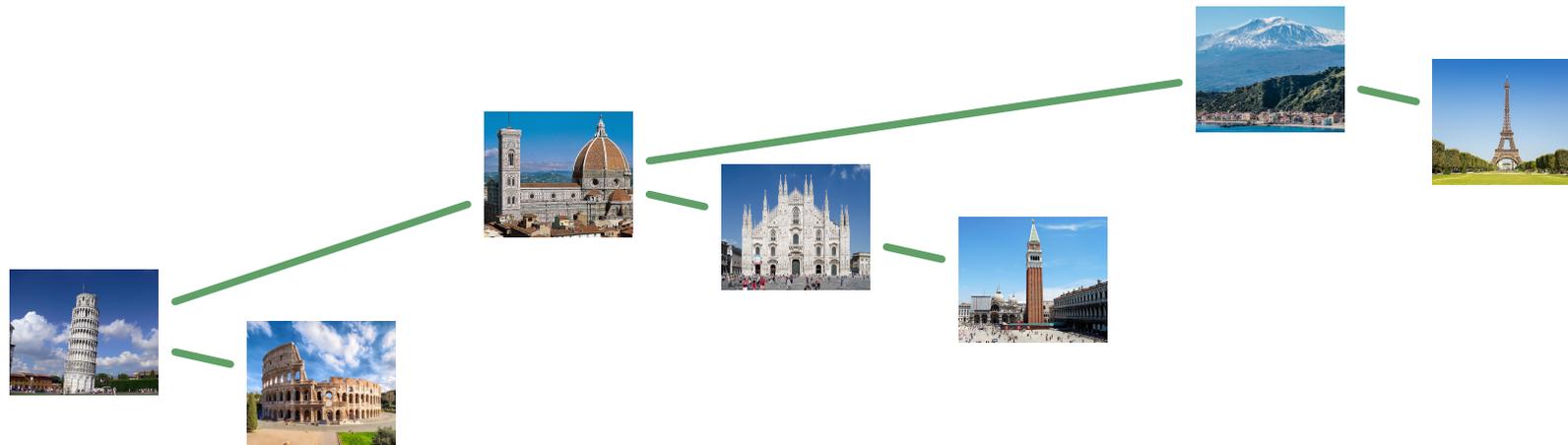
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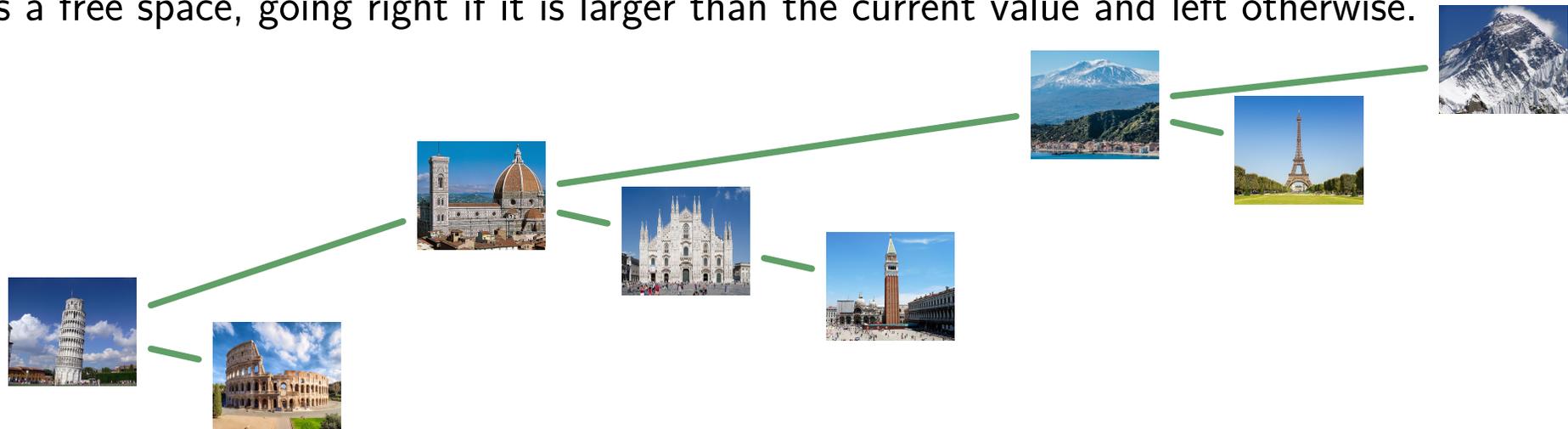
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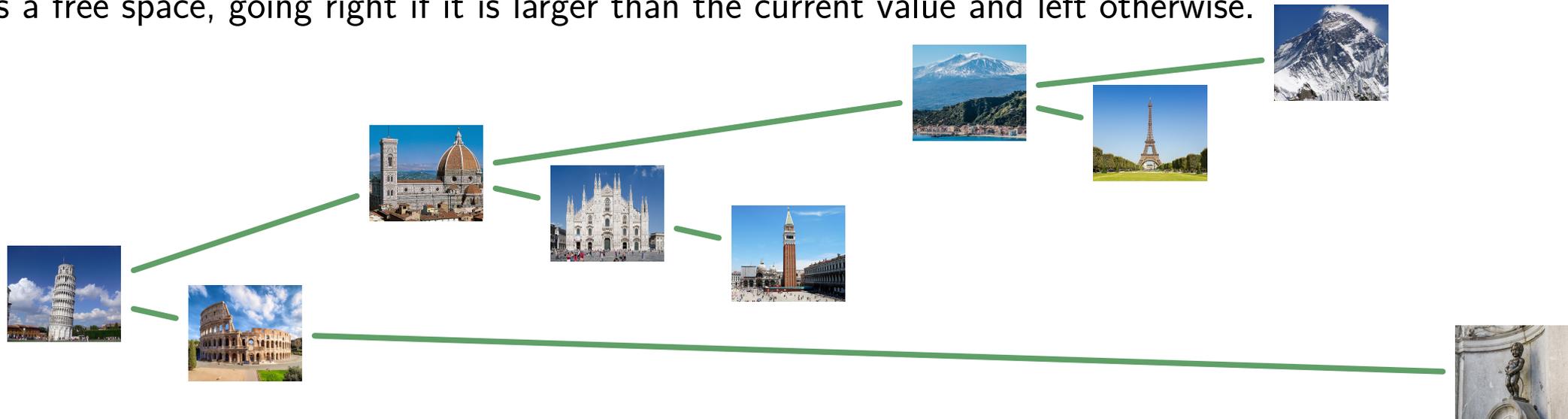
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- Seen as storing devices, we are often interested in the “worst case retrieval time”, corresponding to the height of the binary search tree.

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**Devroye (1986)**

Let  $H_n$  be the height of a RBST of size  $n$ . Then there exists a constant  $c^* \simeq 4.311\dots$  such that

$$\frac{H_n}{c^* \log n} \longrightarrow 1.$$

# Table of Content

 Binary search trees

 **Permutons**

 Our results

 The conditions

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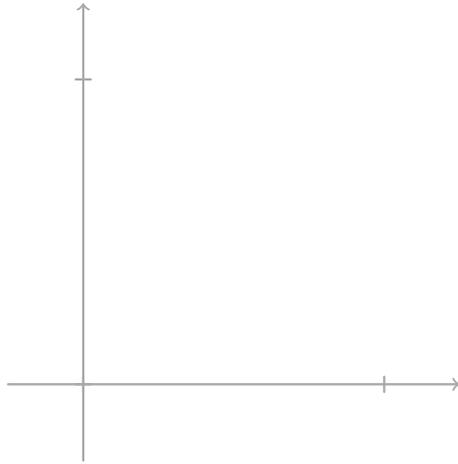
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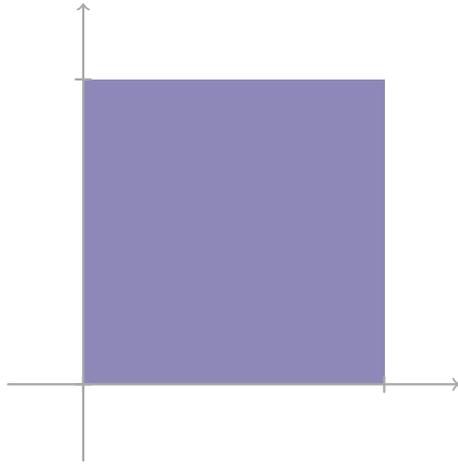
→ We call such a distribution a *permuton*.

# Examples

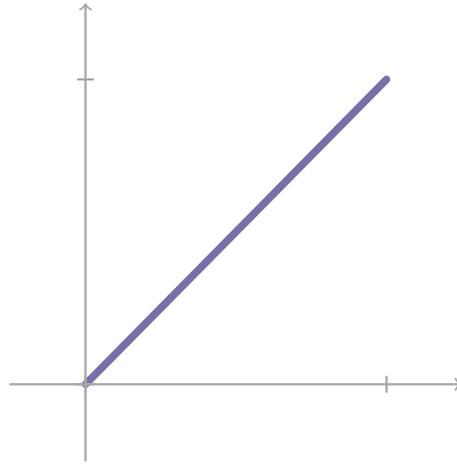
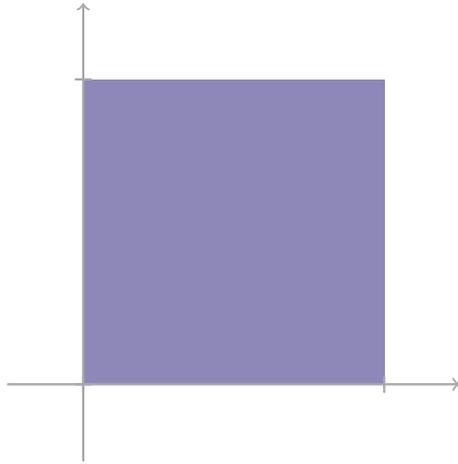
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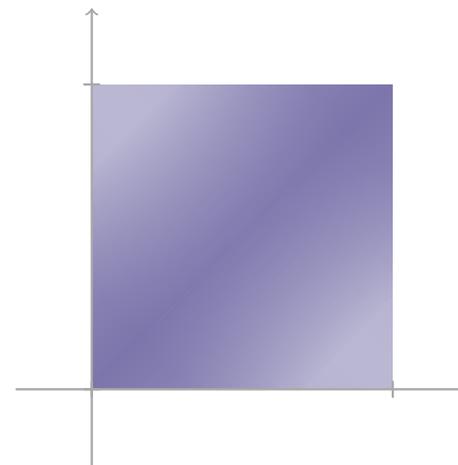
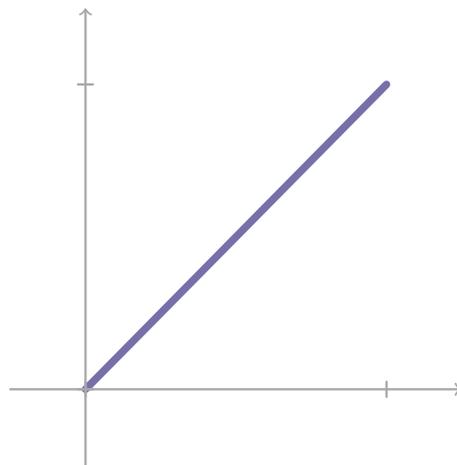
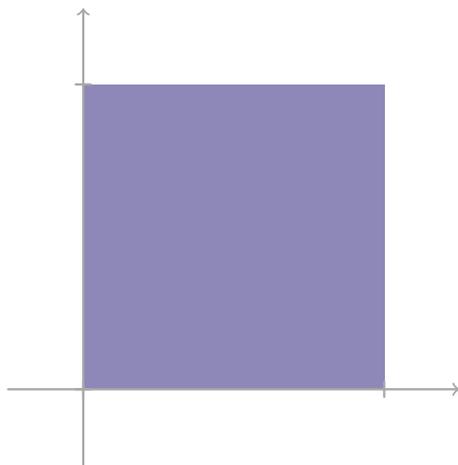
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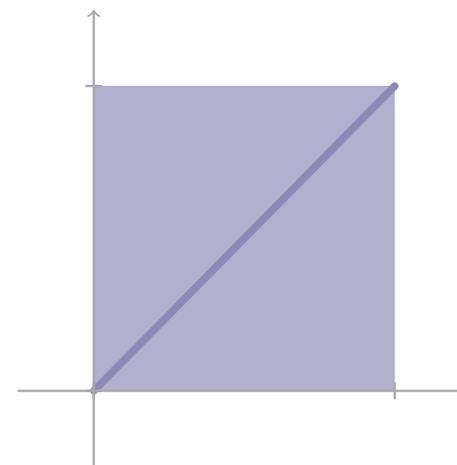
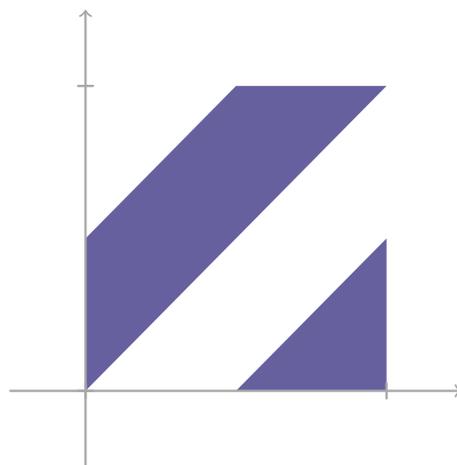
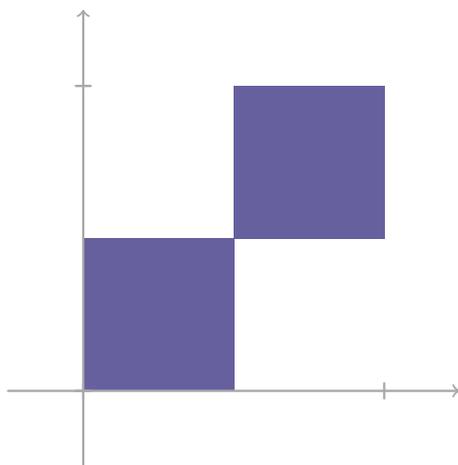
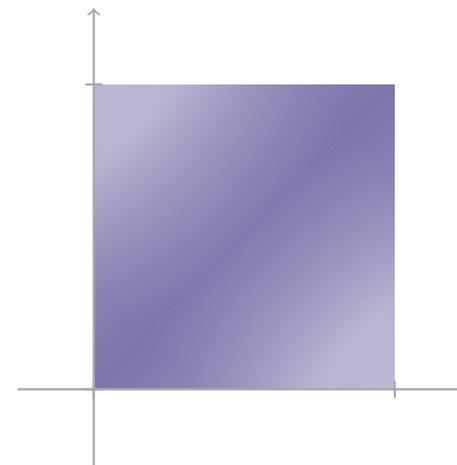
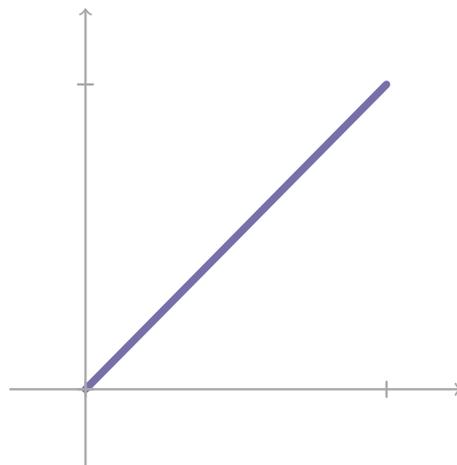
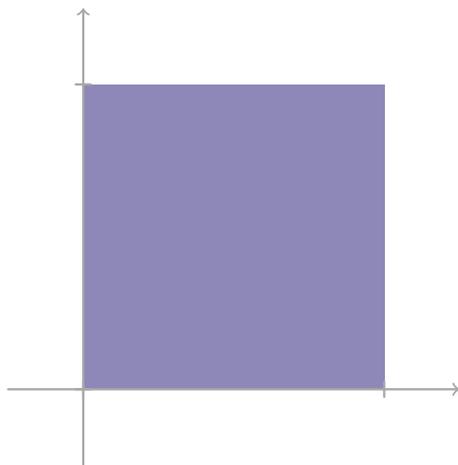
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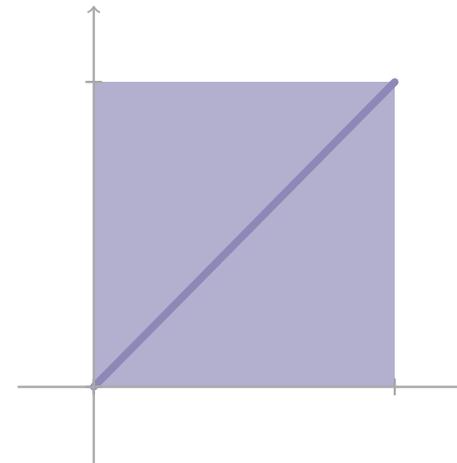
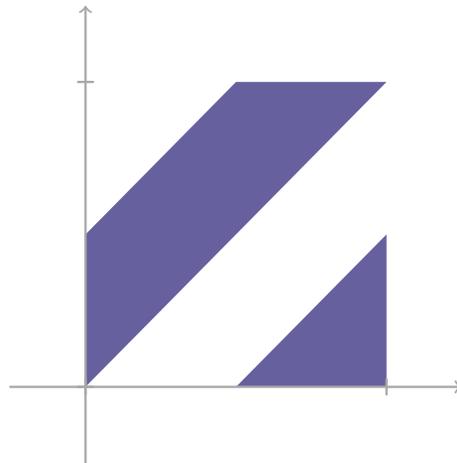
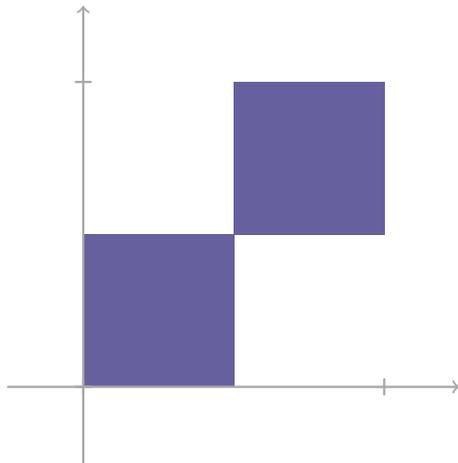
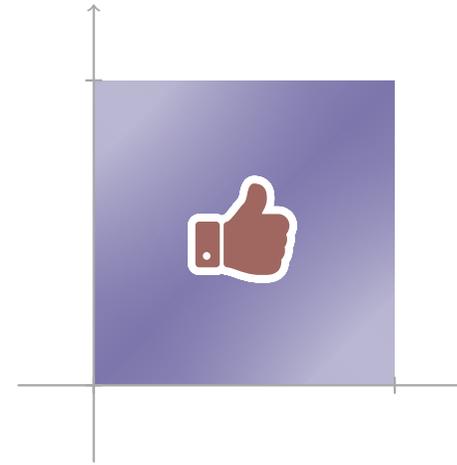
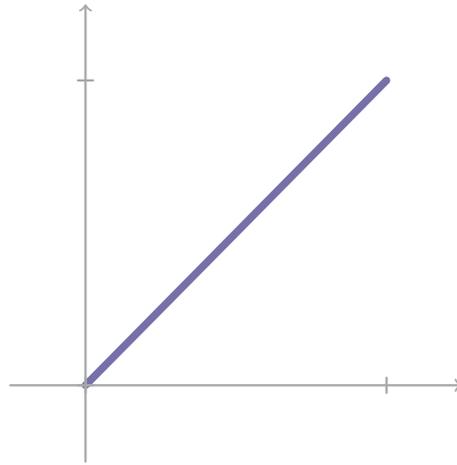
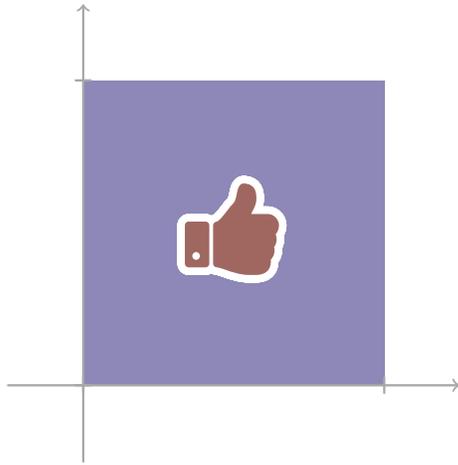
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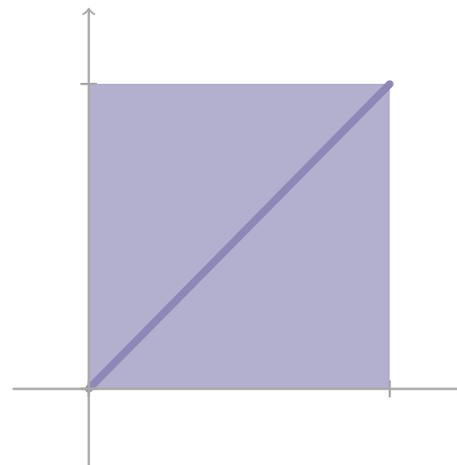
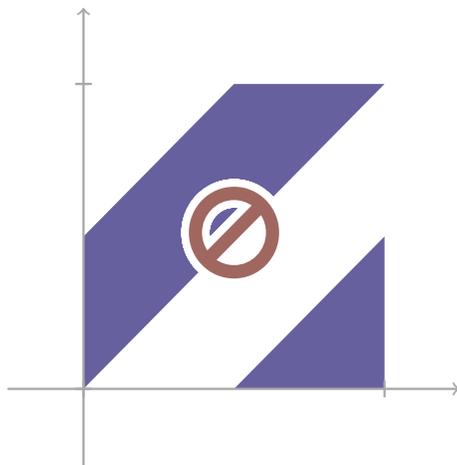
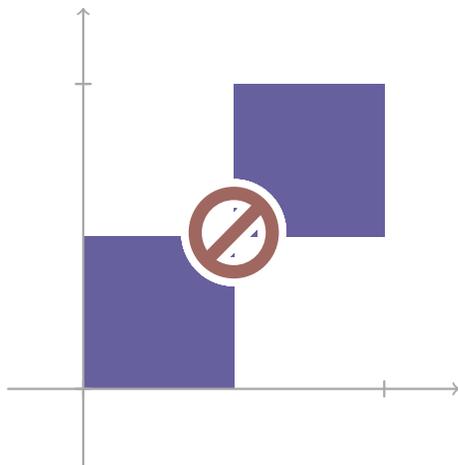
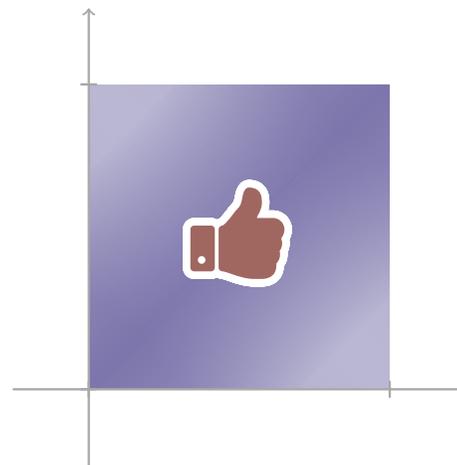
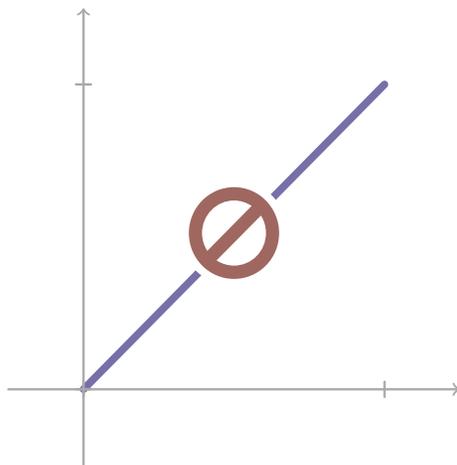
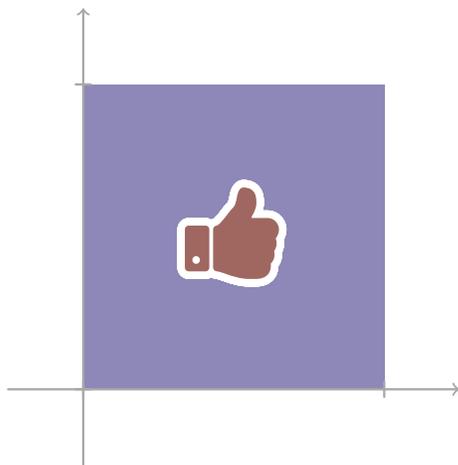
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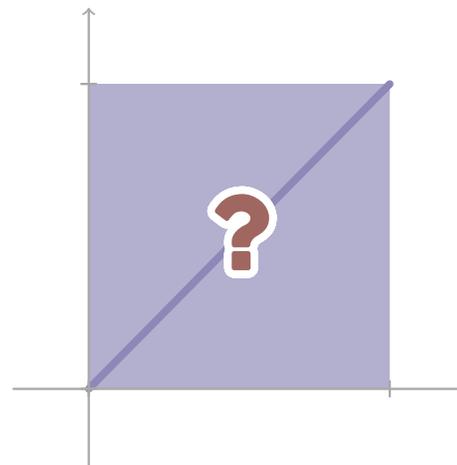
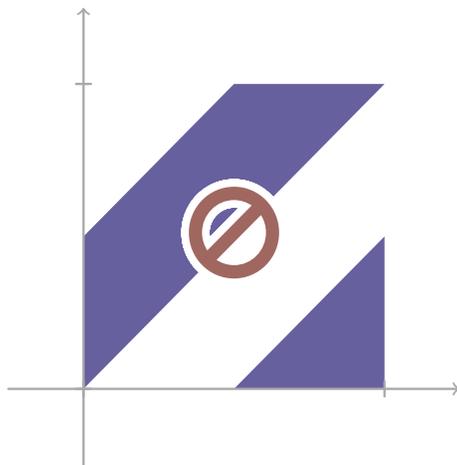
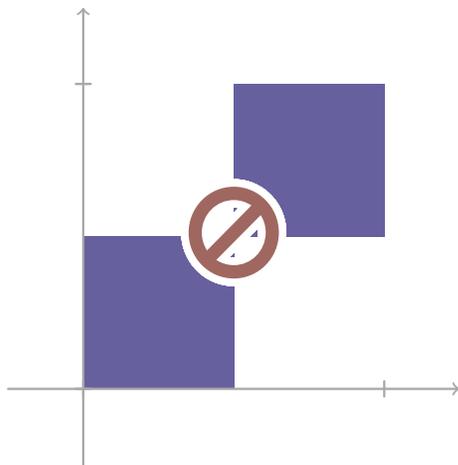
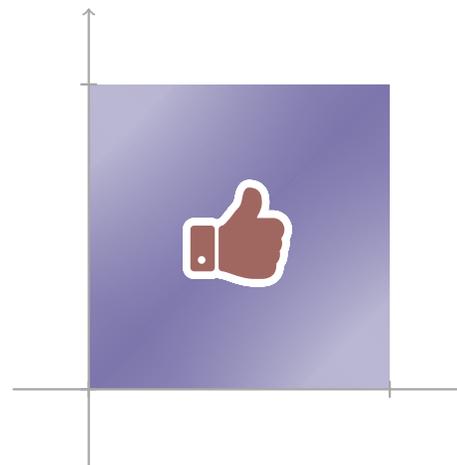
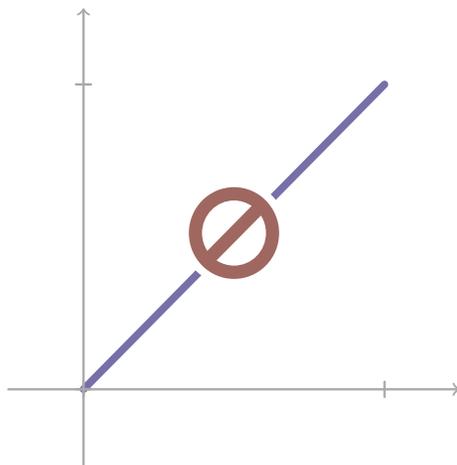
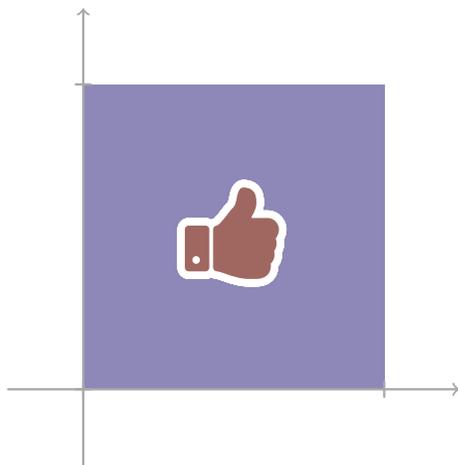
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# Table of Content

 Binary search trees

 Permutons

 Our results

 The conditions

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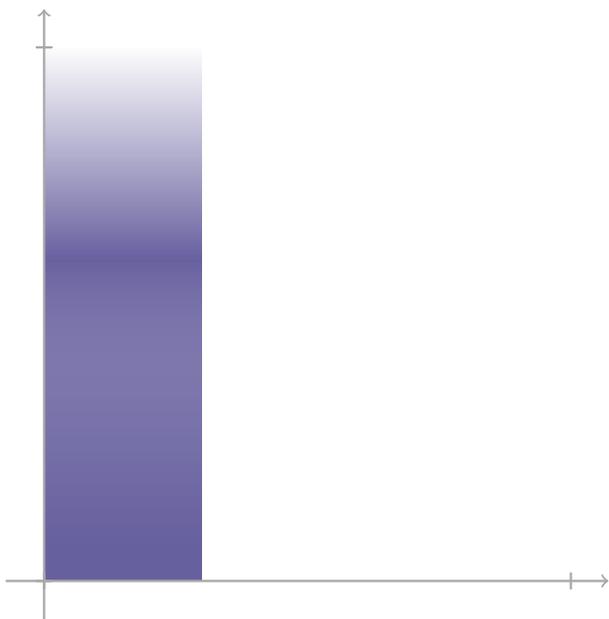
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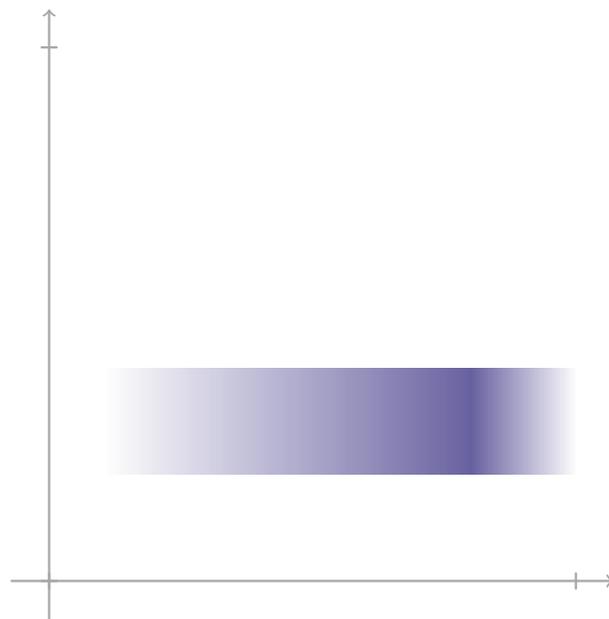
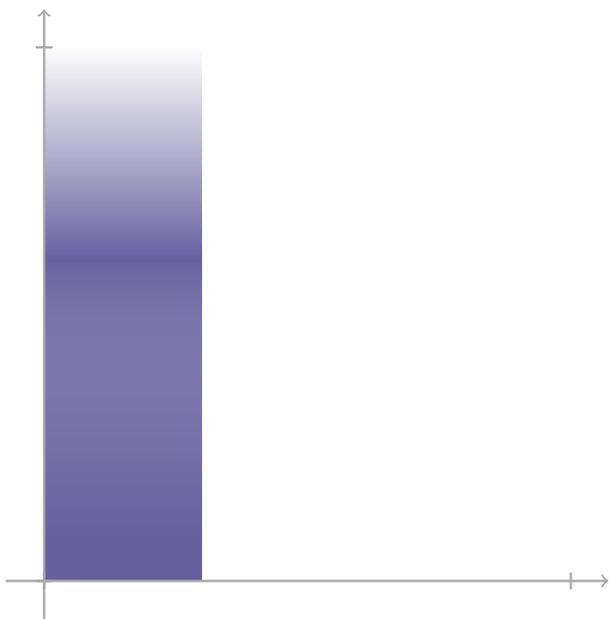
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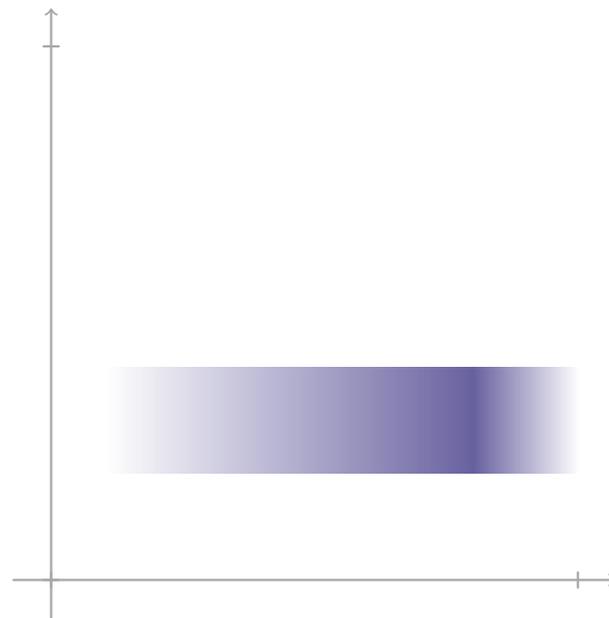
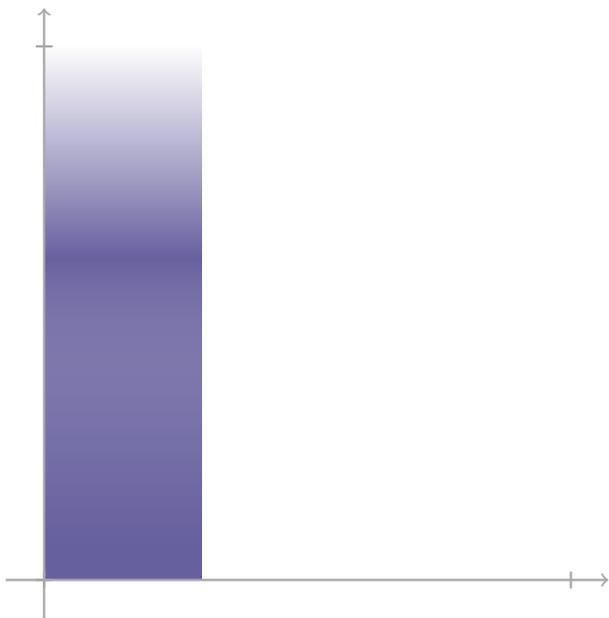
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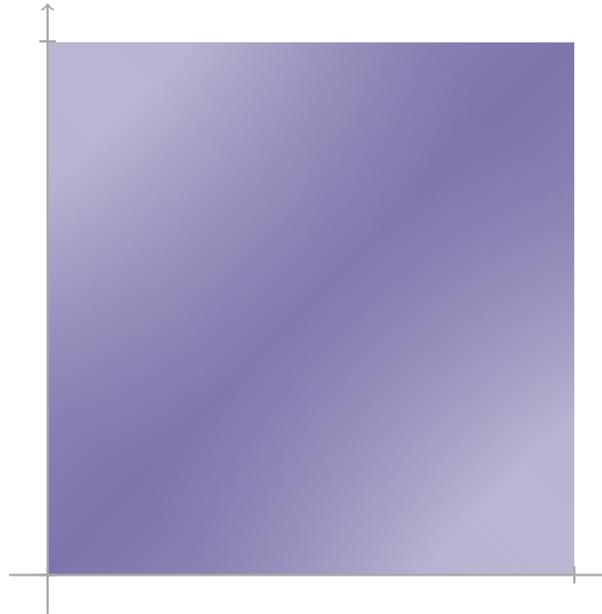
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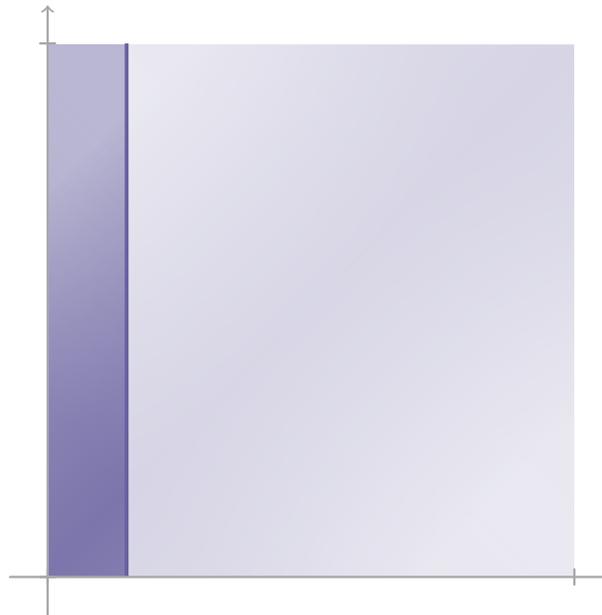
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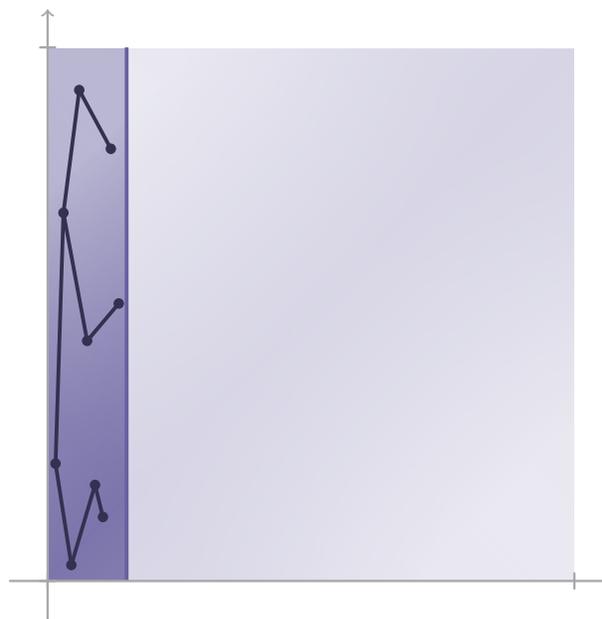
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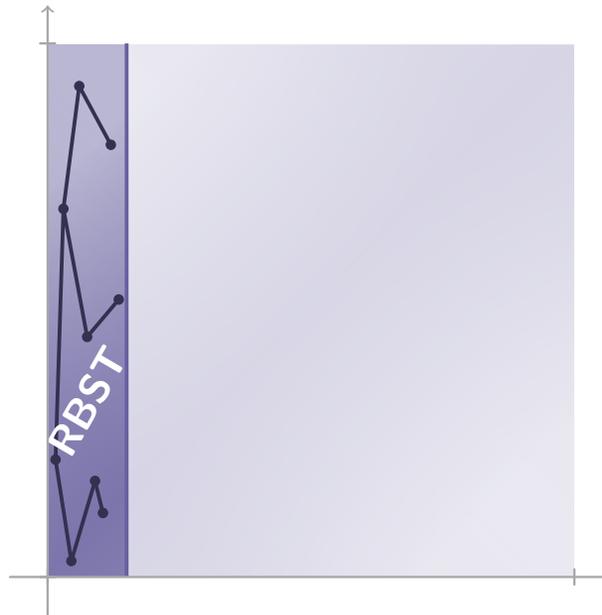
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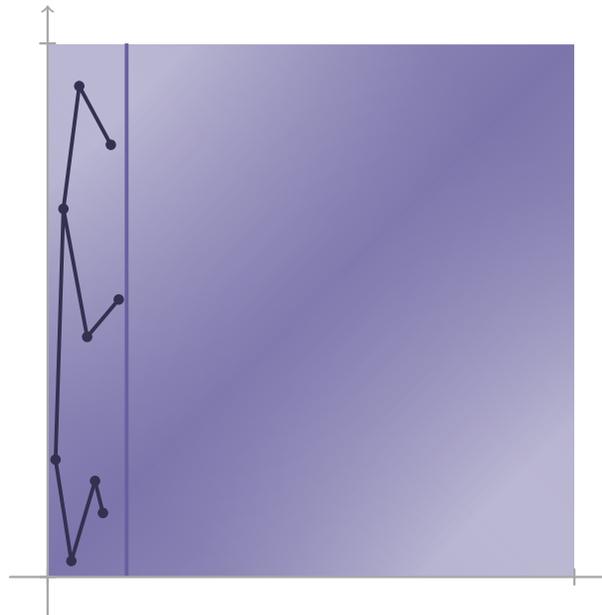
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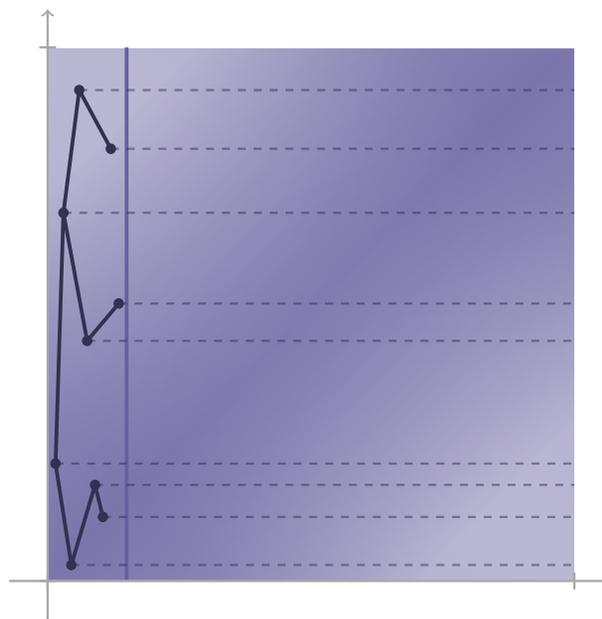
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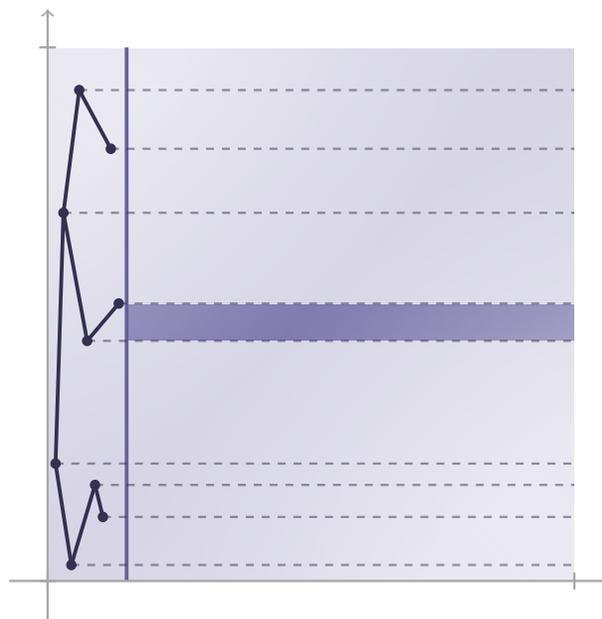
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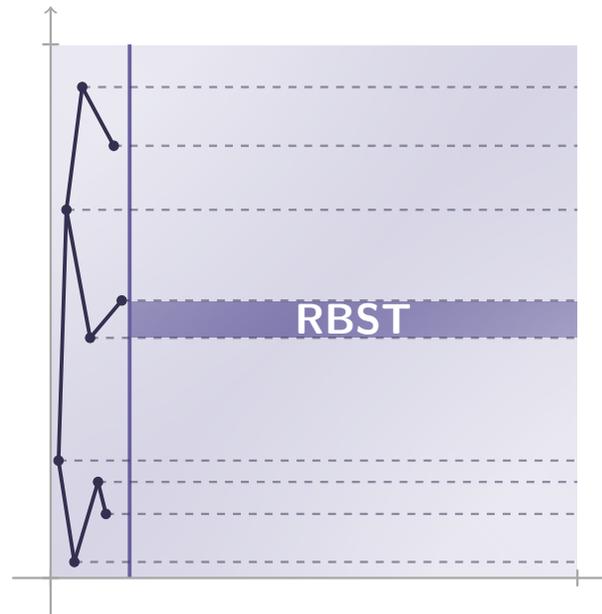
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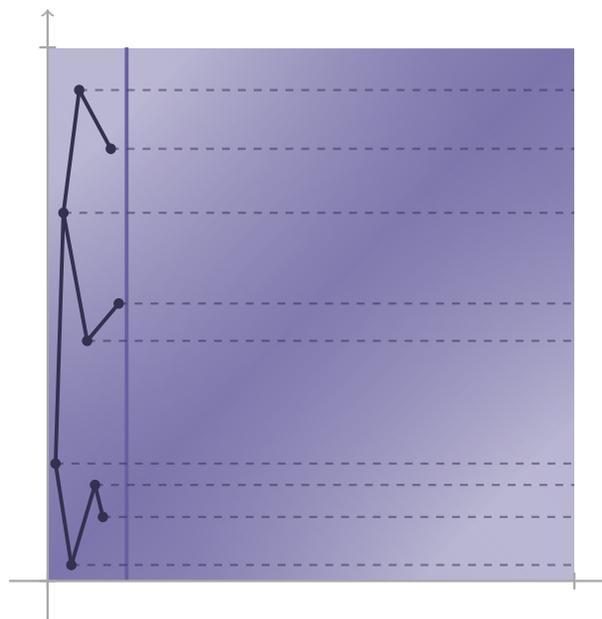
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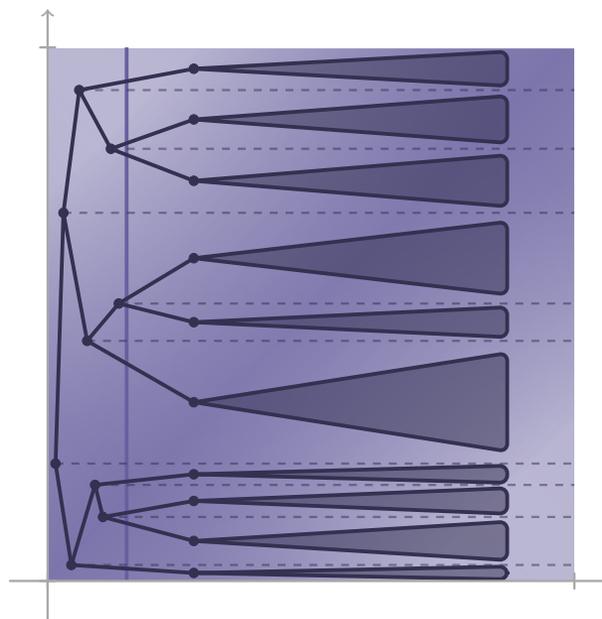
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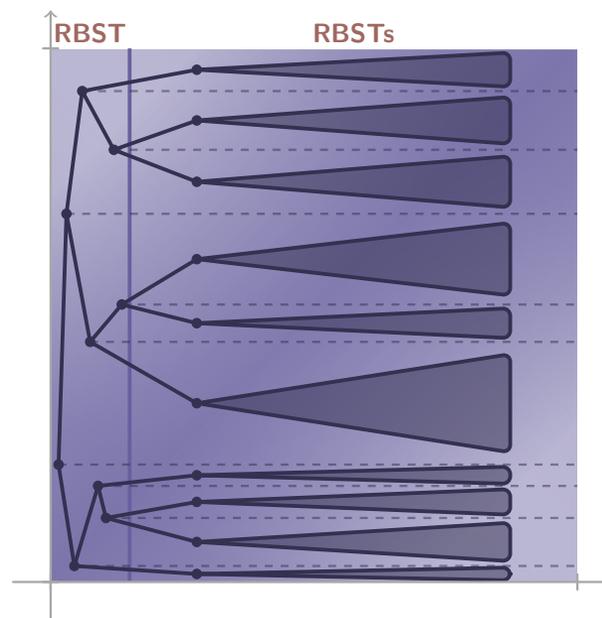
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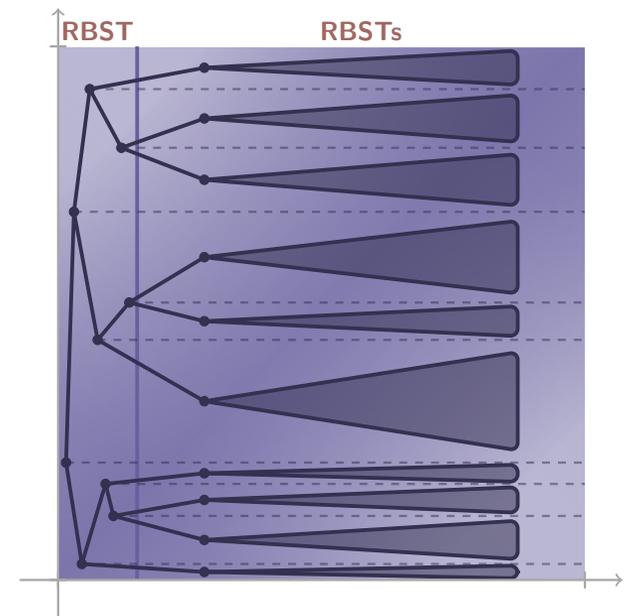
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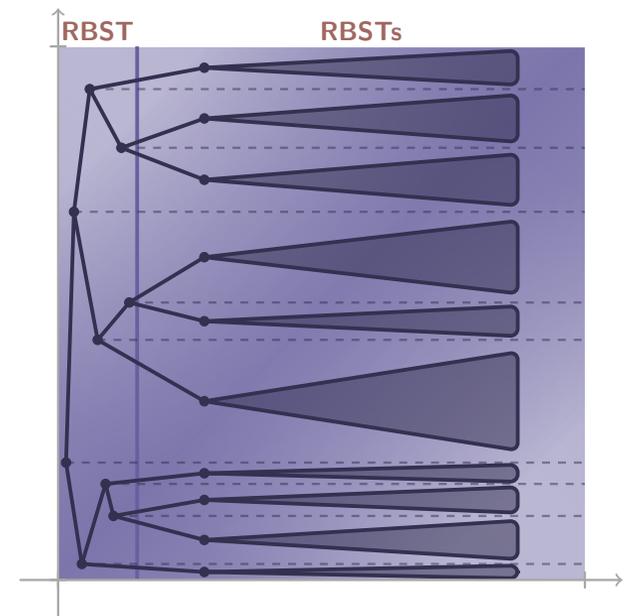


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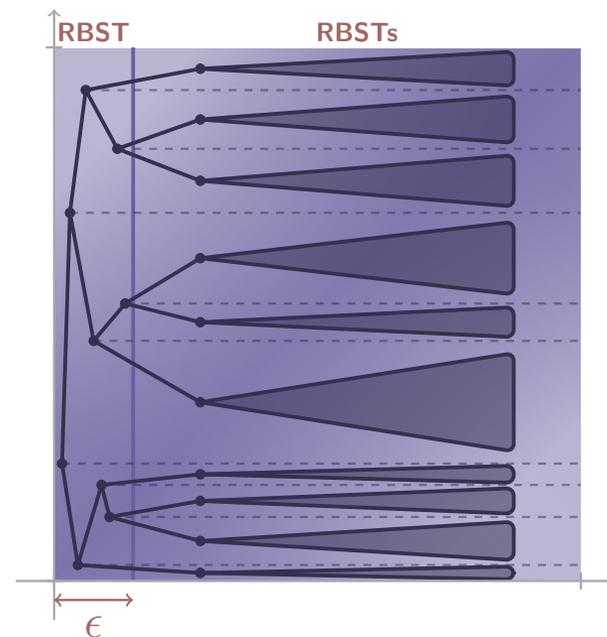




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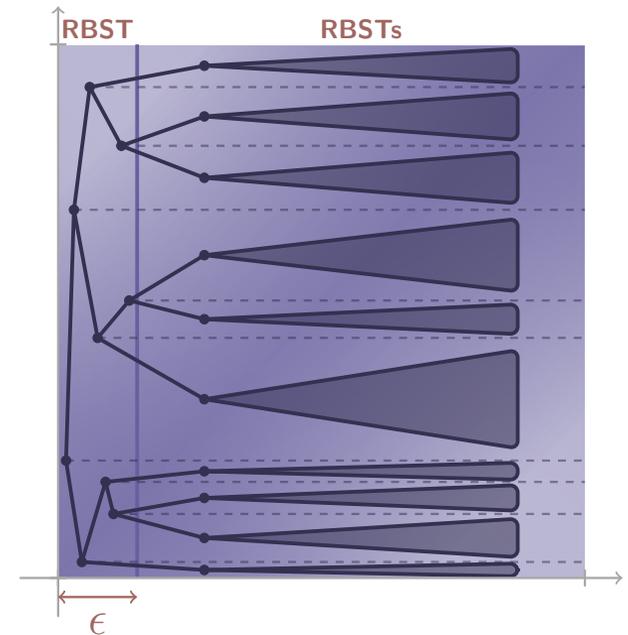
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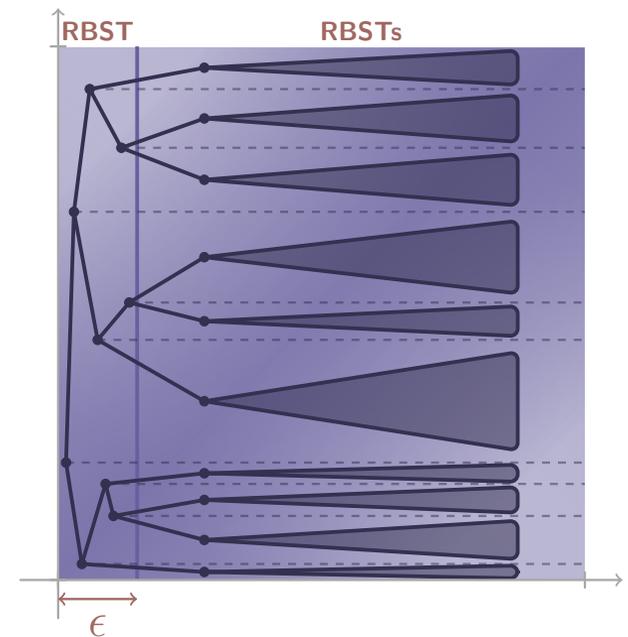
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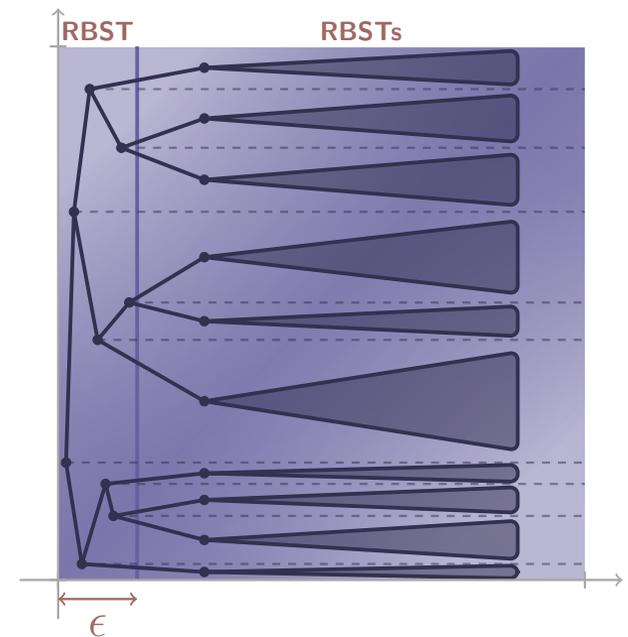
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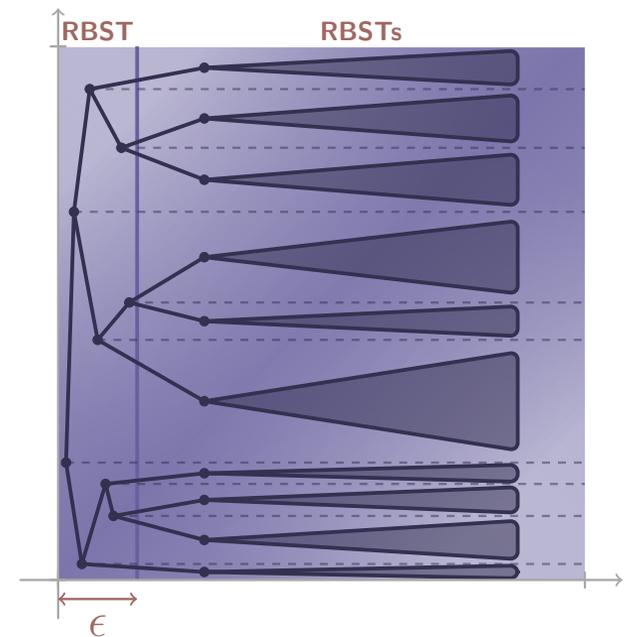
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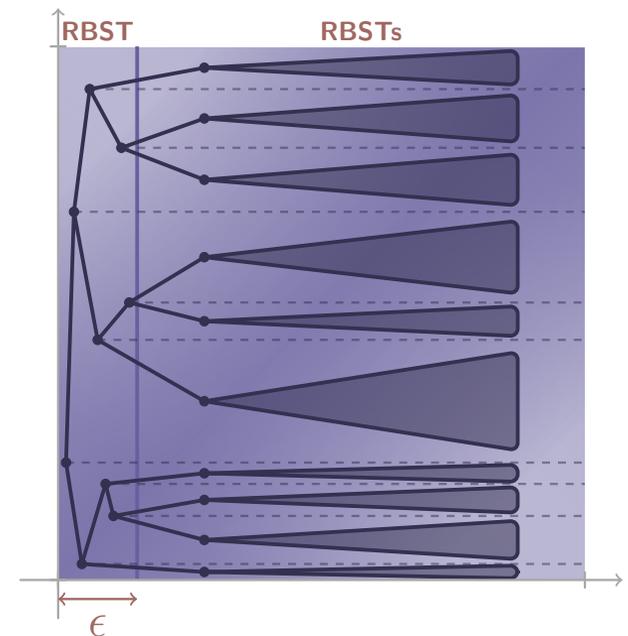




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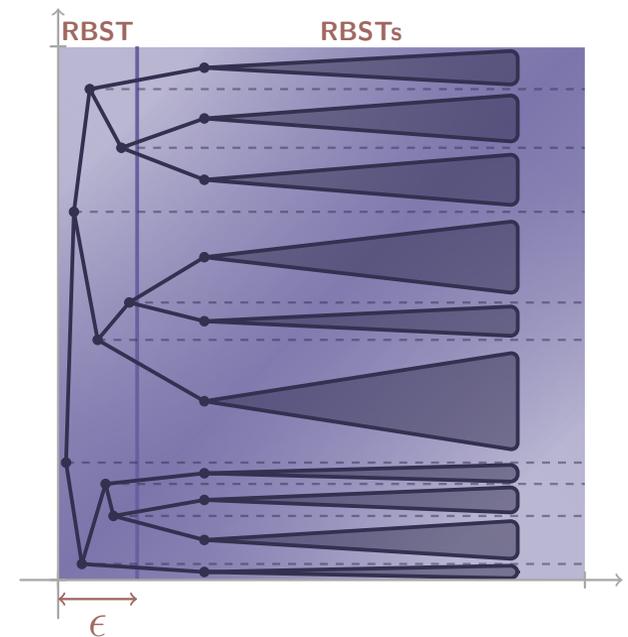
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- ⚠ While the average width of a band is  $1/\epsilon n$ , the maximal width is actually of order  $\log n/n$ .



# Our result

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→ We will now see why these conditions are necessary.

- Corsini, B., Dubach, V., & Féray, V. (2024). **Binary search trees of permuton samples.** *arXiv preprint arXiv:2403.03151*.
- Devroye, L. (1986). **A note on the height of binary search trees.** *Journal of the ACM (JACM)*, vol. 33, no 3, p. 489-498.

This project has received funding from the Future Leader Program of the LUE (Lorraine Université d'Excellence) initiative and from the European Union's Horizon 2020 Research and Innovation Programme under the Marie Skłodowska-Curie Grant Agreement No. 101034253 .

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# Table of Content

 Binary search trees

 Permutons

 Our results

 The conditions

# Condition: left density

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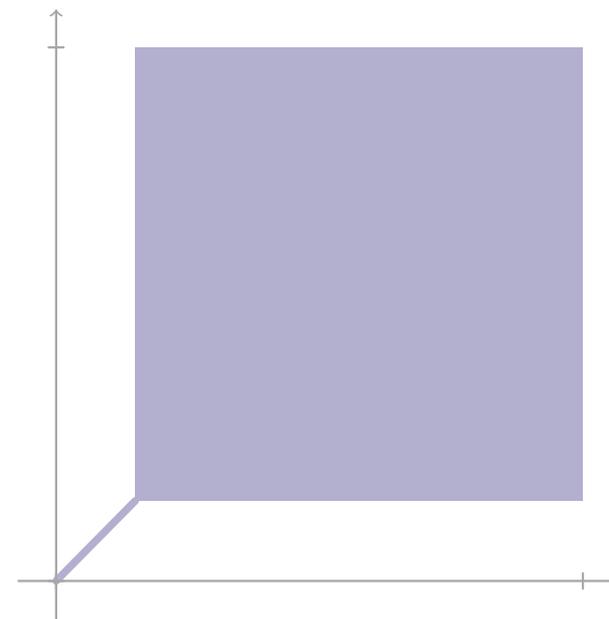
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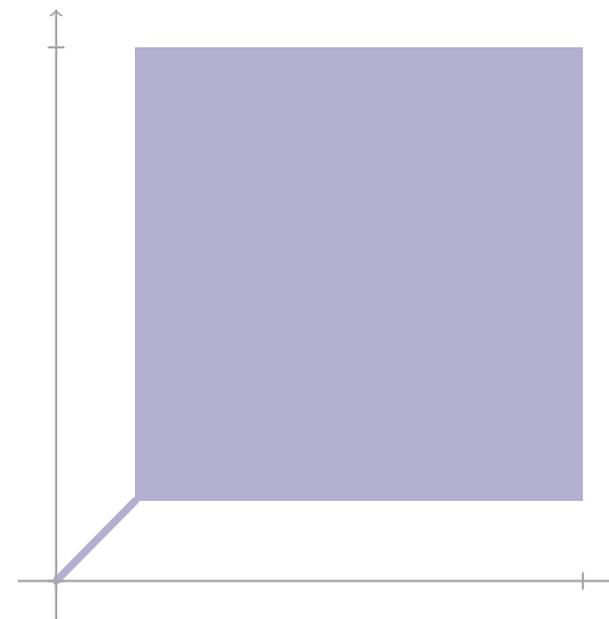


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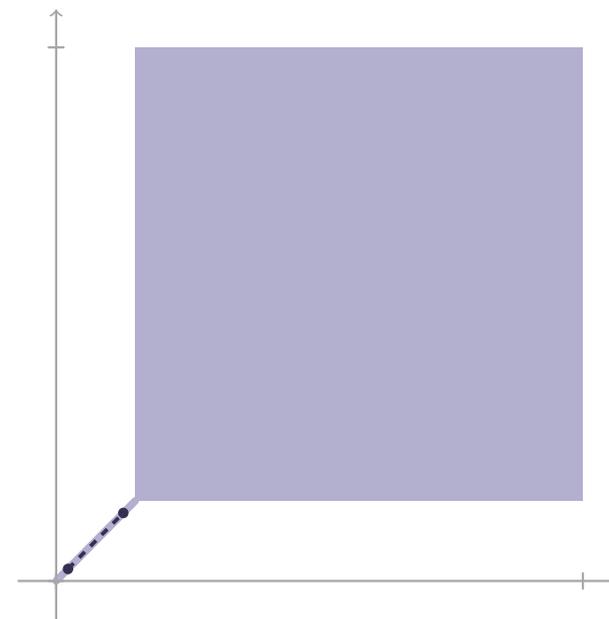
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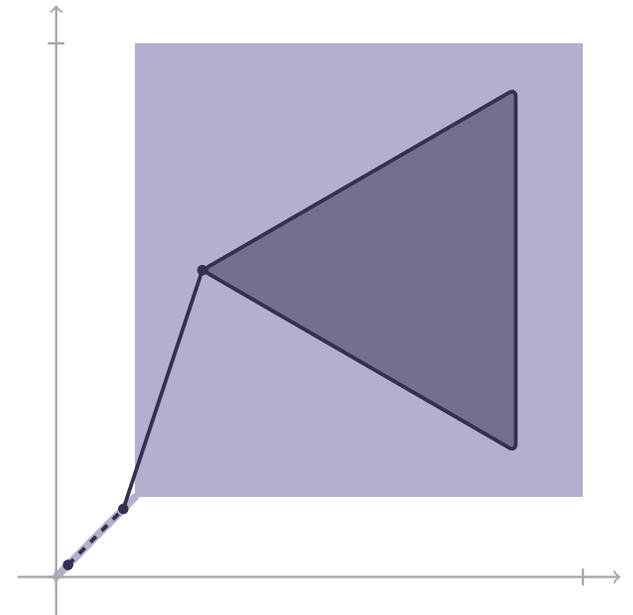
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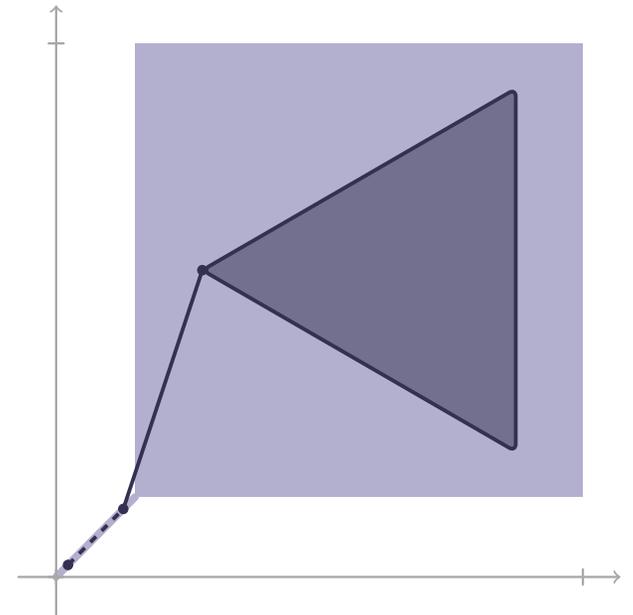
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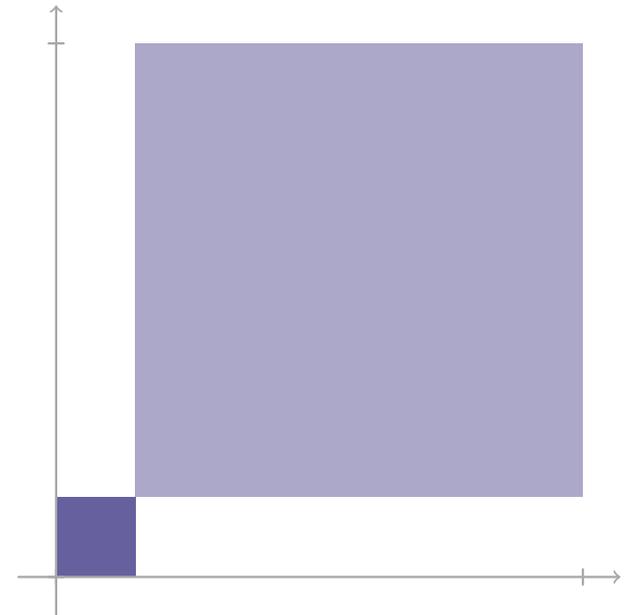
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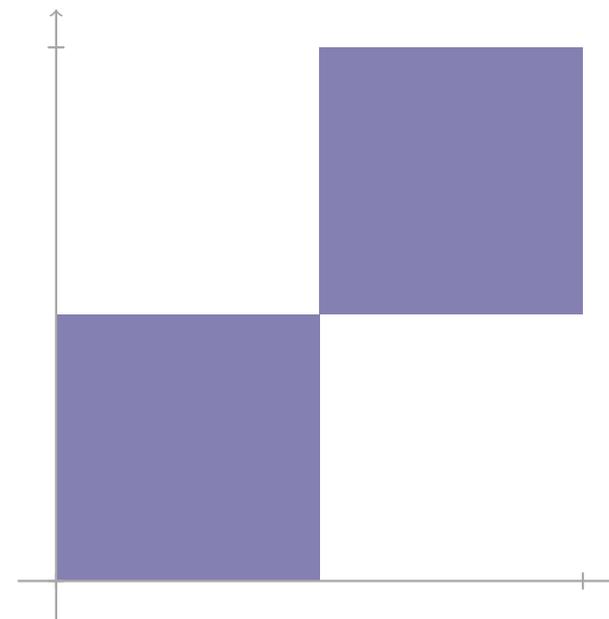
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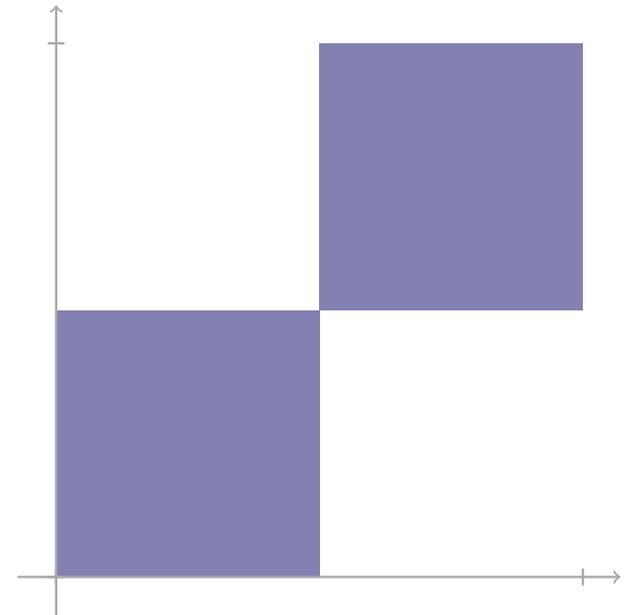


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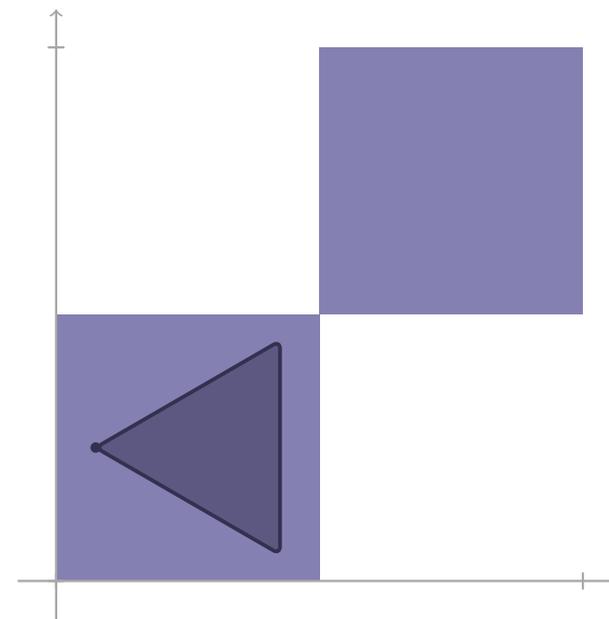
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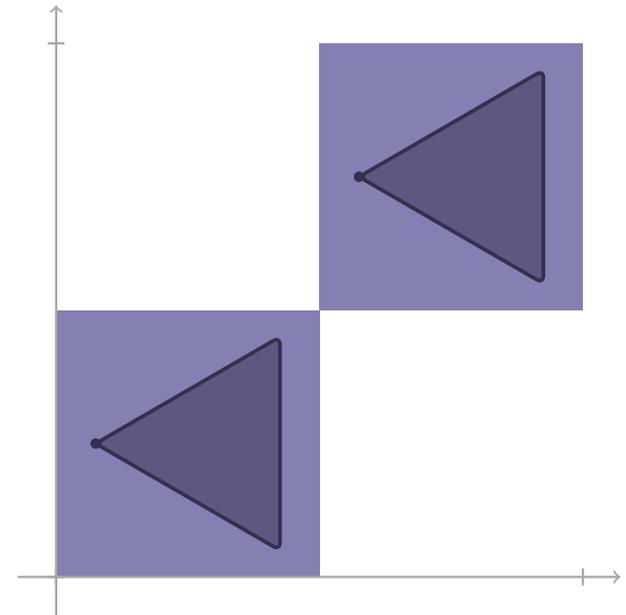
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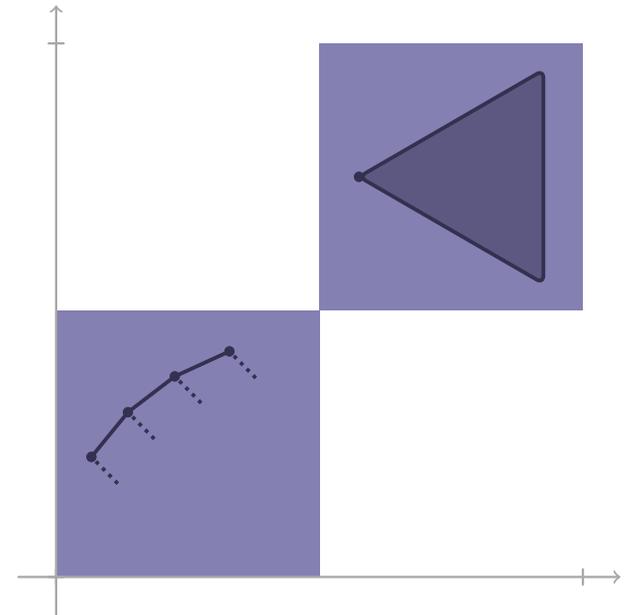
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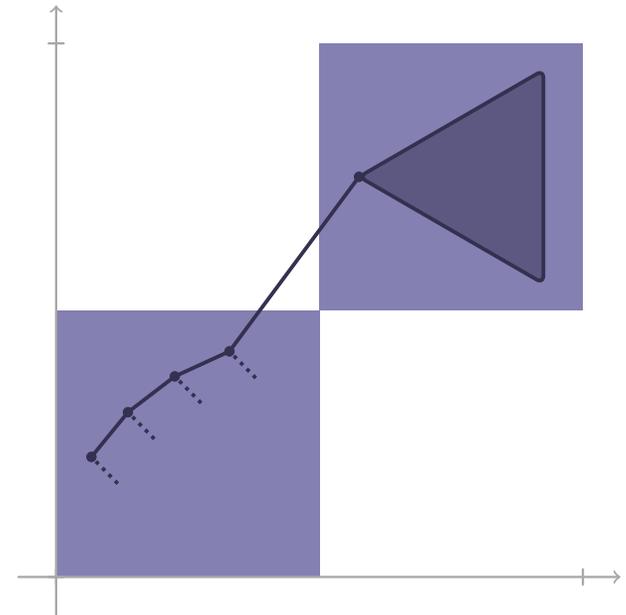
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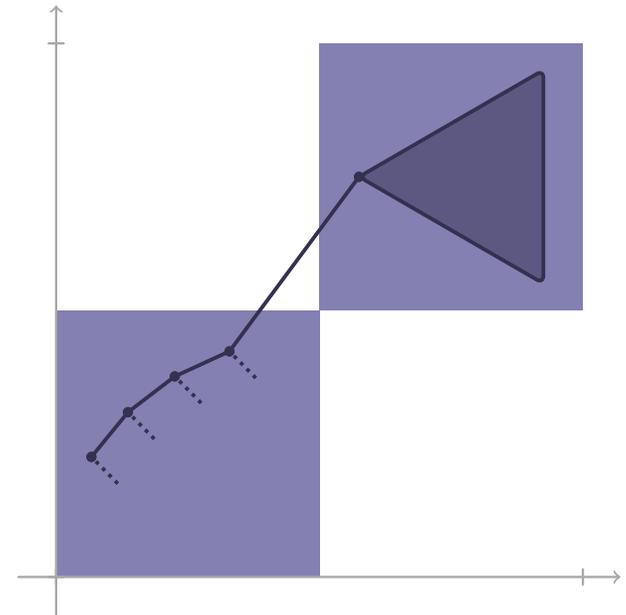
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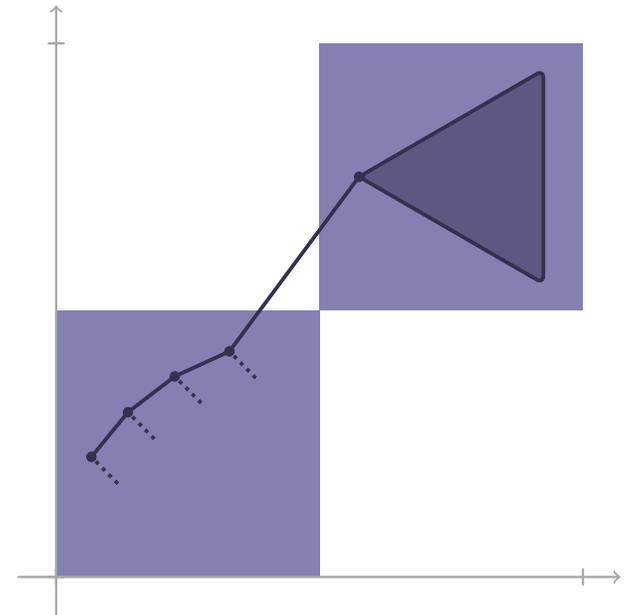
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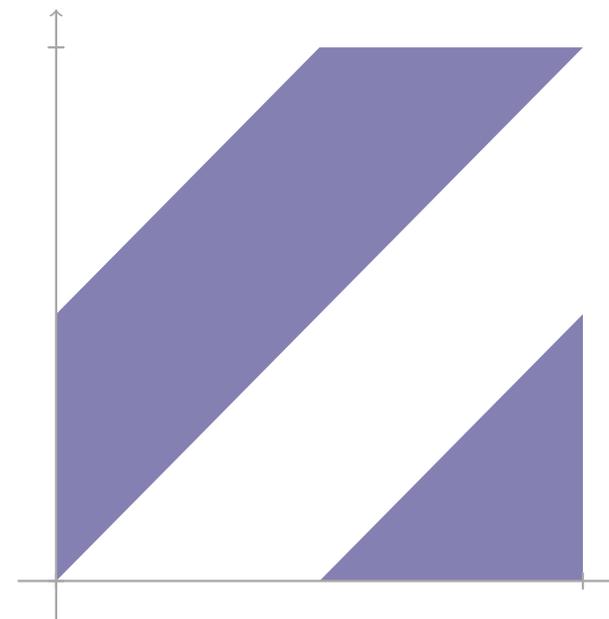
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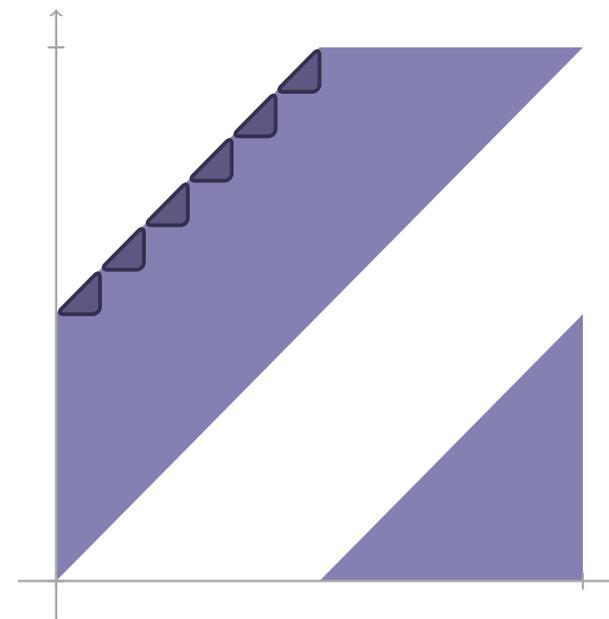


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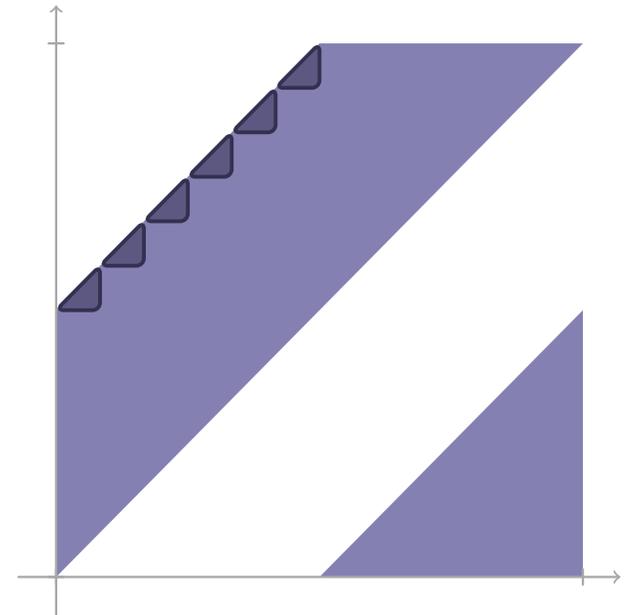
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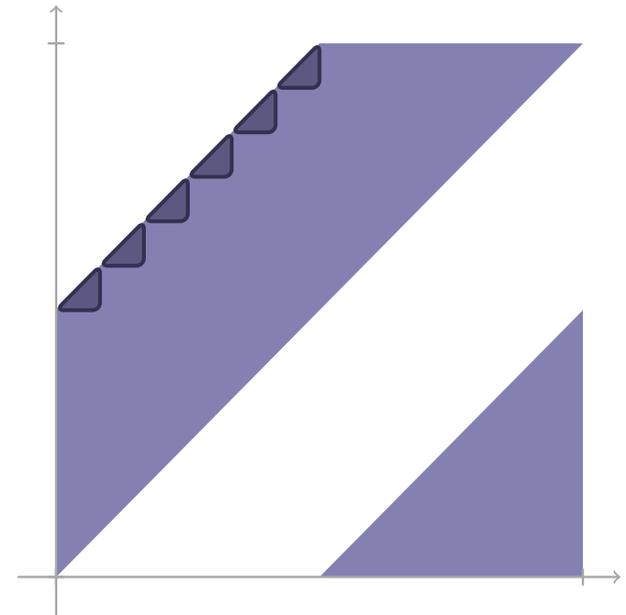
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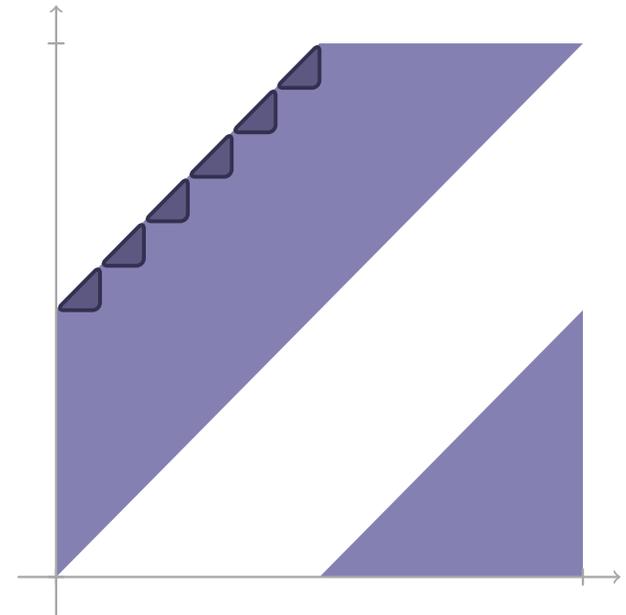
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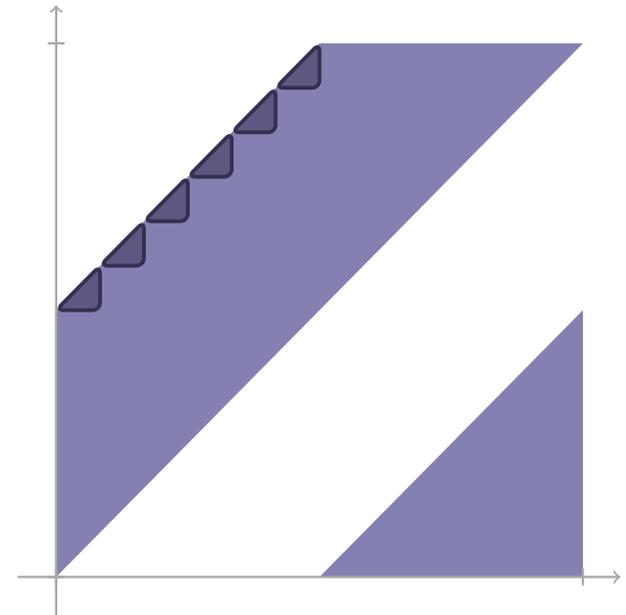
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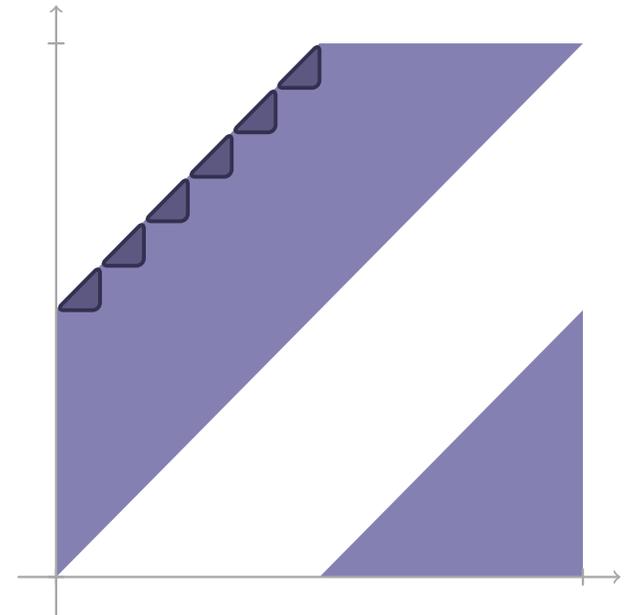
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- The height is at least of order  $\sqrt{n}$ .
- By “smoothing” the density, we can get a height of order  $n^{1/2-\delta}$ .



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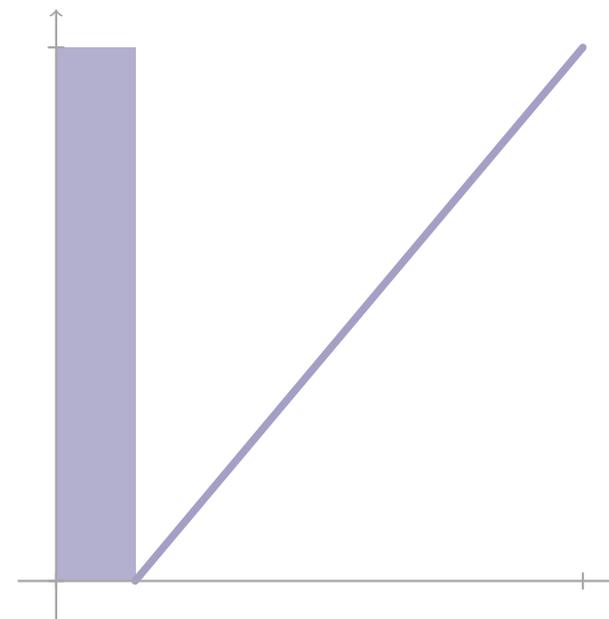
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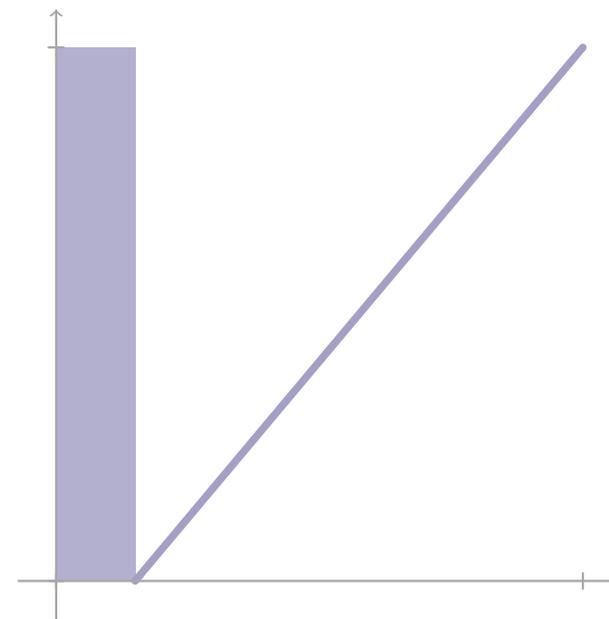


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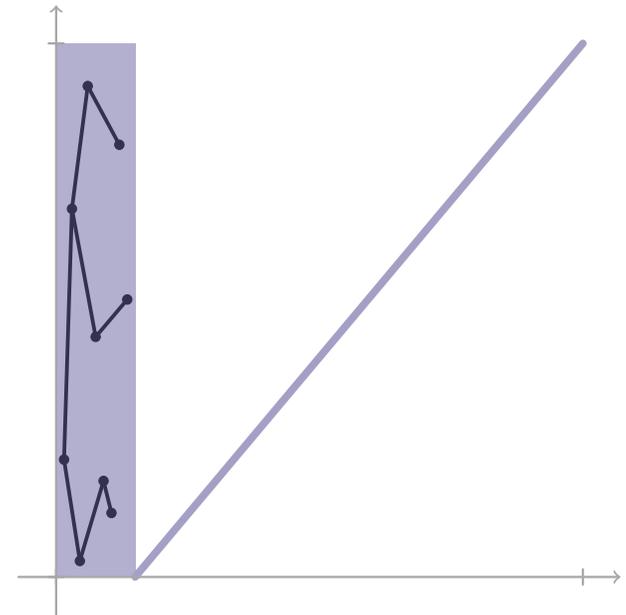
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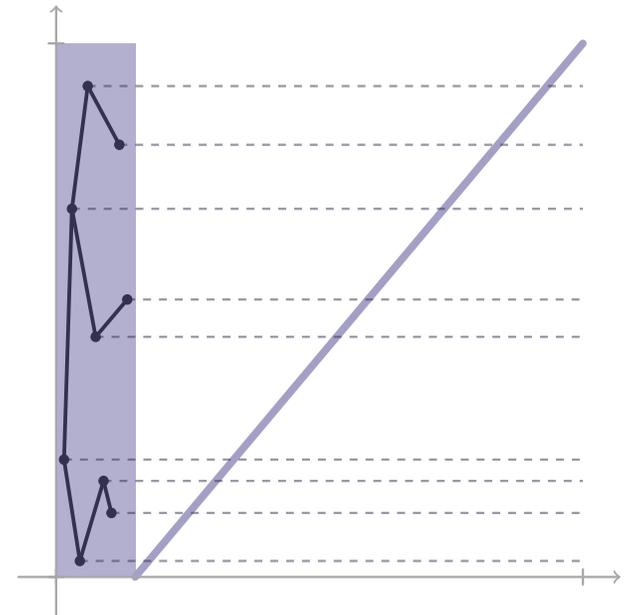
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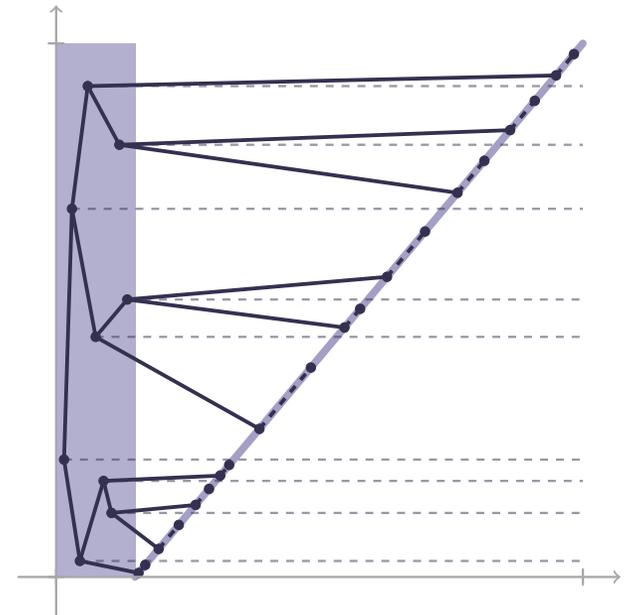
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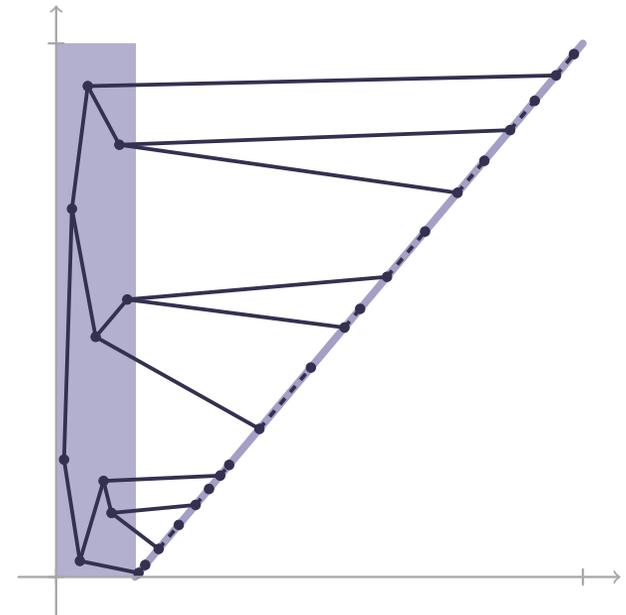
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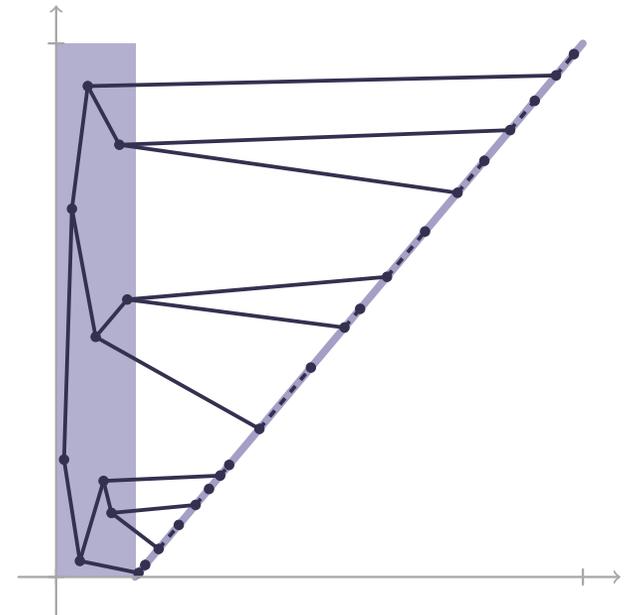
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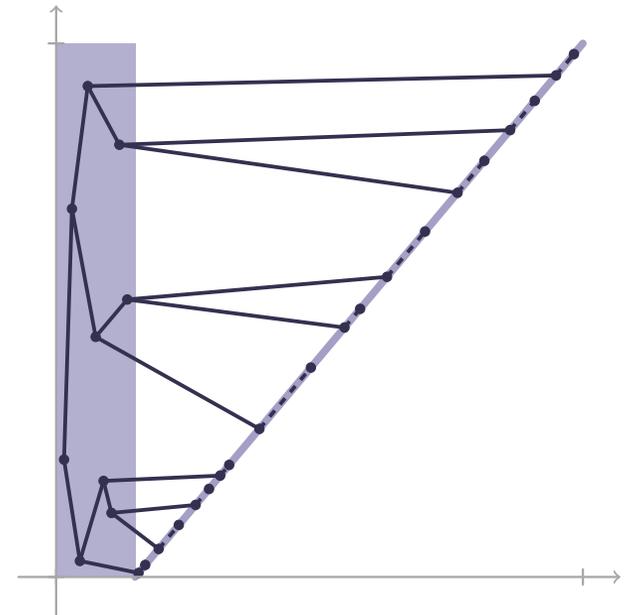
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