

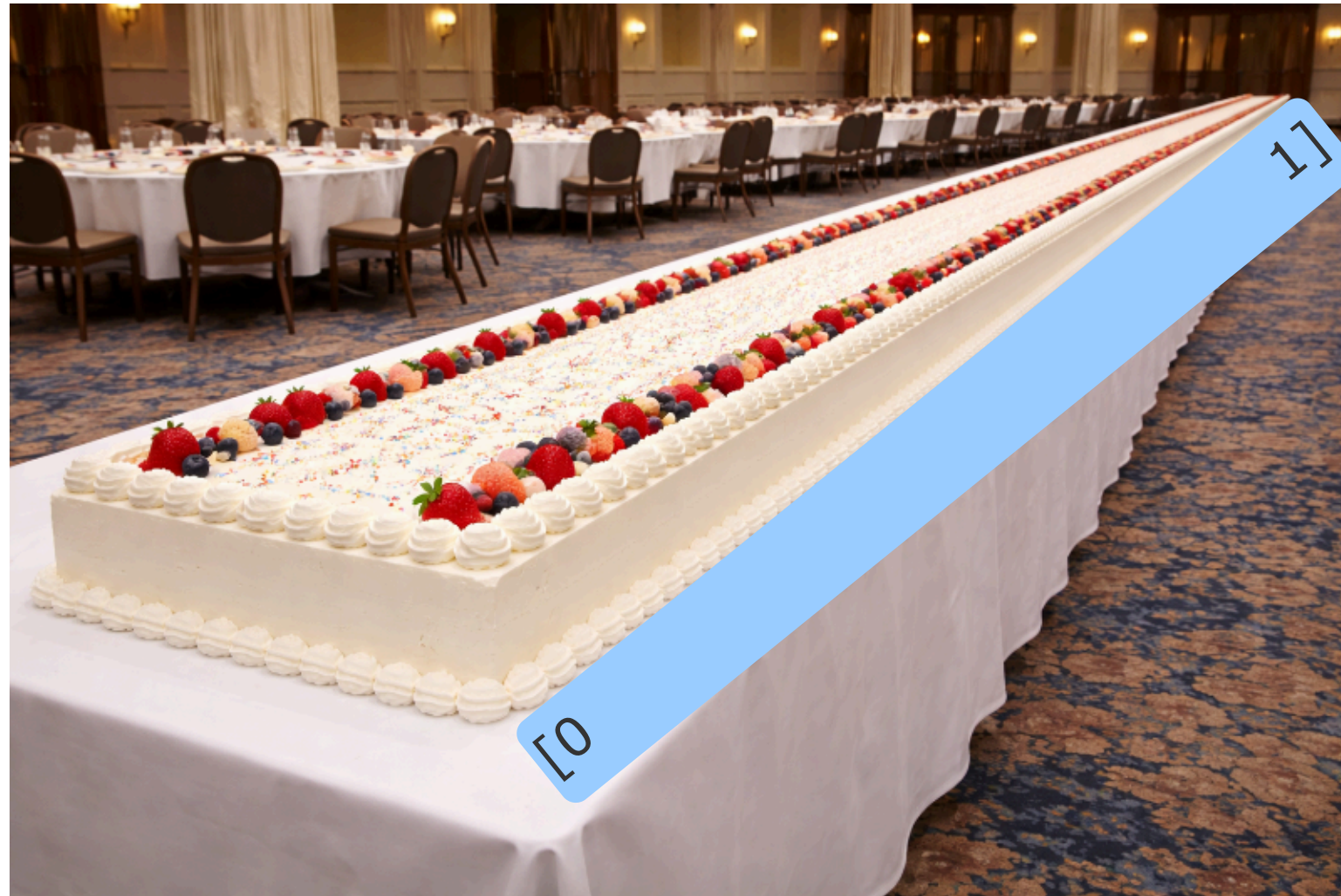
# Algorithms For Democratic Decision-Making

Jamie Tucker-Foltz • Yale University • Spring 2026

Lecture 14: **Fair Division 2: Divisible Goods**

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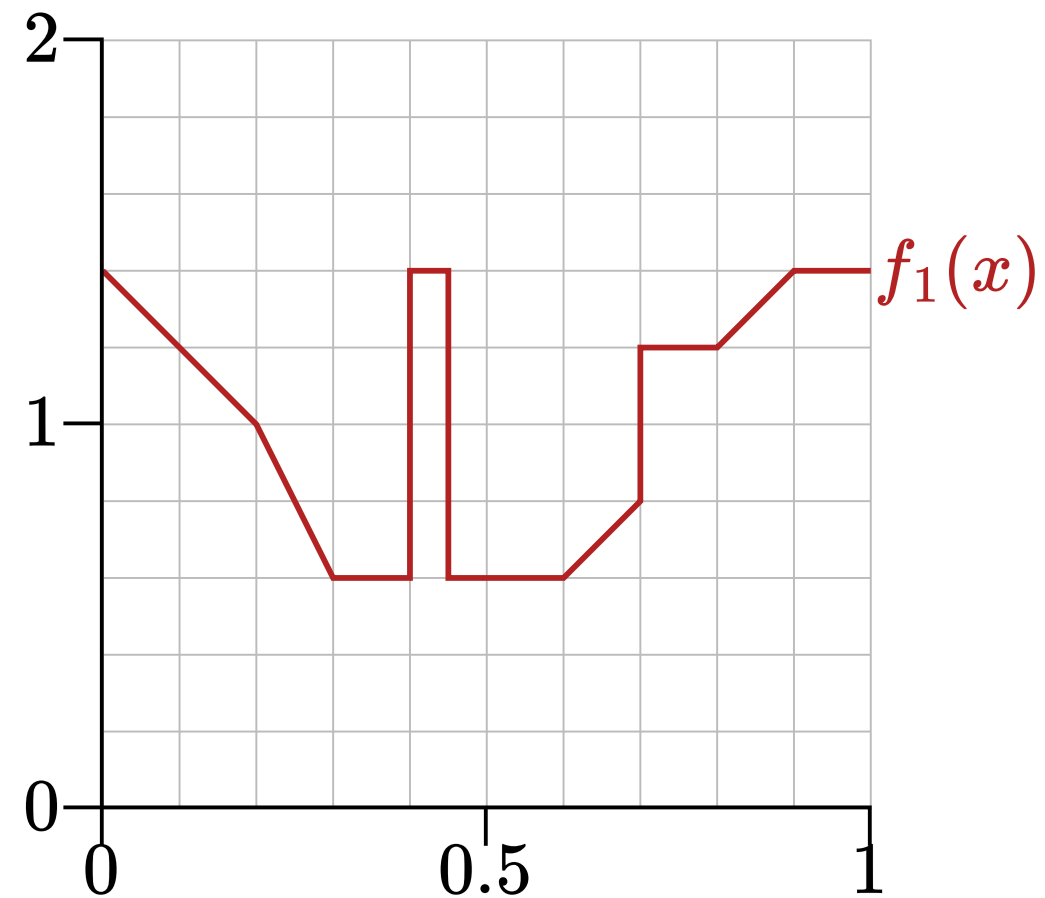
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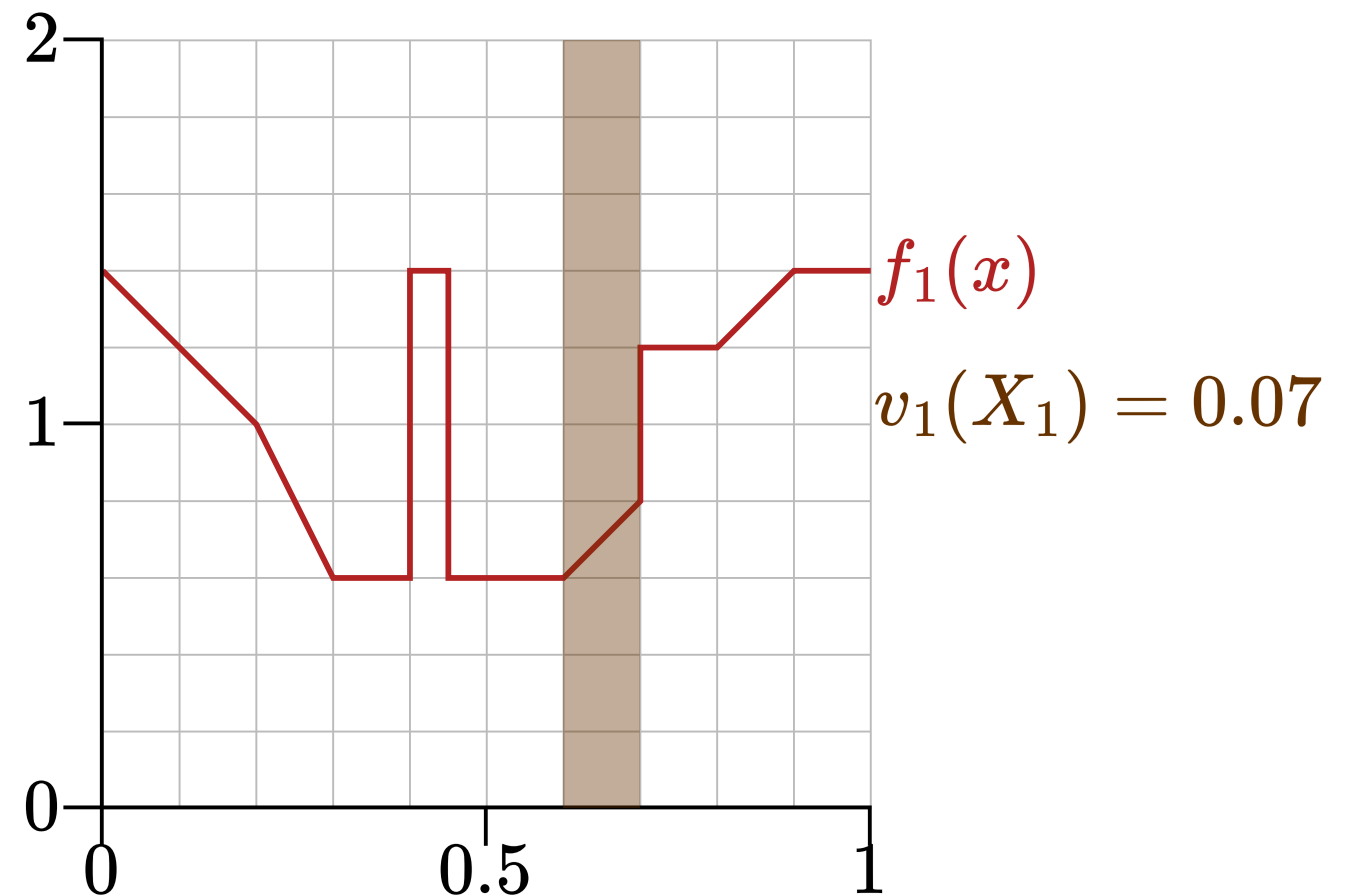
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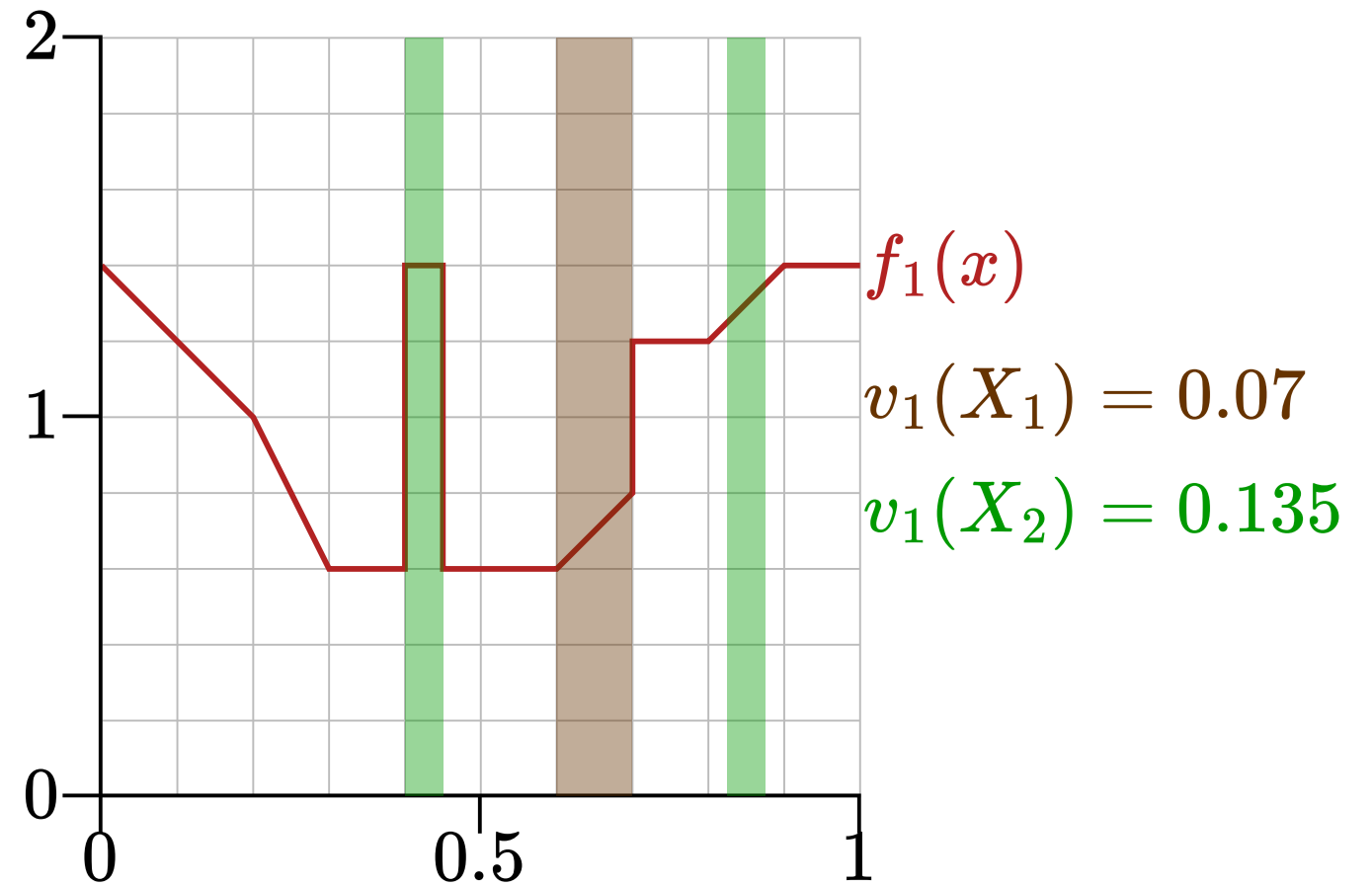
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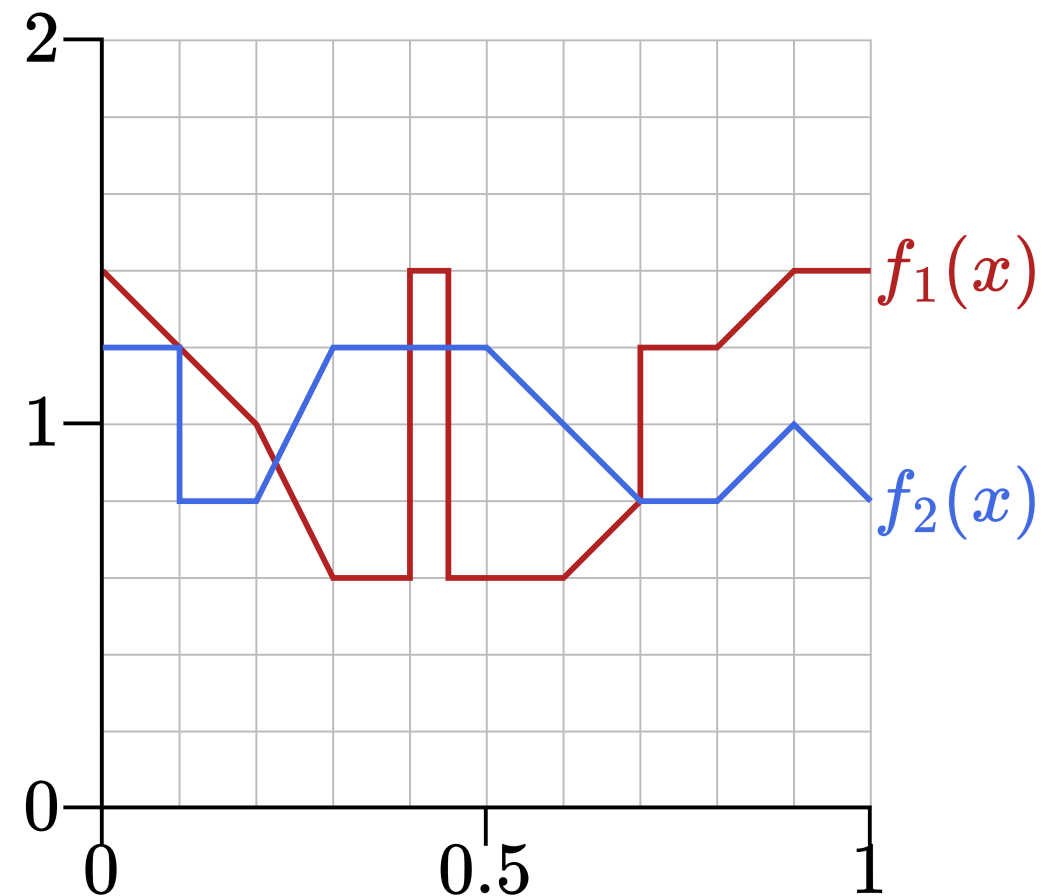
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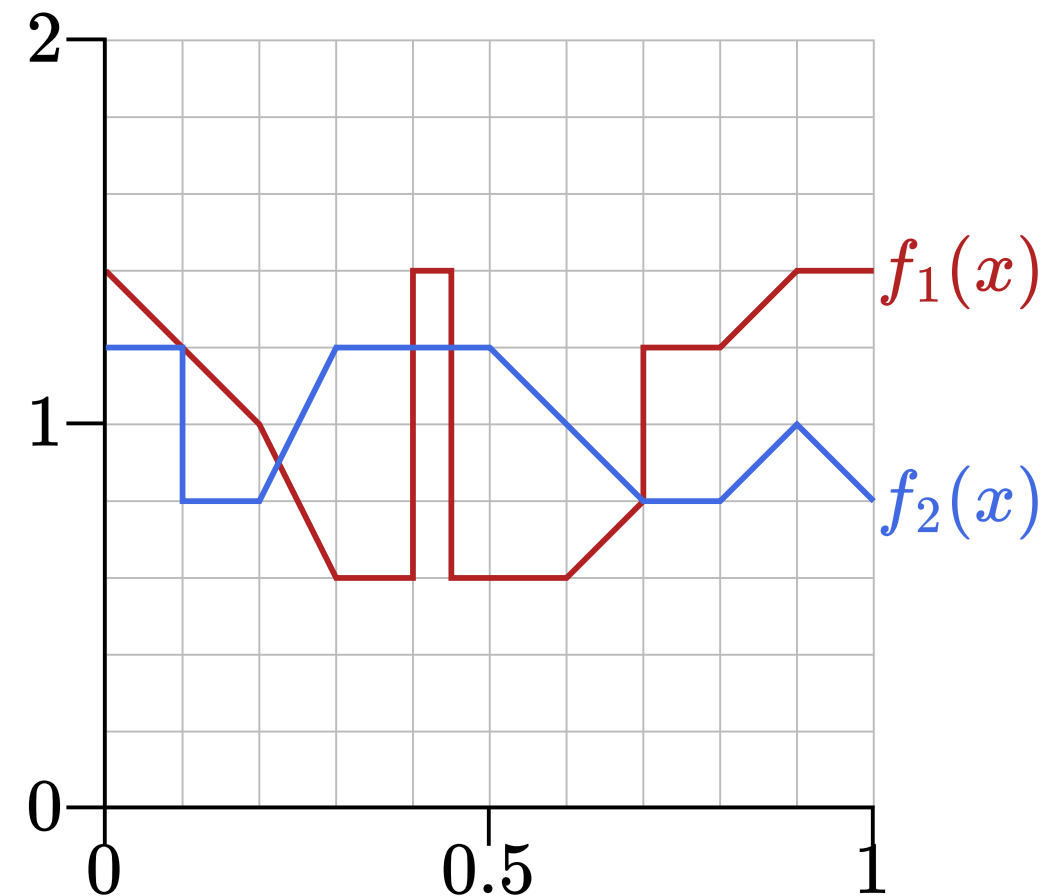
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For  $n$  agents, an allocation is a partition of  $[0, 1]$  into  $A = (A_1, A_2, \dots, A_n)$ , where each  $A_i$  is a finite union of intervals. (Intervals are closed, and can overlap at endpoints.)



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- EF  $\Rightarrow$  Prop
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- Incomparable
- Equivalent



Respond at:

[pollev.com/jtuckerfoltz255](https://pollev.com/jtuckerfoltz255) or

[bit.ly/jtfpoll](https://bit.ly/jtfpoll) or

text jtuckerfoltz255 to 37607

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## **Lemma (Alon, West, 1986)**

*A consensus halving always exists using at most  $n$  cuts.*

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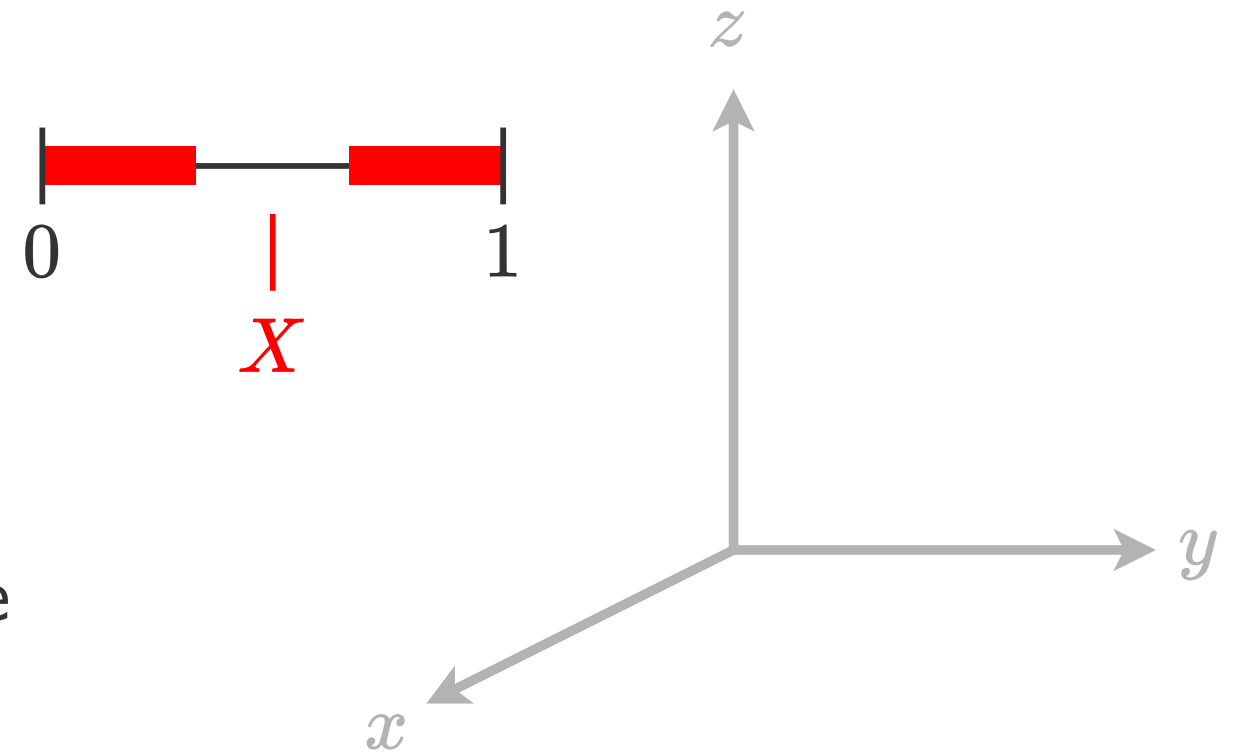
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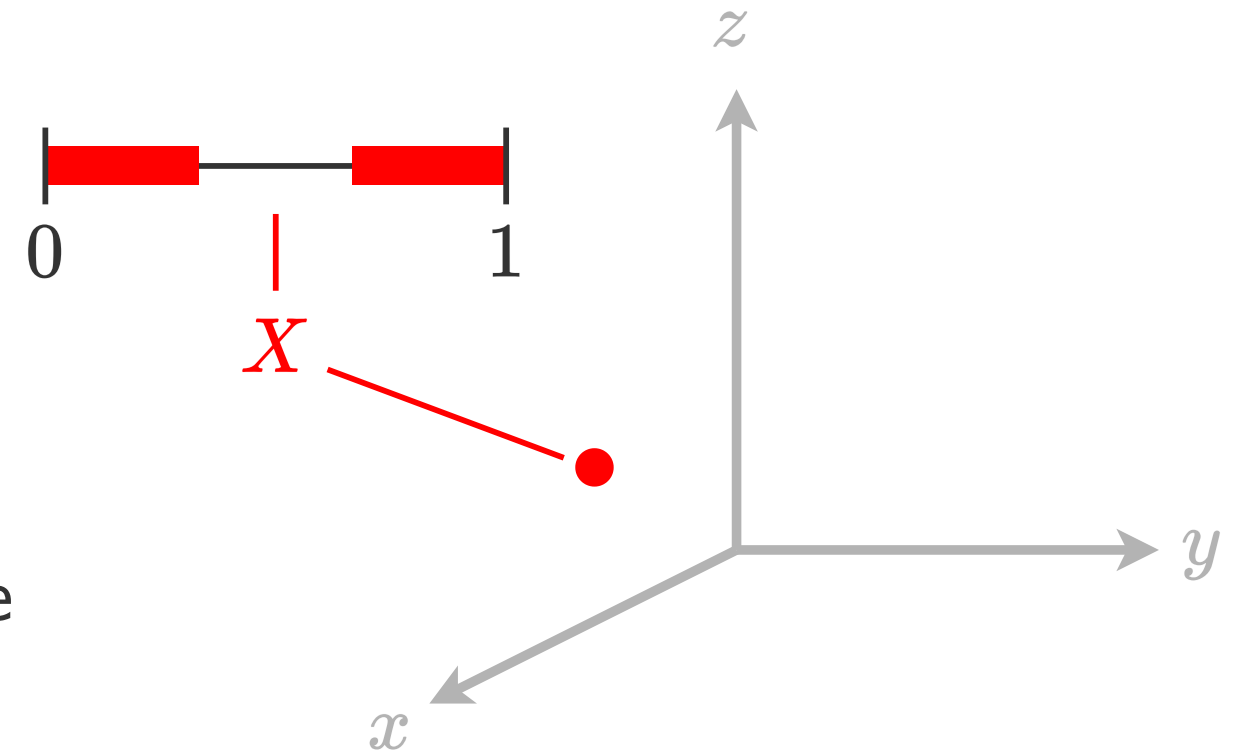
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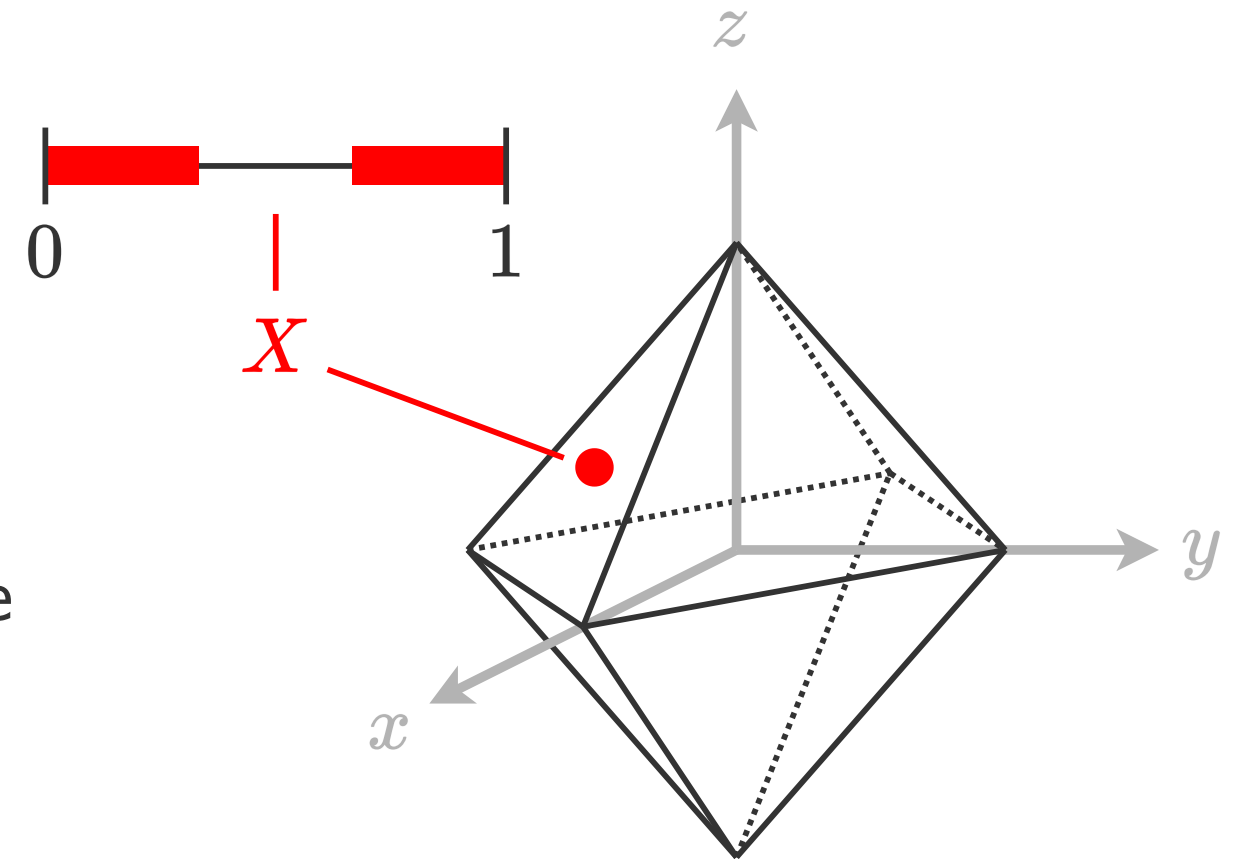
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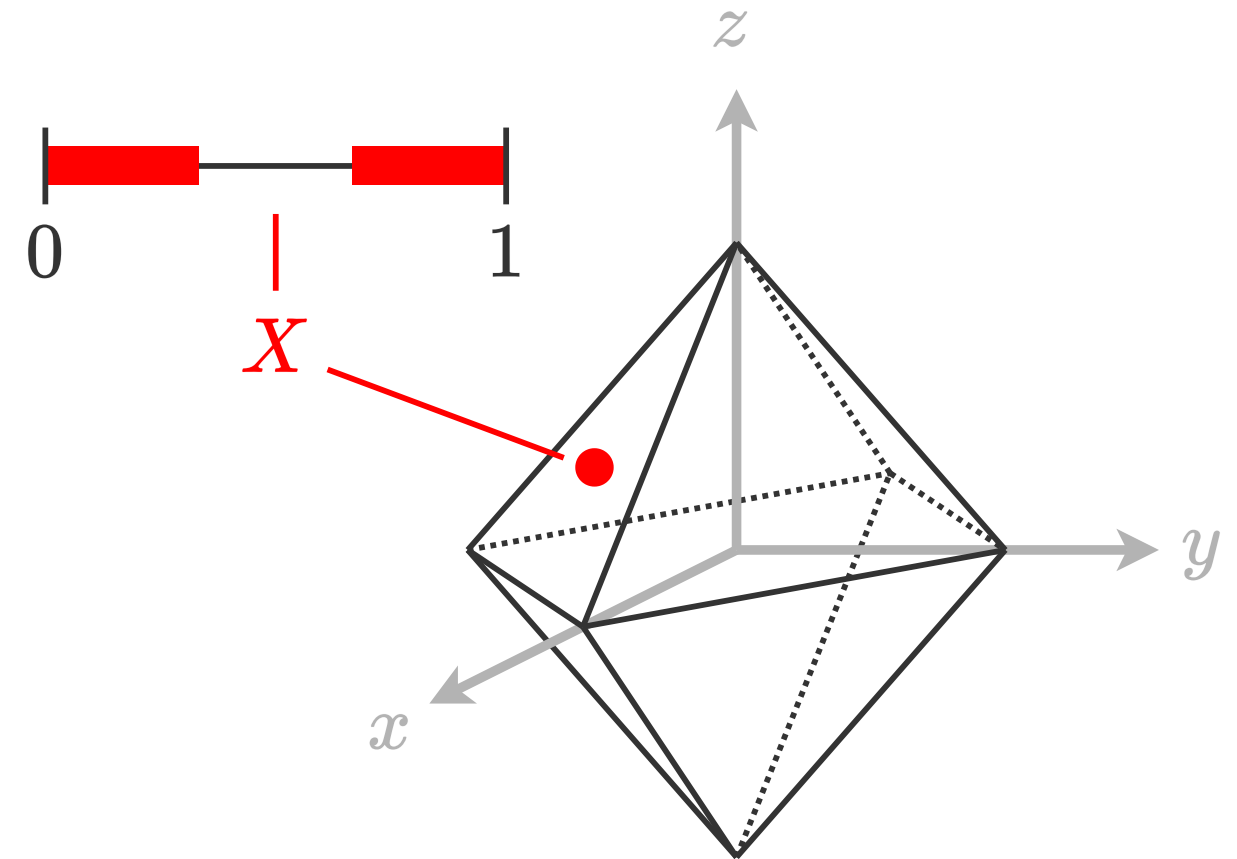
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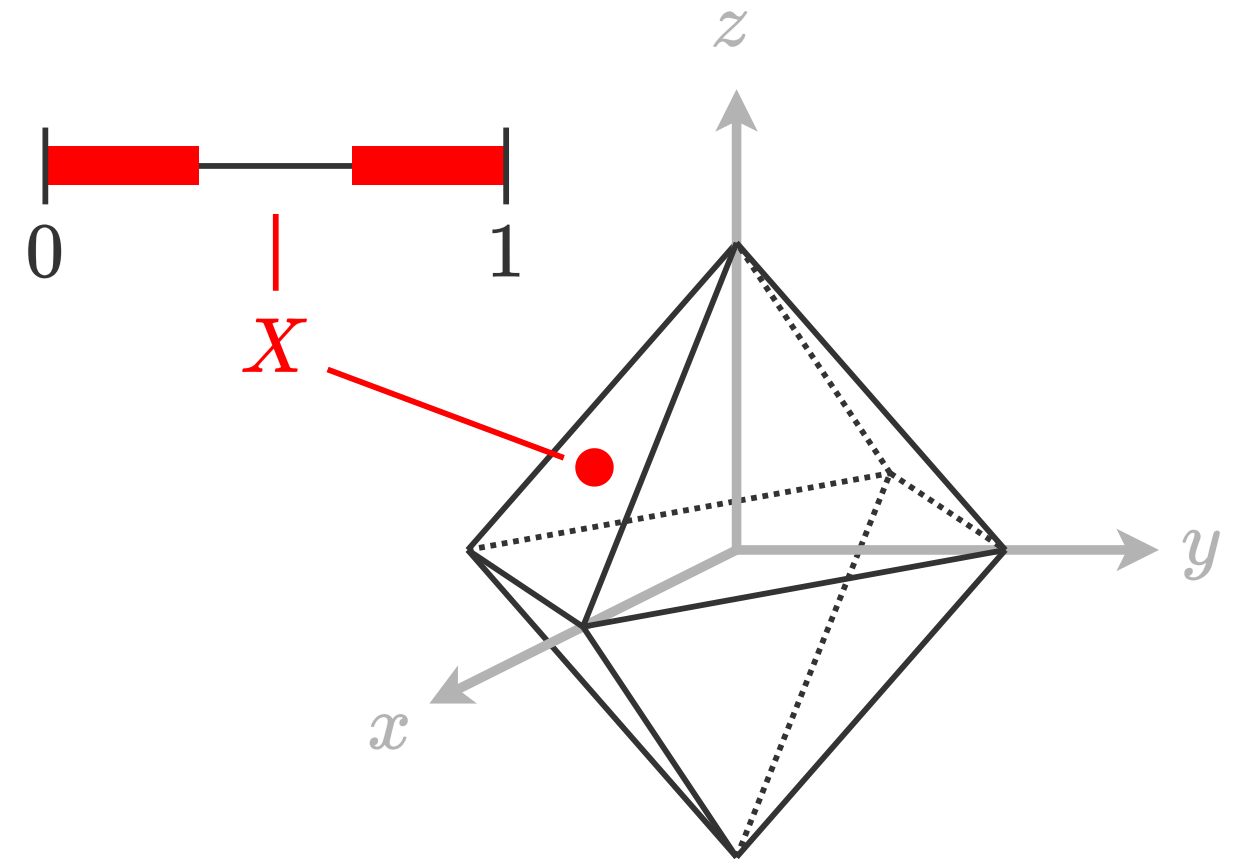
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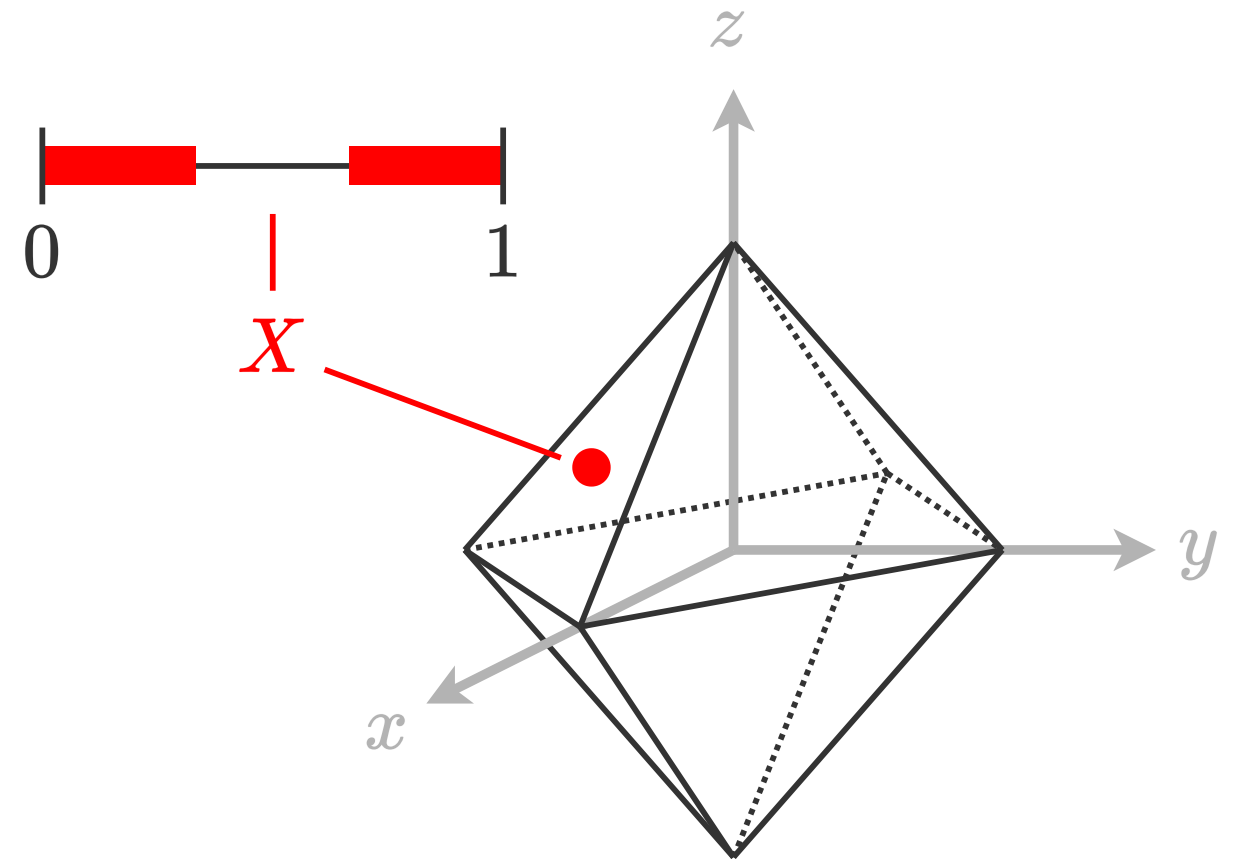
Borsuk-Ulam implies that, for some point  $p \in S$ , corresponding to  $X \subseteq [0, 1]$ , the map

$$f(p) := (v_1(X), v_2(X), \dots, v_n(X))$$

has two antipodal points that collide.

Thus, for each  $i \in [n]$ ,  $v_i(X) = v_i(\overline{X}) = \frac{1}{2}$ . ■

*Proof of Lemma.* Represent a set  $X \subseteq [0, 1]$  formed by  $n$  cuts as a vector in the set  $S := \{(p_1, p_2, \dots, p_{n+1}) \in \mathbb{R}^{n+1} : |p_1| + |p_2| + \dots + |p_{n+1}| = 1\}$  where  $p_i$  is the size of the  $i^{\text{th}}$  interval between cuts, positive iff in  $X$ .



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The *query complexity* of a fairness axiom is the worst-case minimum number of queries (as a function of  $n$ ) needed to find an allocation that guarantees the axiom is satisfied.

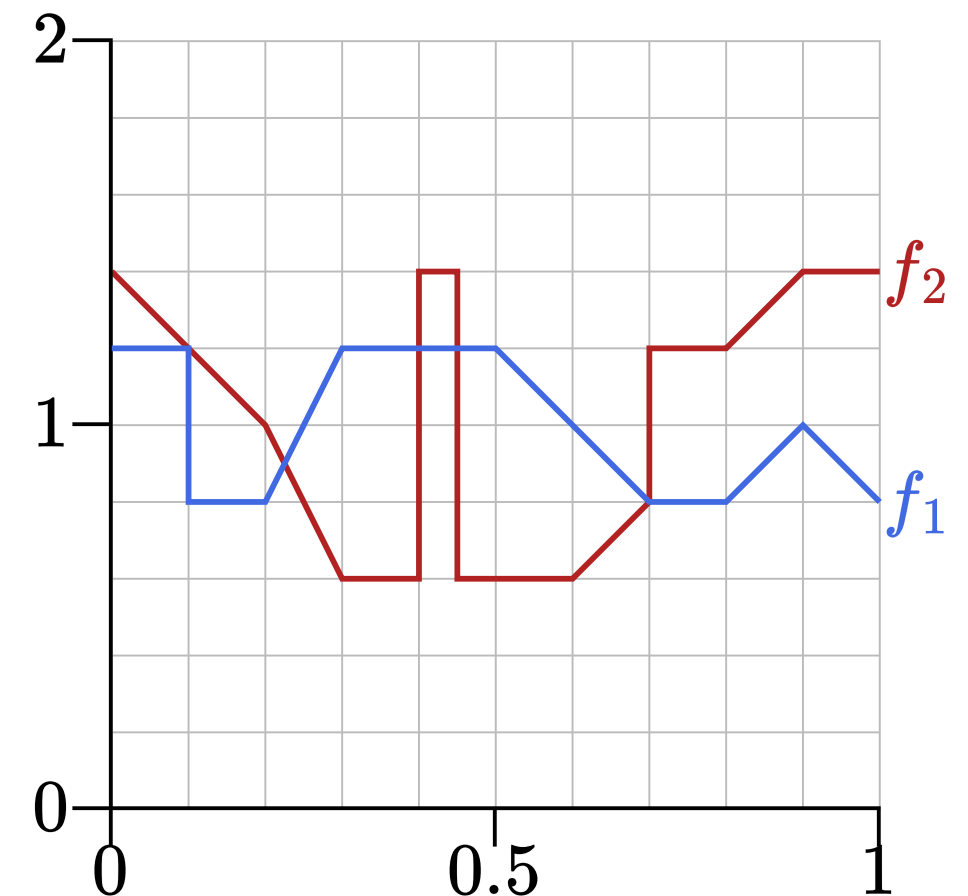
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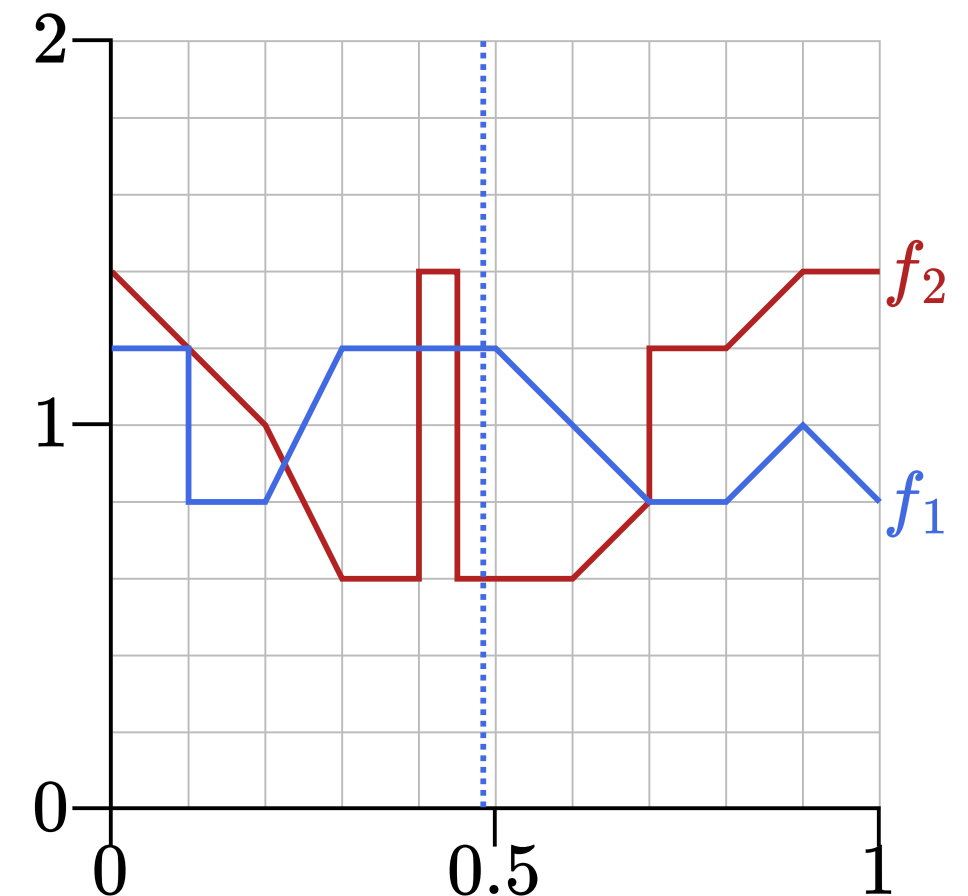
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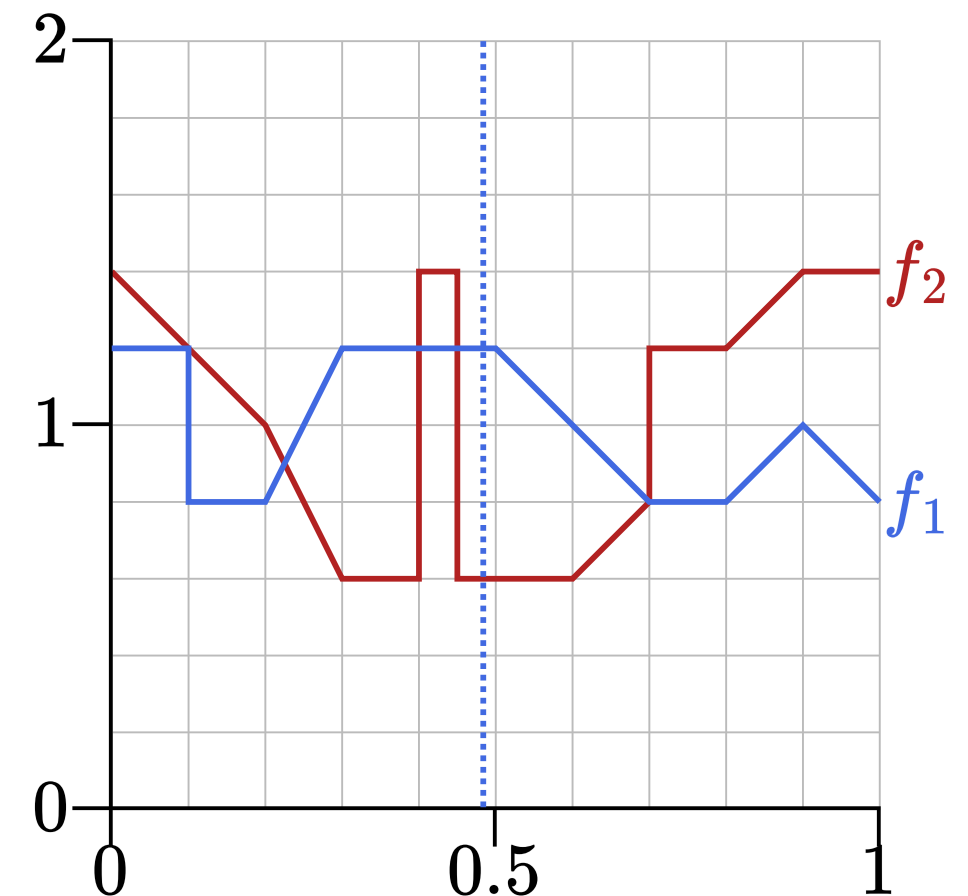
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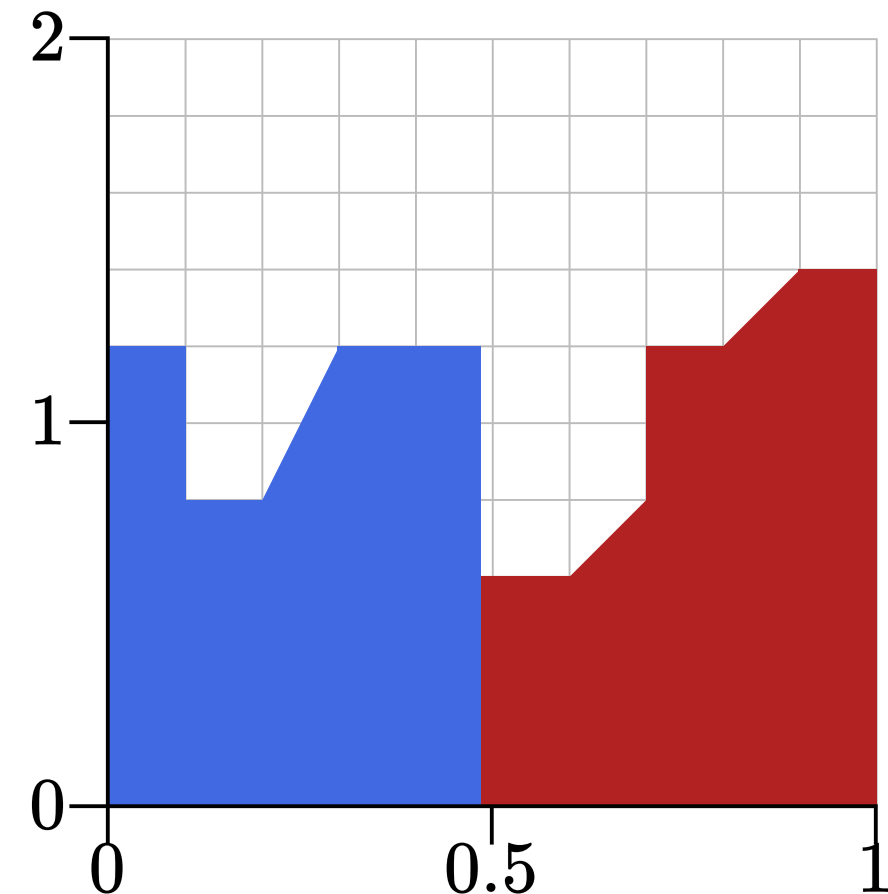
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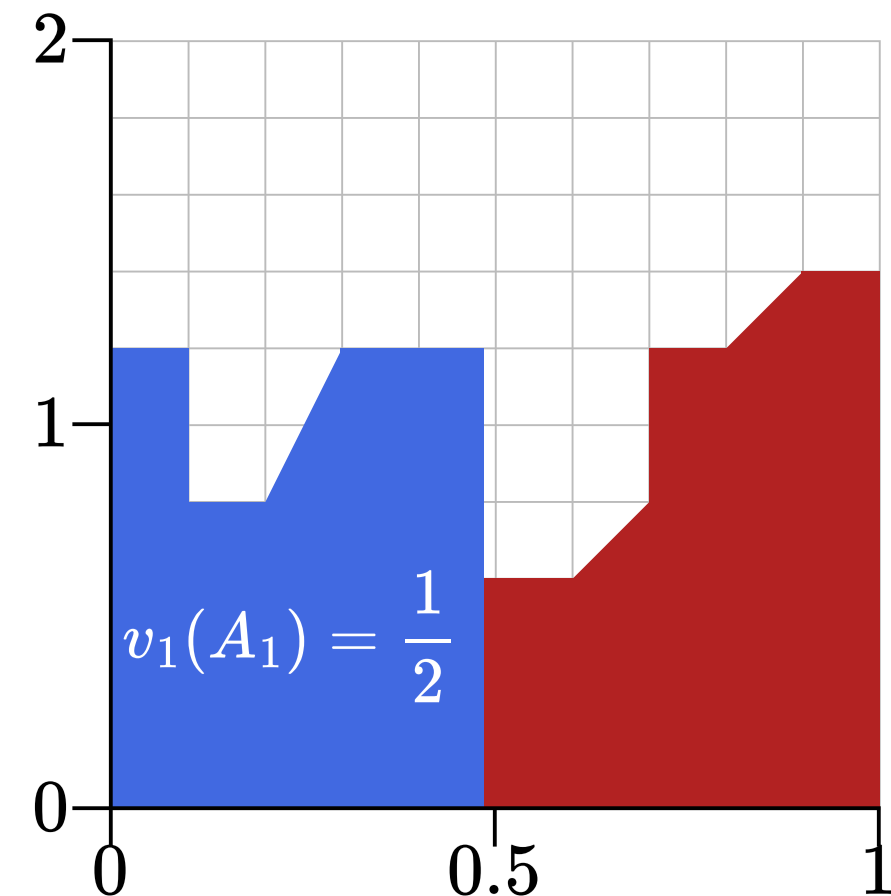
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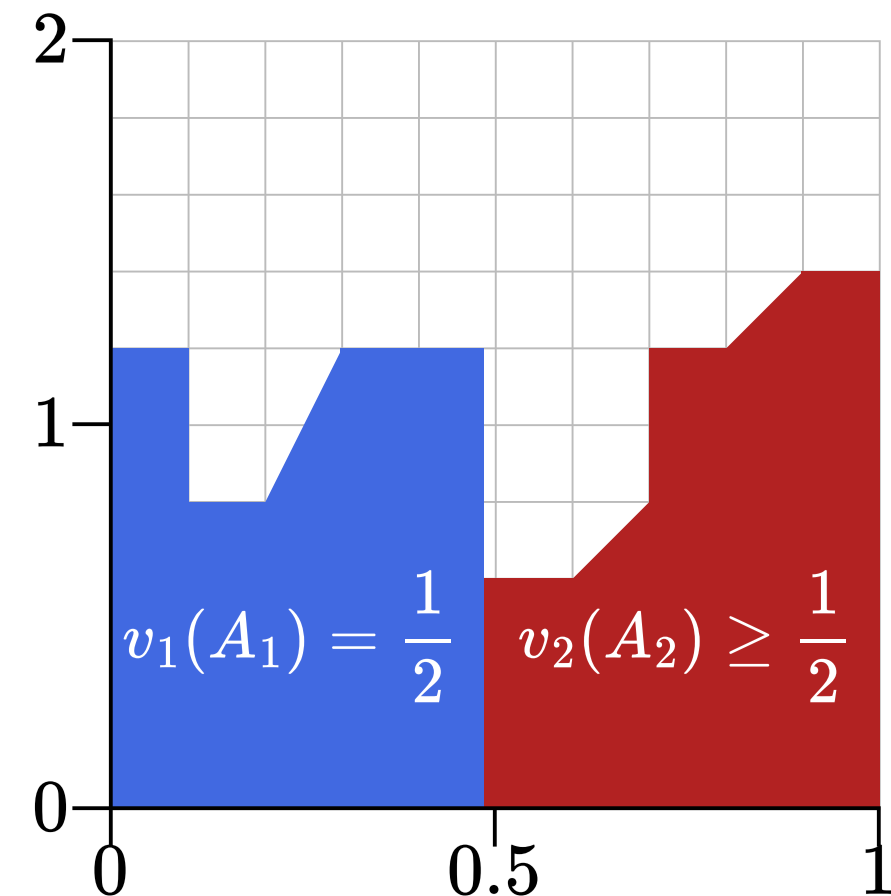
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# Query complexity of Proportionality

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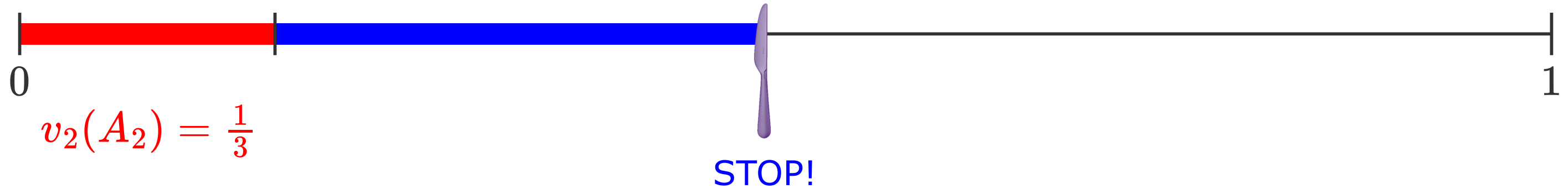
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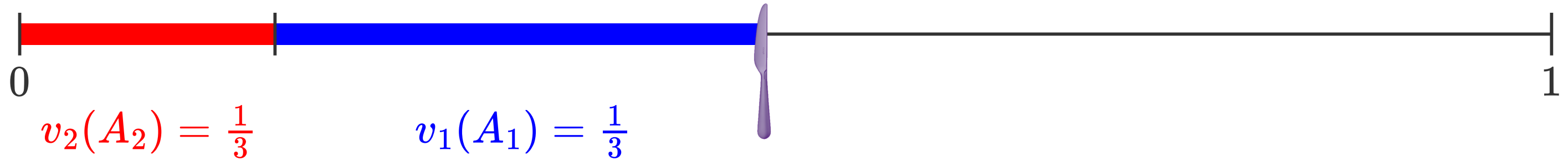
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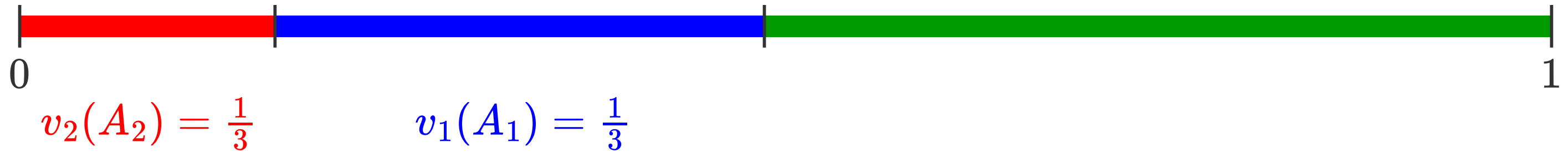
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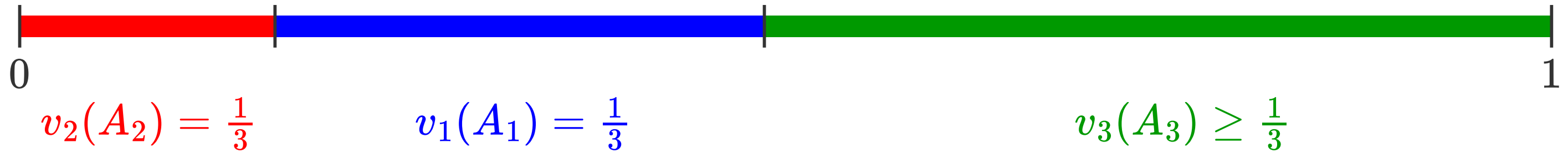
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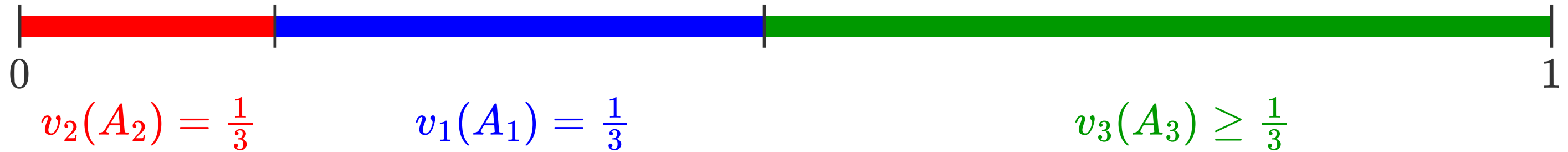
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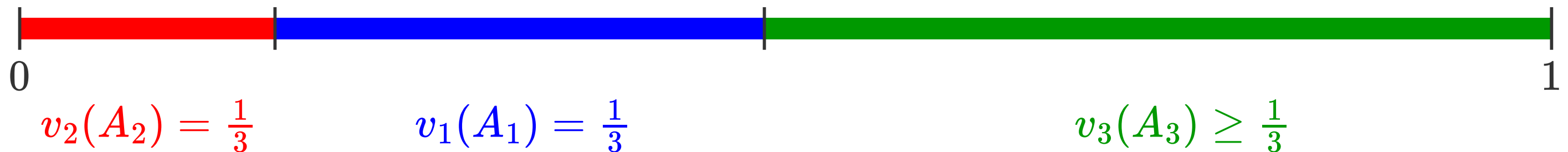
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Main idea behind algorithm (Even, Paz, 1984): Have every agent score the cake where they would divide in half, then cut at the median mark and recurse on both halves.

# Query complexity of EF

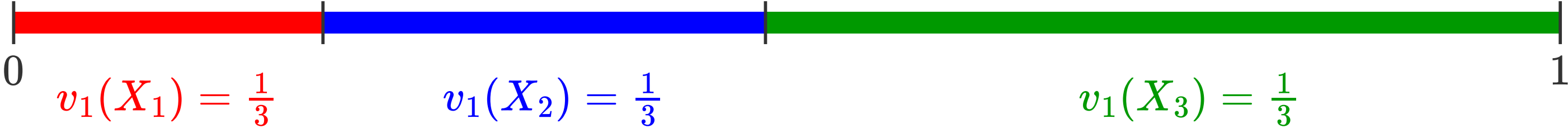
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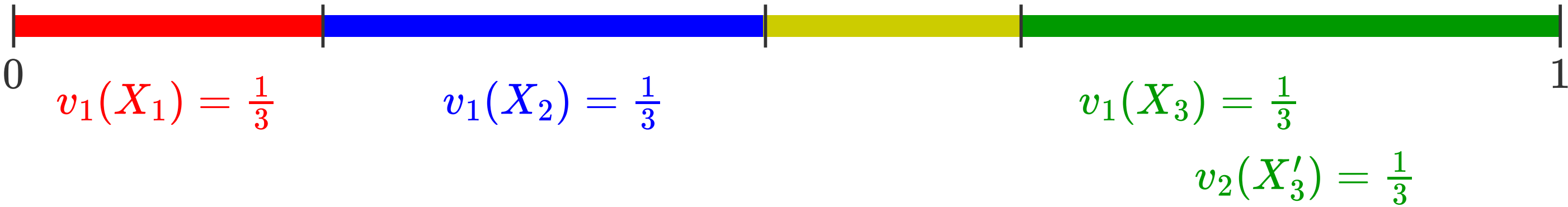
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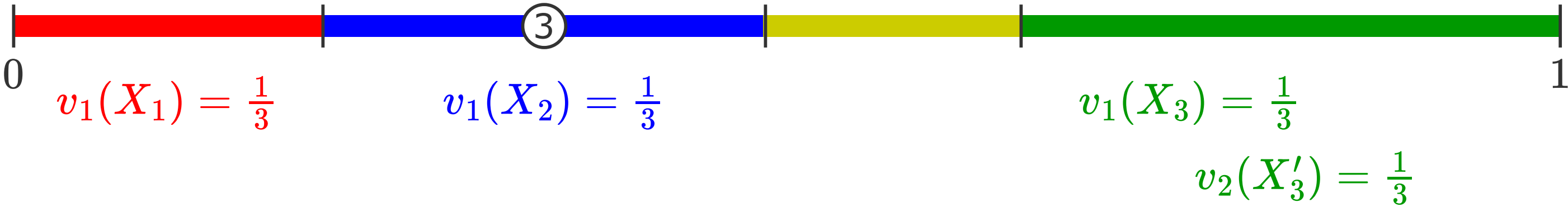
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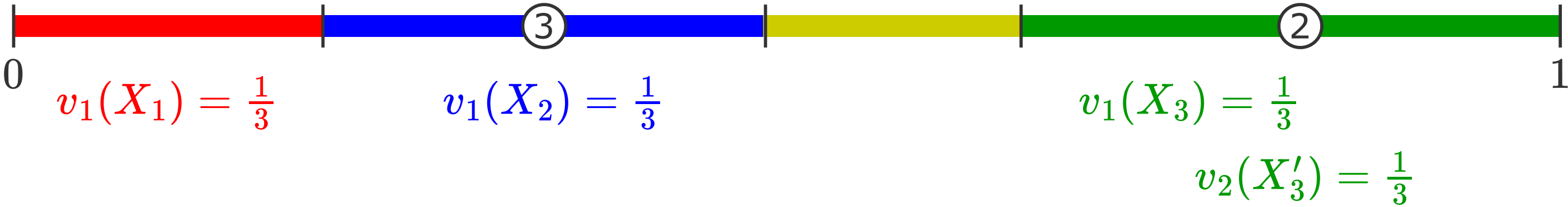
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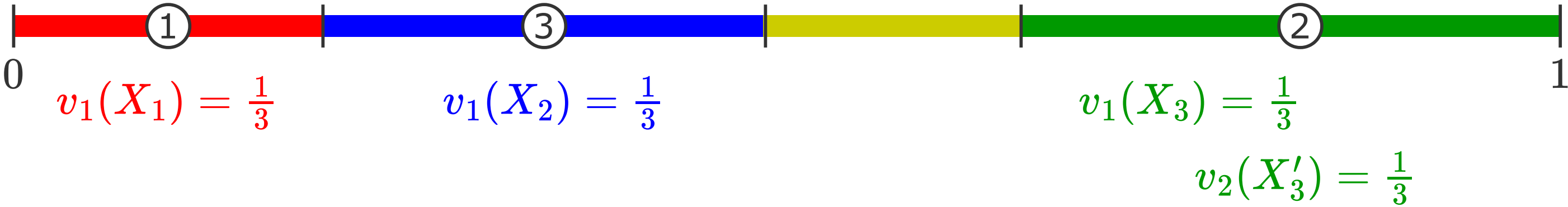
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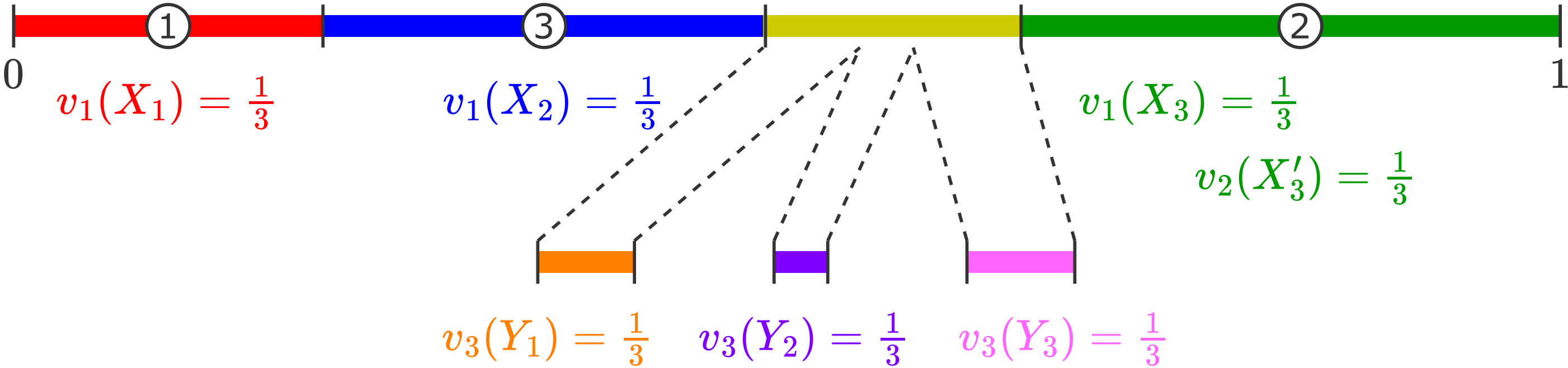
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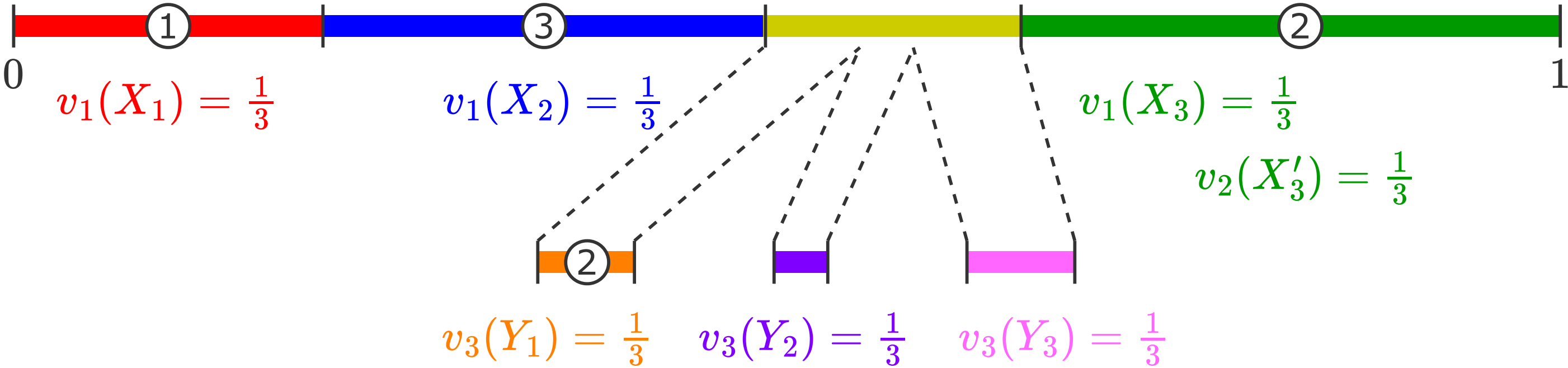
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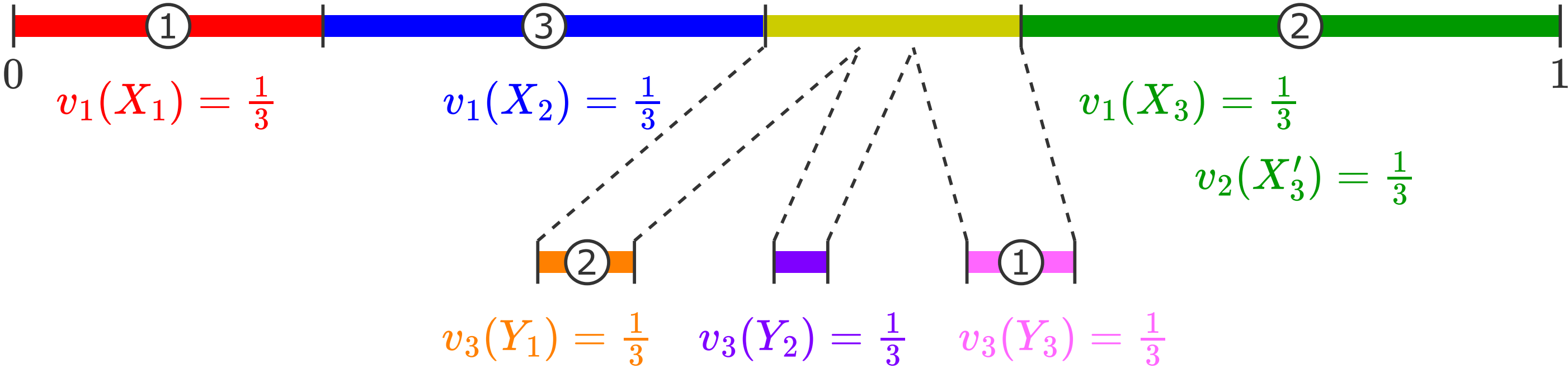
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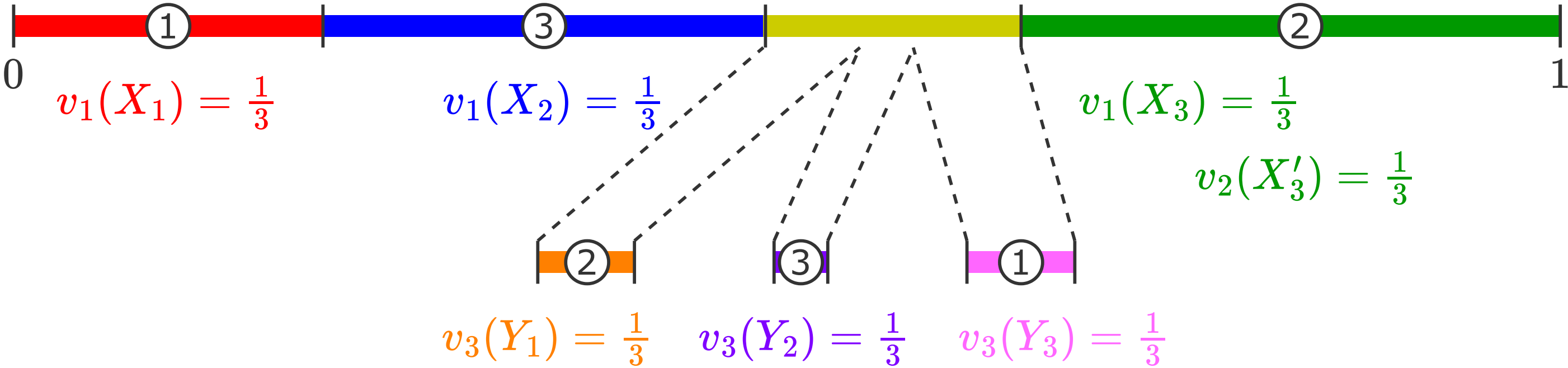
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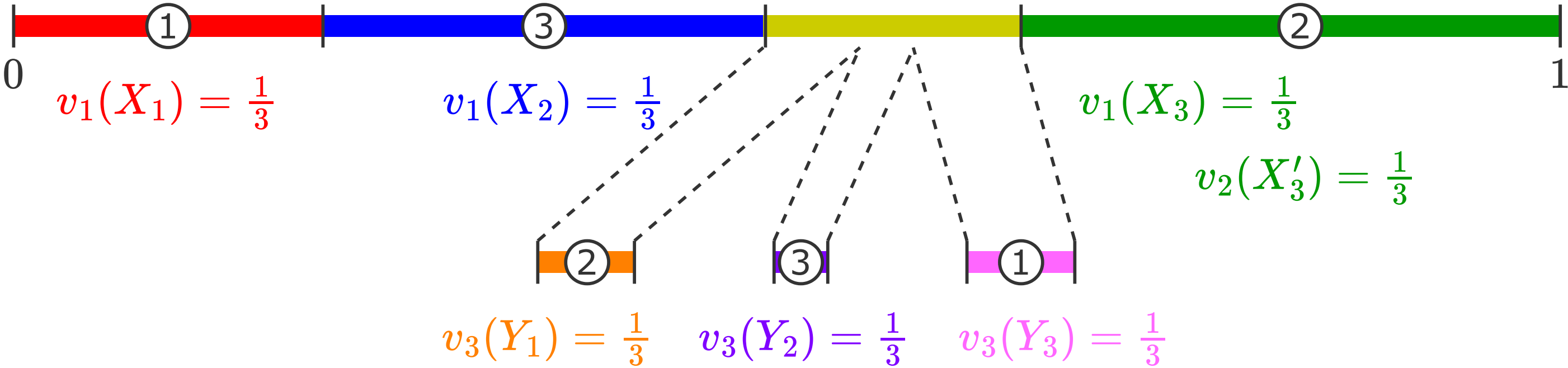
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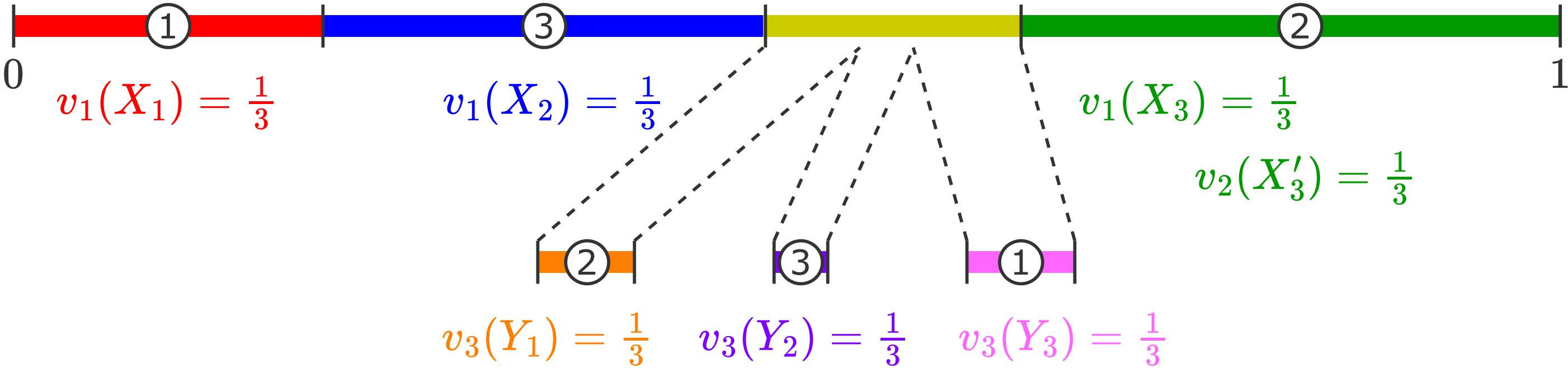
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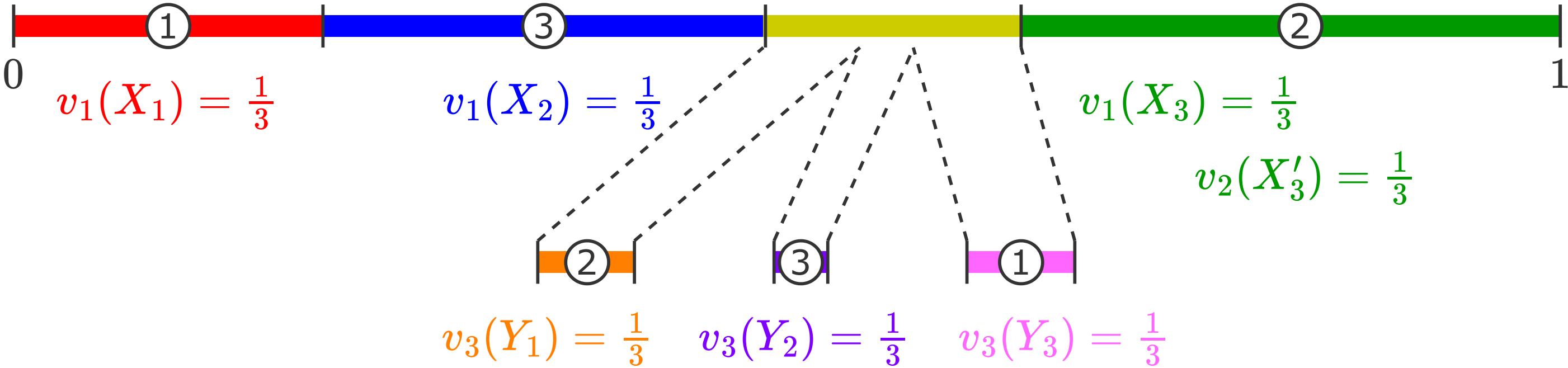
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**Open Question:** Narrow the gap!



# Strategy in Divide-and-Choose

Strategic setting (Tucker-Foltz, Zeckhauser, 2024):

- 2 players,  $n$  goods
- Divider's and Chooser's value for good  $i$  drawn from commonly-known distributions  $\mathcal{G}_i^D$  and  $\mathcal{G}_i^C$
- Each good is divisible

► **When there is no uncertainty (i.e. each distribution is supported on a single value), would you rather be Divider or Chooser?**



Respond at:

[pollev.com/jtuckerfoltz255](https://pollev.com/jtuckerfoltz255) or

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text jtuckerfoltz255 to 37607

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Strategy: Put 45 best goods in one pile, 55 worst in other.



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# Divider versus Chooser utilities

## **Theorem (Tucker-Foltz, Zeckhauser, 2024)**

*Suppose both players' values for all  $n$  goods are drawn i.i.d. from a common distribution  $\mathcal{D}$  with bounded, positive, nontrivial support. Then:*

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# Divider versus Chooser utilities

$$\mathcal{D} = \mathcal{N}(1, 0.2)$$

