

# Lecture 7

## Cake Cutting

# Fair Division

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# Fair Division

Divisible



# Fair Division

Divisible



Indivisible

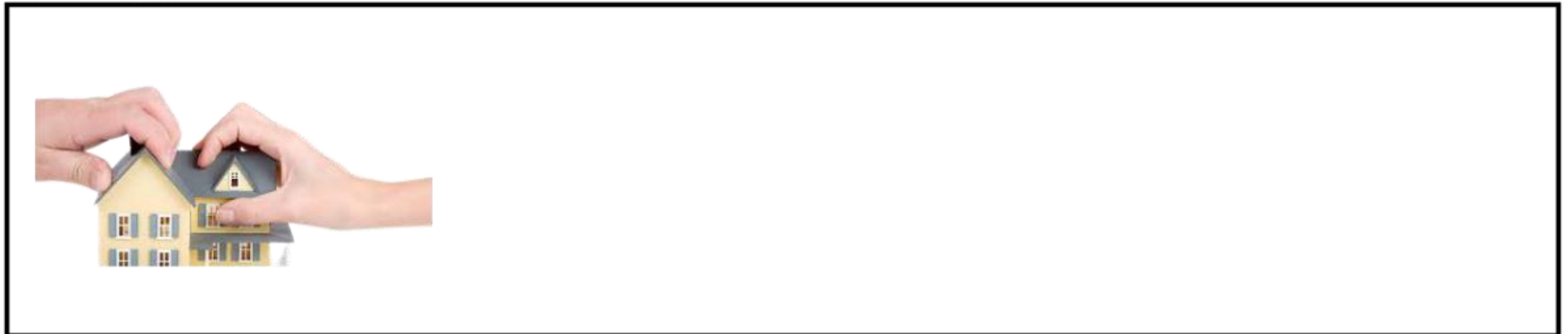


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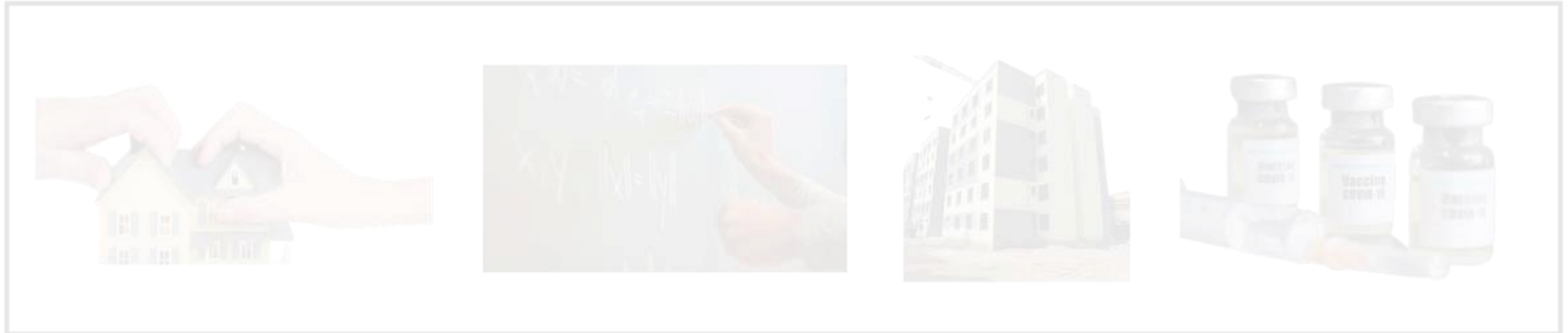


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# Cake Cutting



How to fairly divide a cake

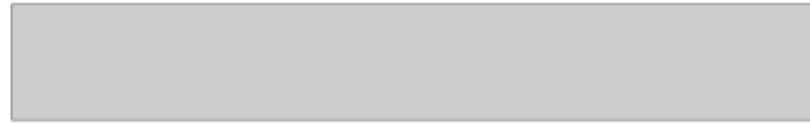
# Cake Cutting



How to fairly divide a cake  
among agents with **differing preferences?**

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Fair



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I like vanilla  
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I love fruits.



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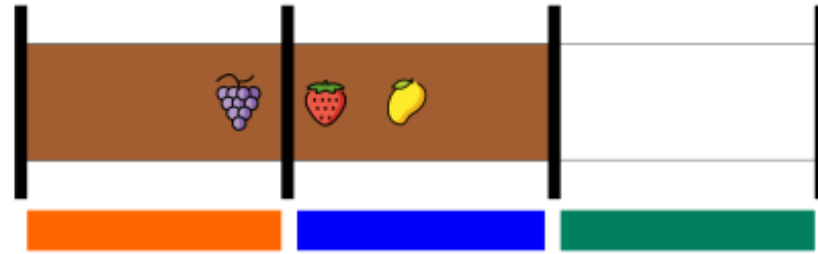
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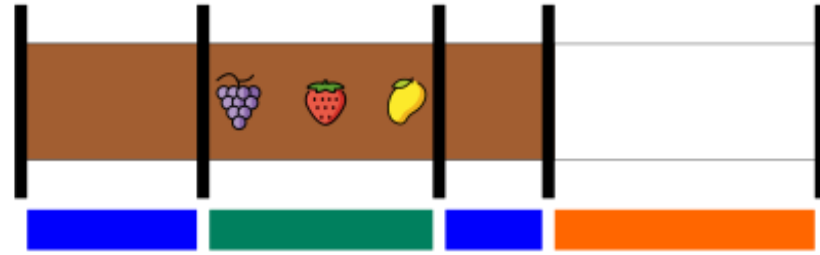
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A fairer division



Why is this problem interesting?

Preferences matter!



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for disjoint  $X, Y \subseteq [0, 1]$ ,  
$$v_i(X \cup Y) = v_i(X) + v_i(Y)$$

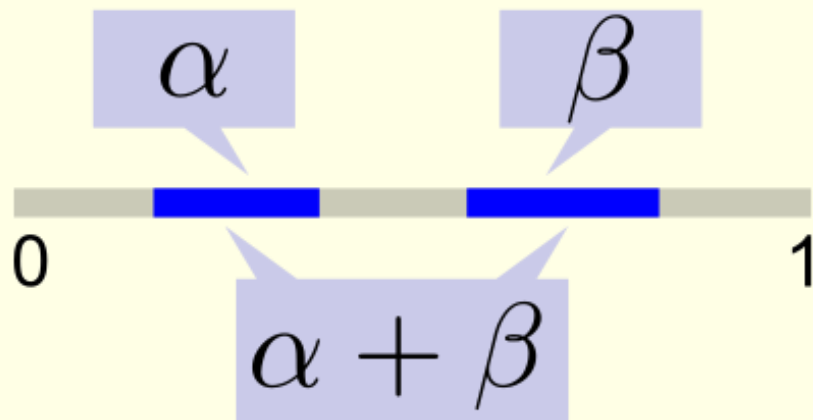


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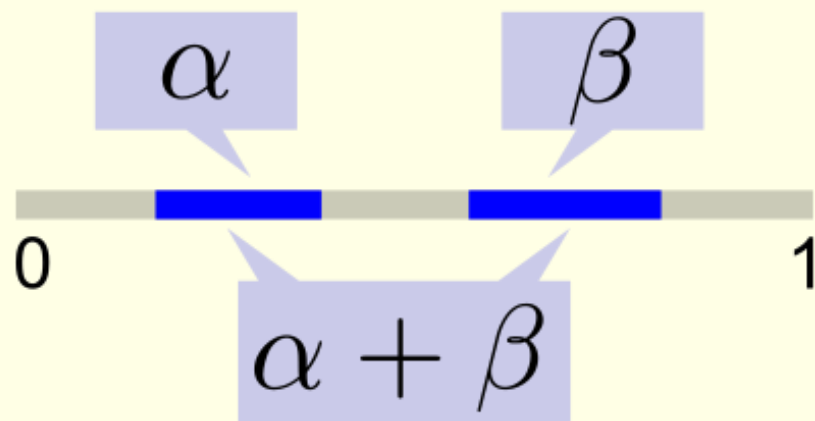


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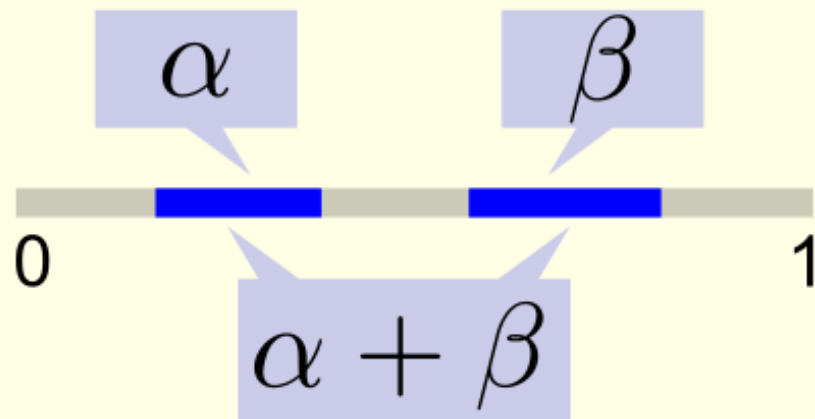
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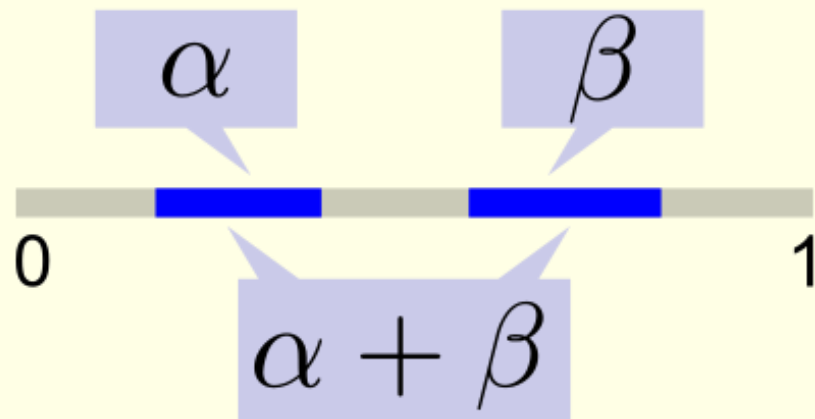


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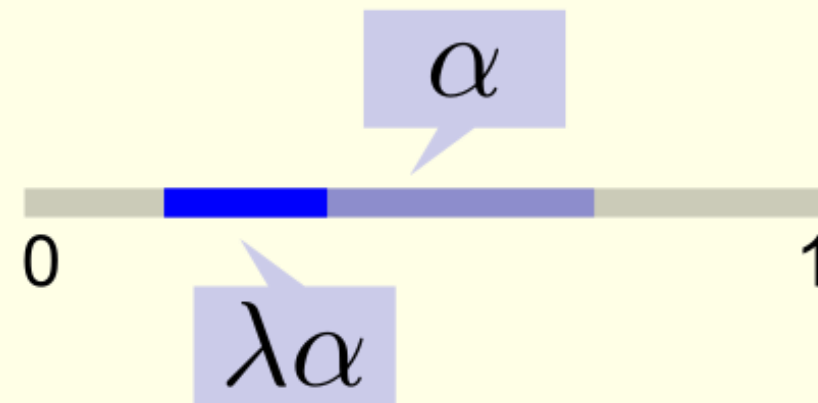
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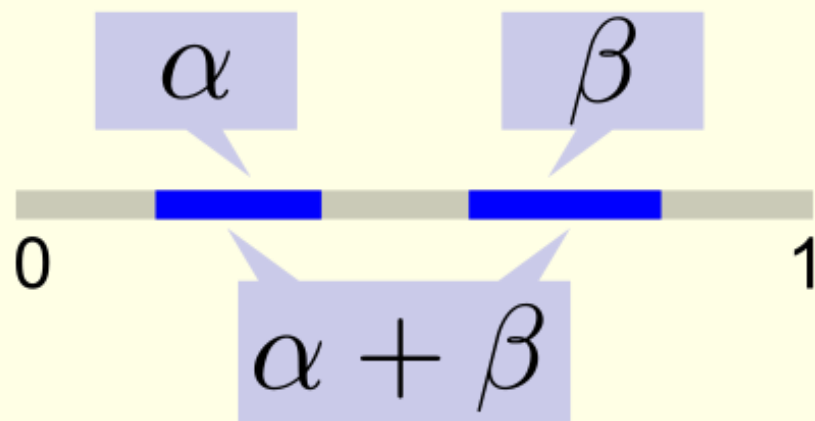


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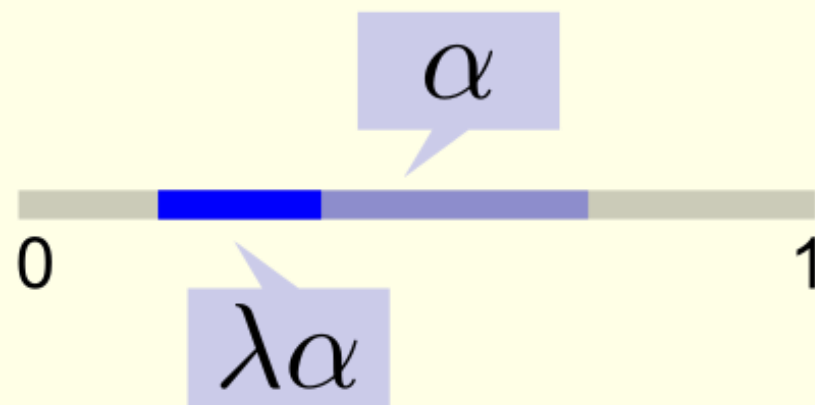
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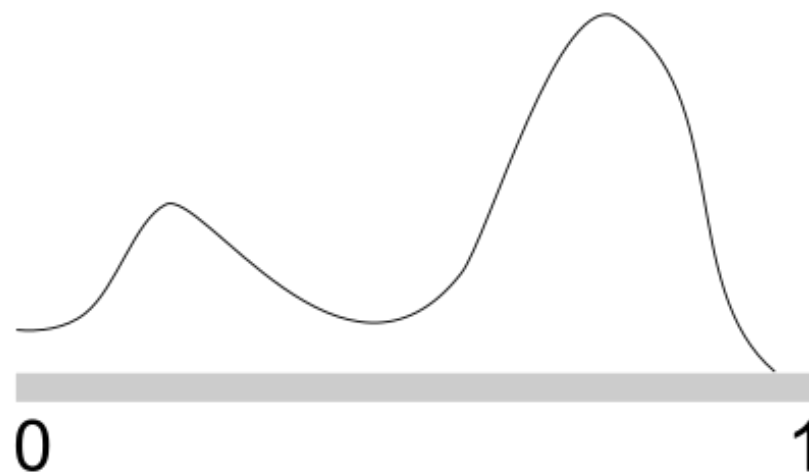


**Normalization:** for each agent  $i$ ,  $v_i([0, 1]) = 1$ .

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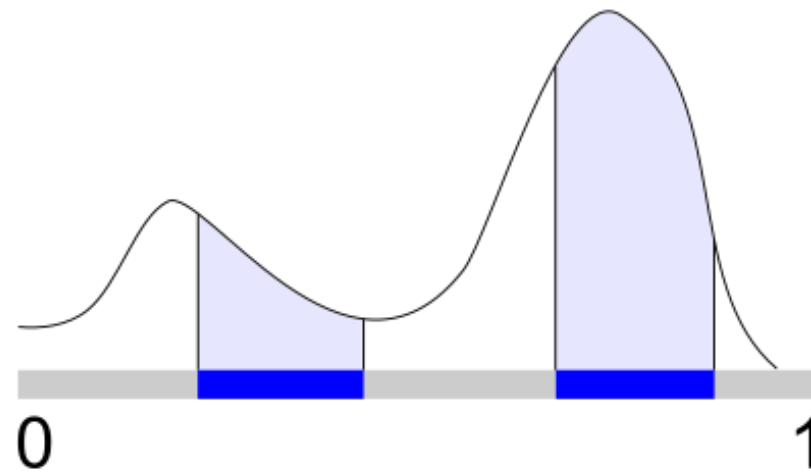


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*value density function*



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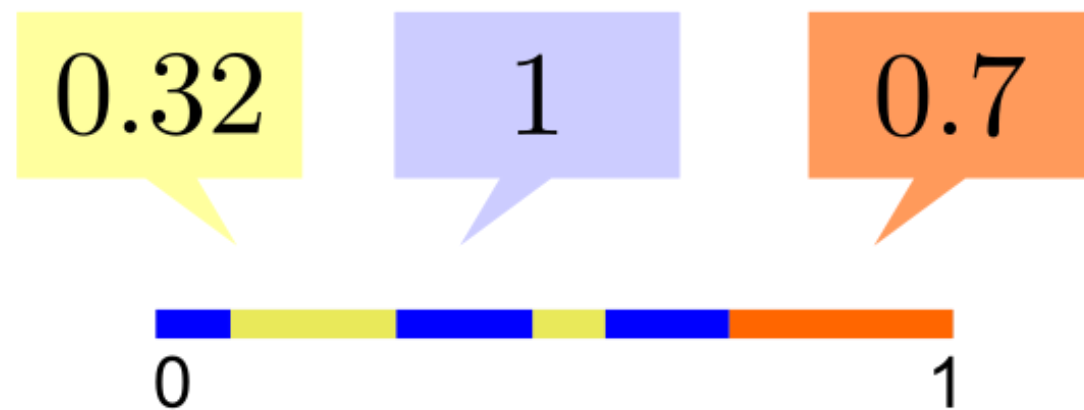
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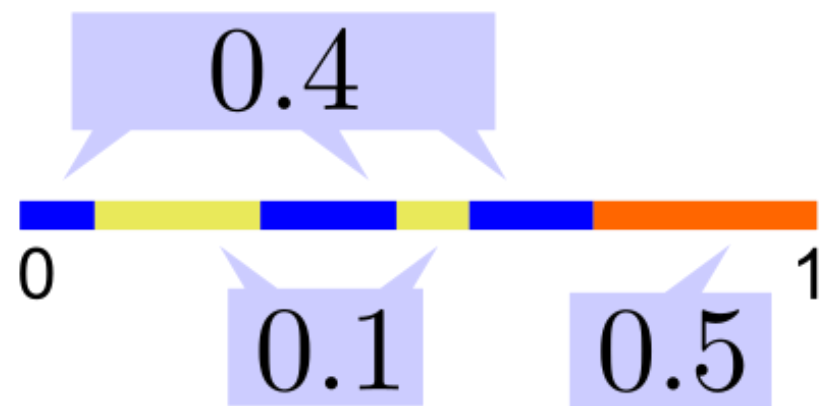
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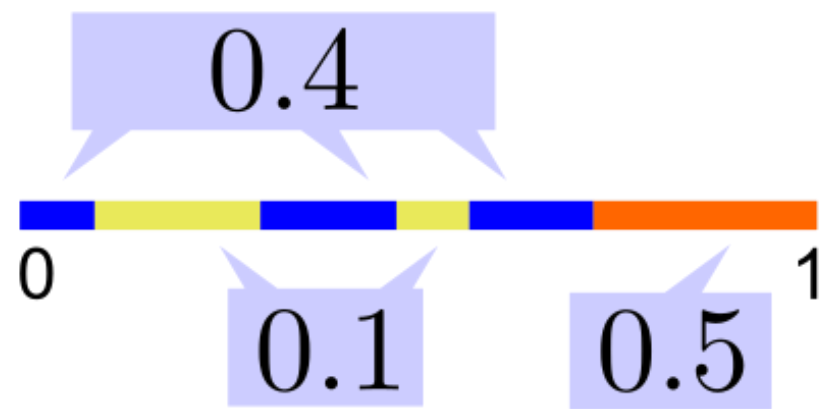
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For two agents ( $n=2$ ), is one property stronger than the other?

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What about three or more agents?

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Prop implies EF for *two* agents (but no more)

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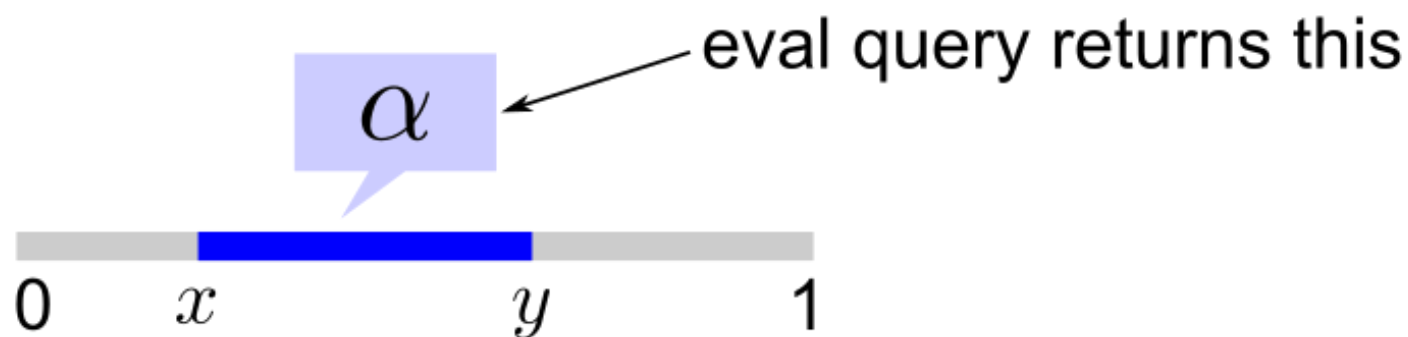


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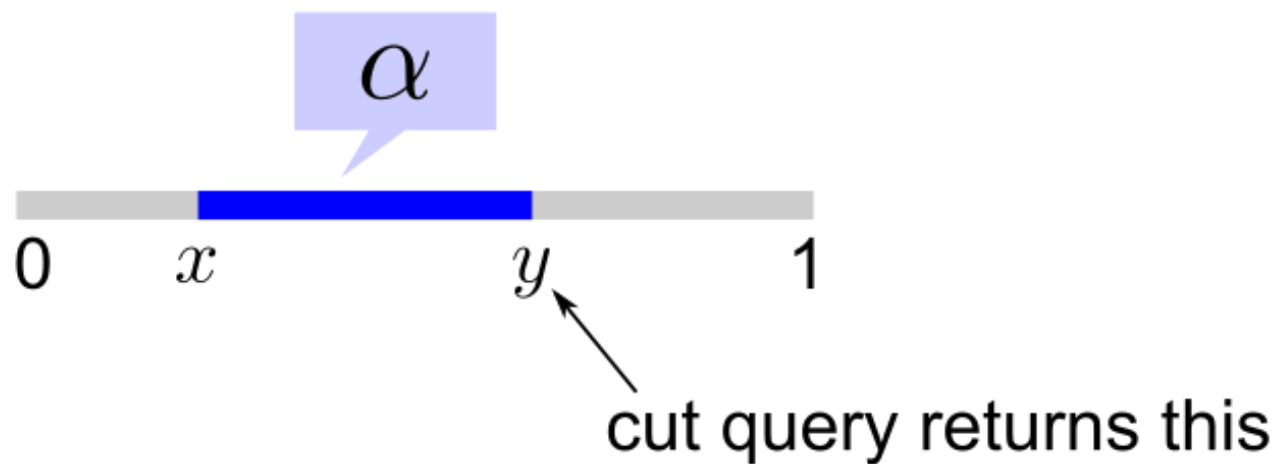


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# Cake-Cutting Algorithms

Let's start by thinking about proportionality for two agents.

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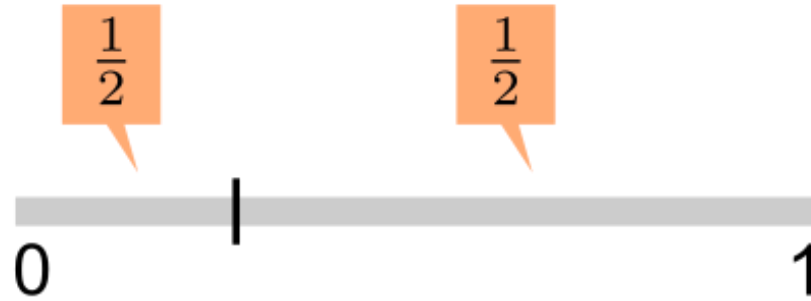
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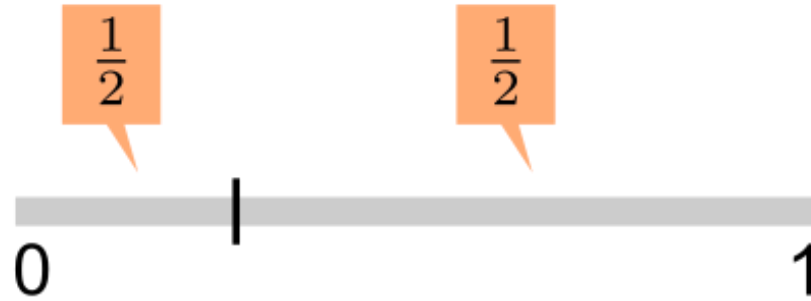
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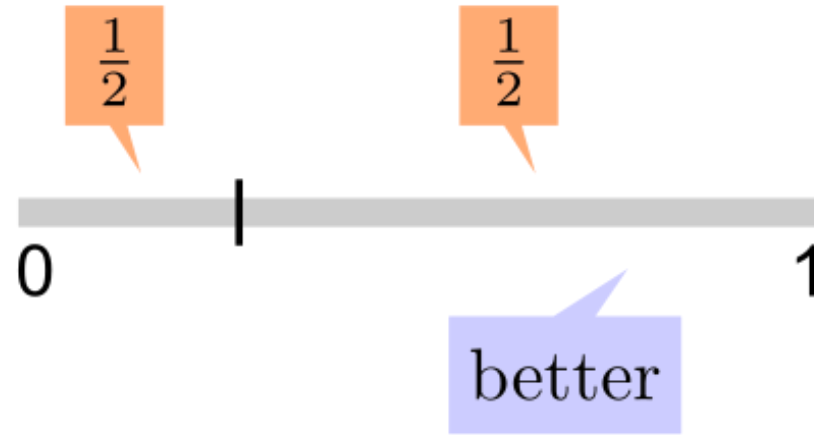
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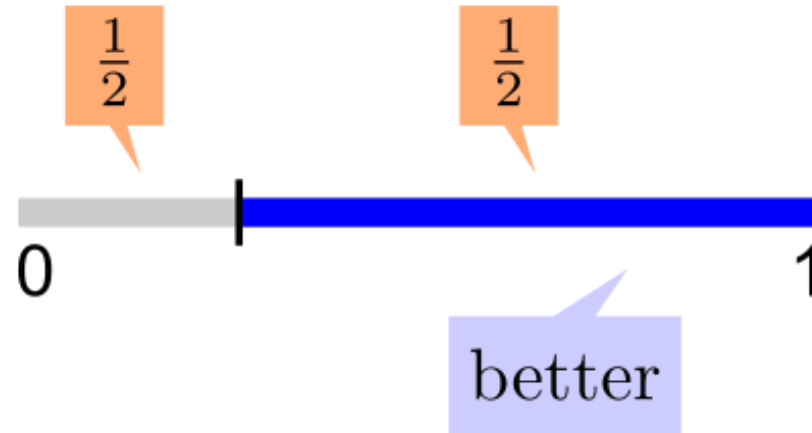
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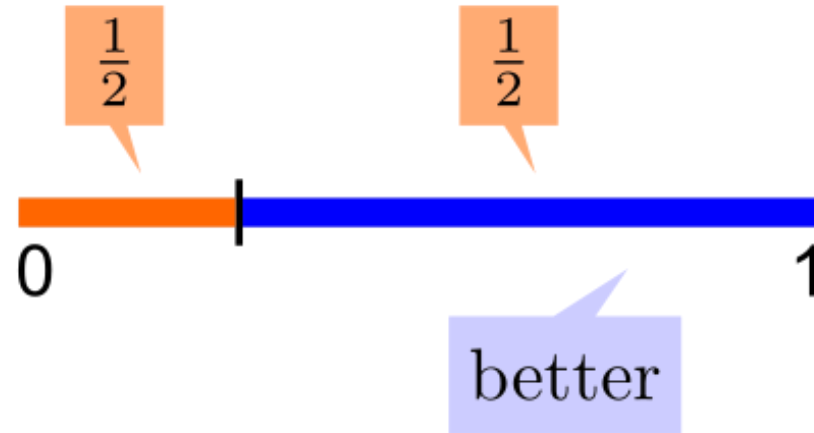
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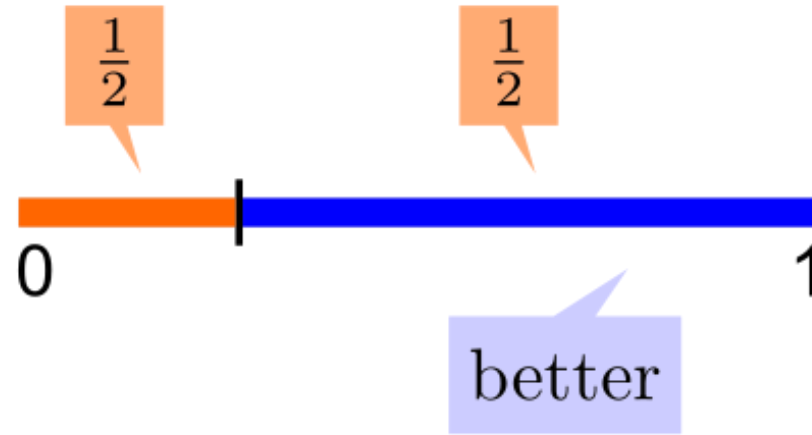
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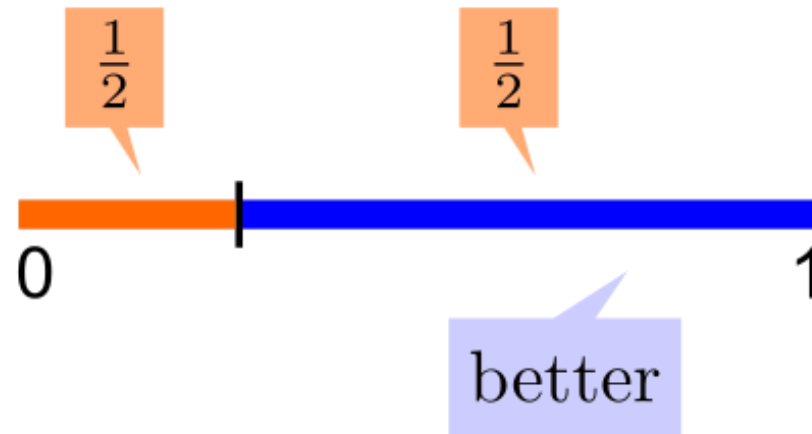
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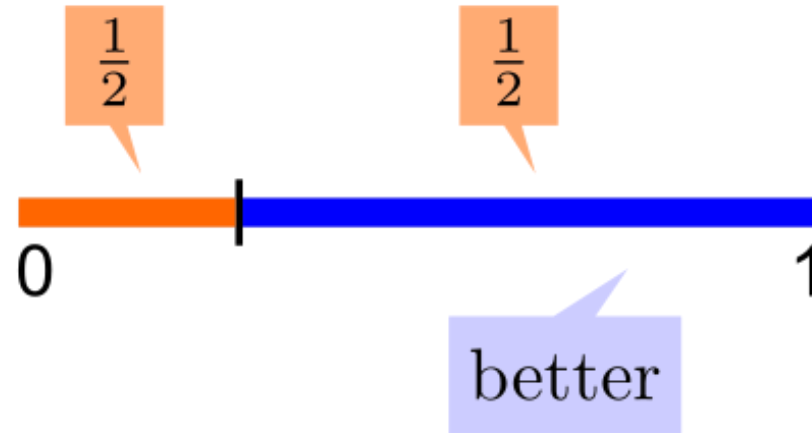


Is the cut-and-choose outcome proportional?

Yes! Agent 2's value is at least  $1/2$ . Agent 1's value is exactly  $1/2$ .

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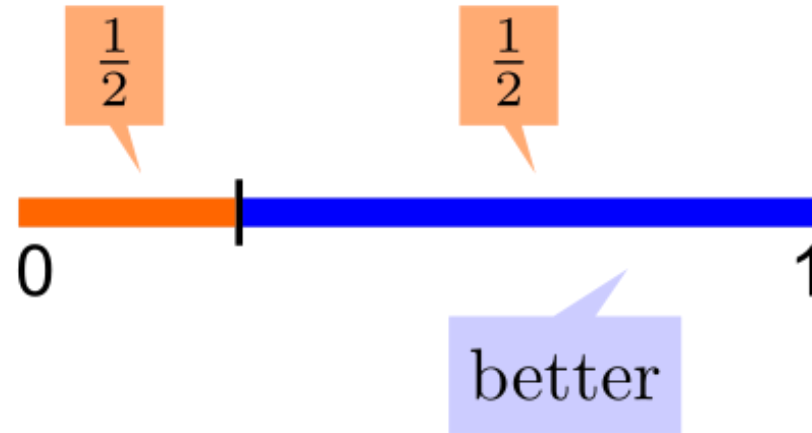
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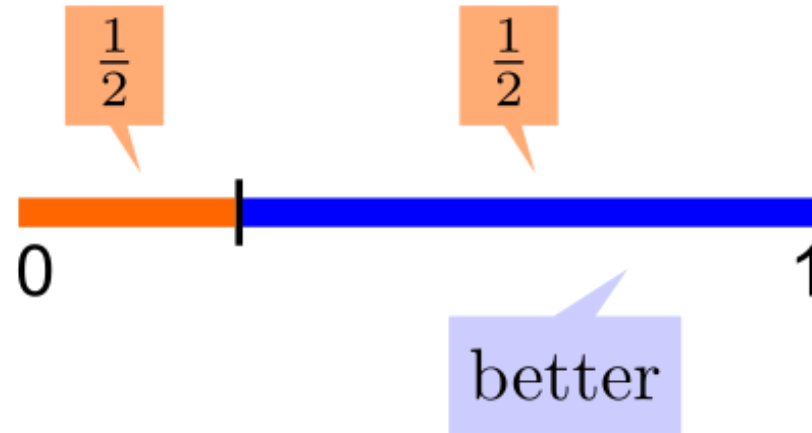
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Yes! EF and Prop are equivalent for two agents.



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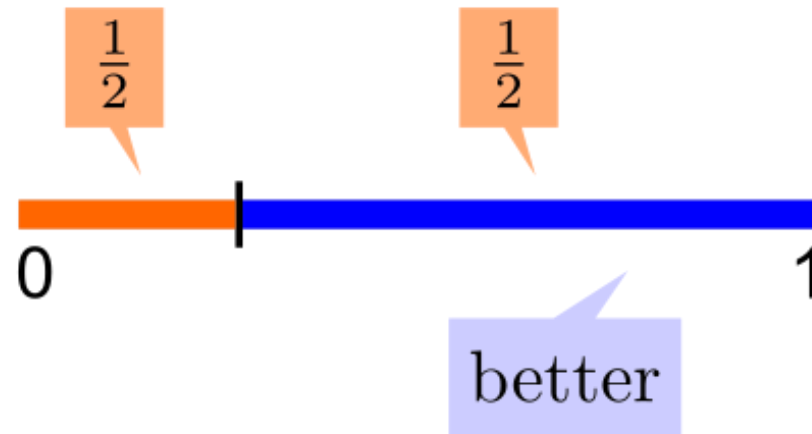
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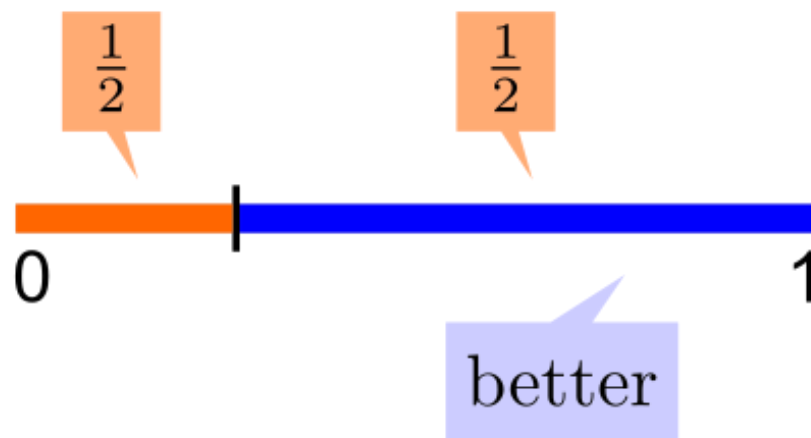


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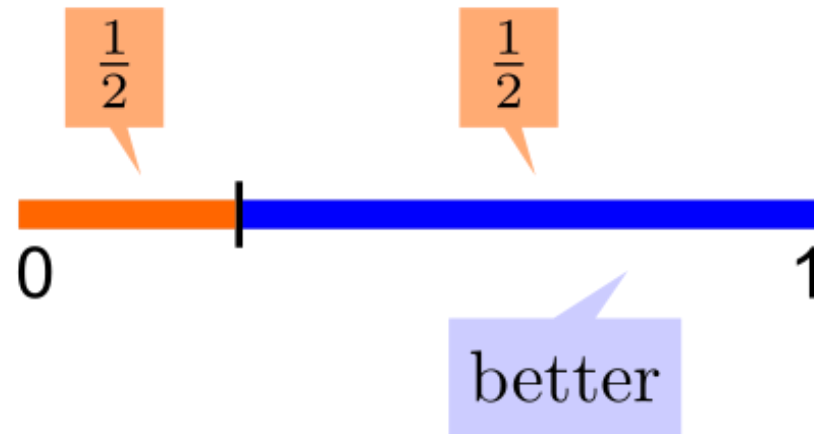
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$$\text{eval}_2(0, y)$$

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For two agents, an envy-free/proportional cake division can be computed using two queries.

# Dubins-Spanier Procedure

A proportional cake division protocol for any number of agents

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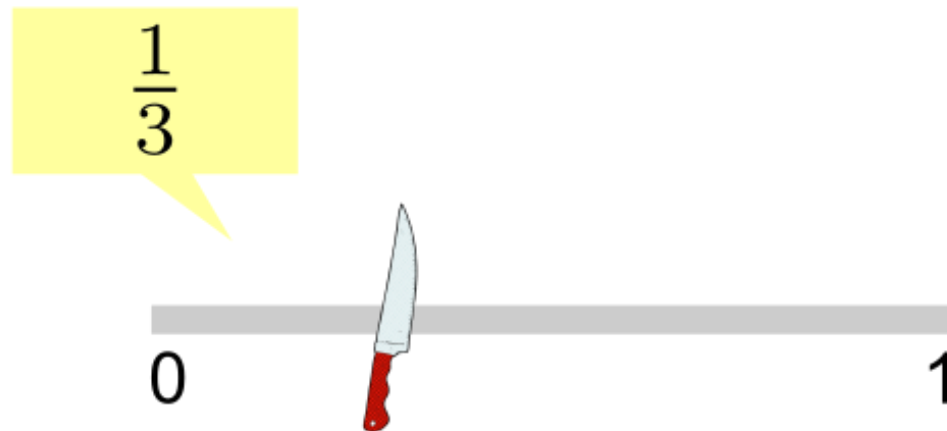
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4. The procedure repeats with the remaining agents.



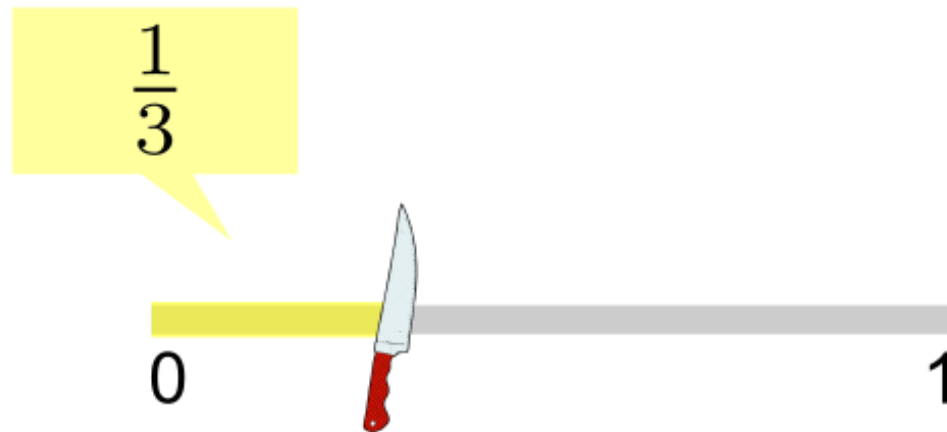
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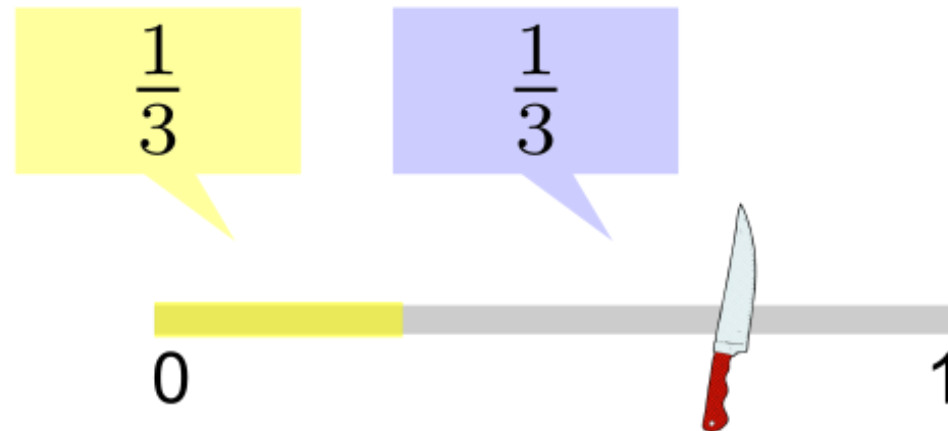
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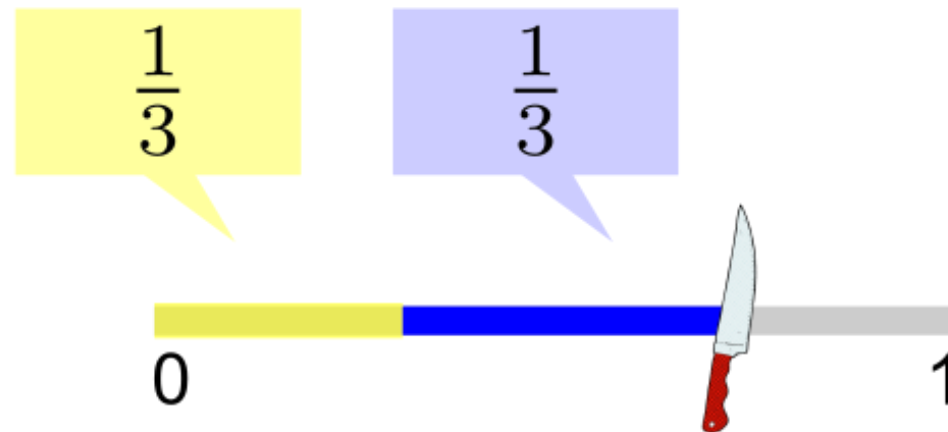
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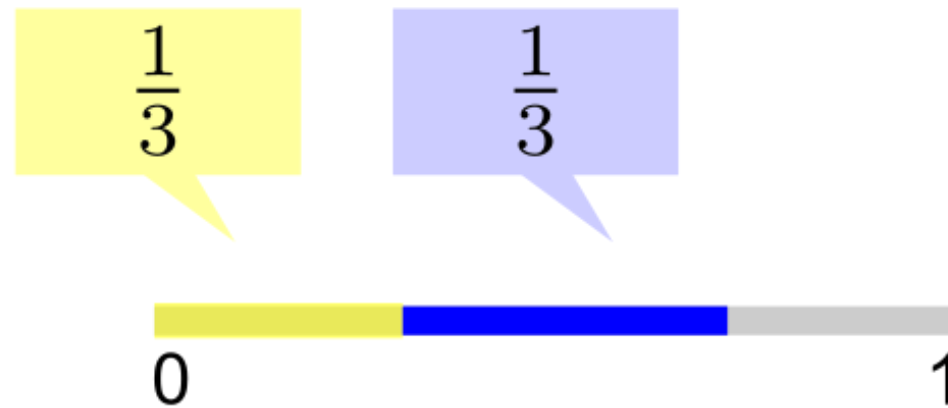
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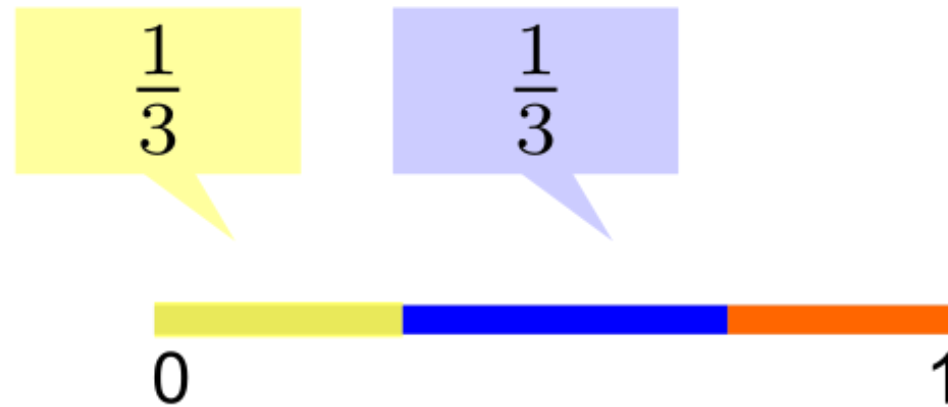
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Why is the resulting allocation proportional?

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Why is the resulting allocation proportional?

Every agent except for the last one gets *exactly*  $1/n$ .  
The last agent gets *at least*  $1/n$ .

# Dubins-Spanier Procedure

1. A referee gradually moves a knife from left to right.
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Can this procedure be implemented in the Robertson-Webb model?

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Can this procedure be implemented in the Robertson-Webb model?

Yes!

# Dubins-Spanier Procedure

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Query complexity in the Robertson-Webb model?



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Query complexity in the Robertson-Webb model?

$\mathcal{O}(n^2)$  queries (Exercise)

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For  $n$  agents, a proportional cake division can be computed using  $O(n^2)$  queries.

# The Story of Proportionality

# The Story of Proportionality

query complexity



# The Story of Proportionality

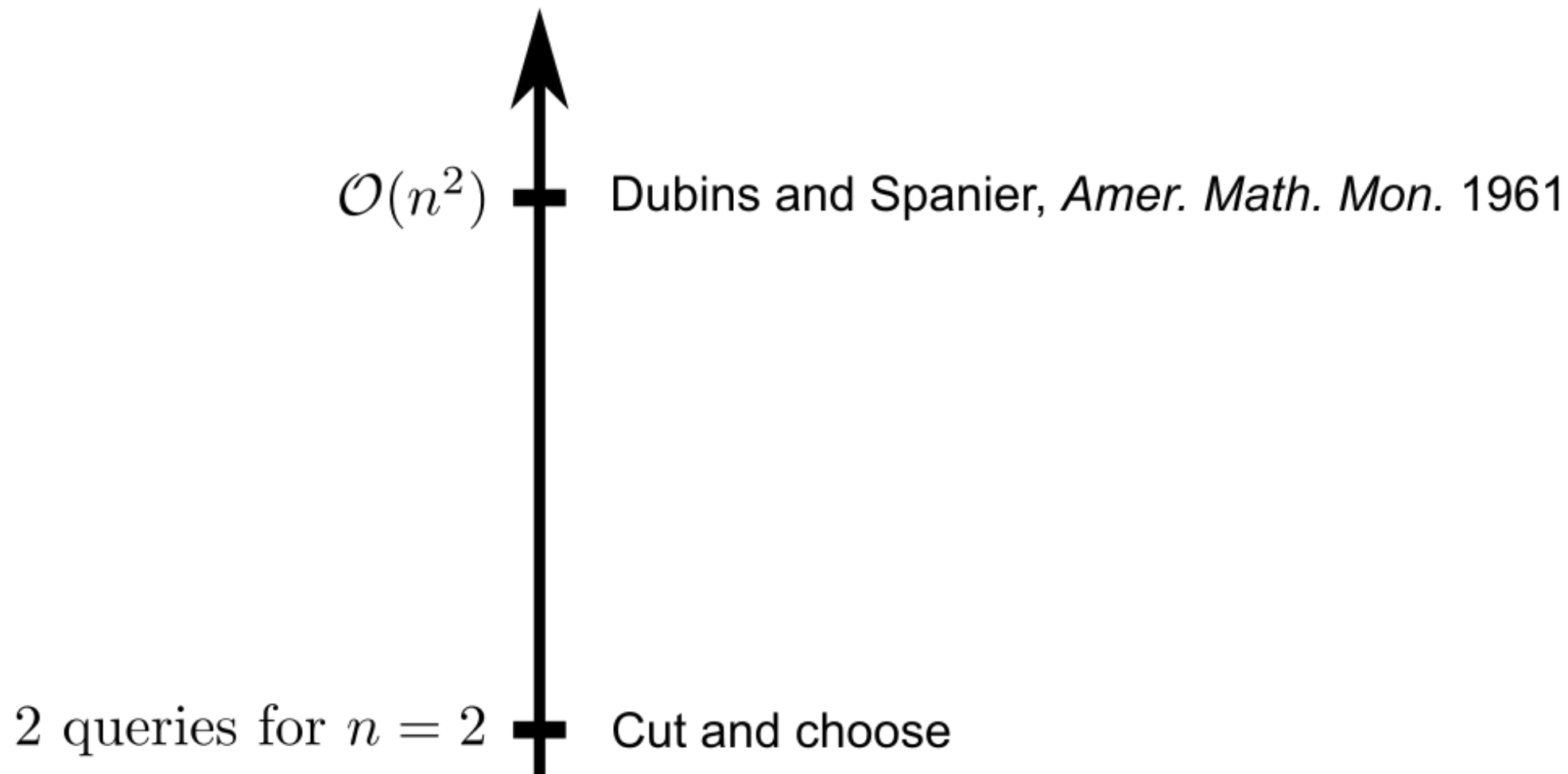
query complexity



2 queries for  $n = 2$  + Cut and choose

# The Story of Proportionality

query complexity



$\mathcal{O}(n^2)$

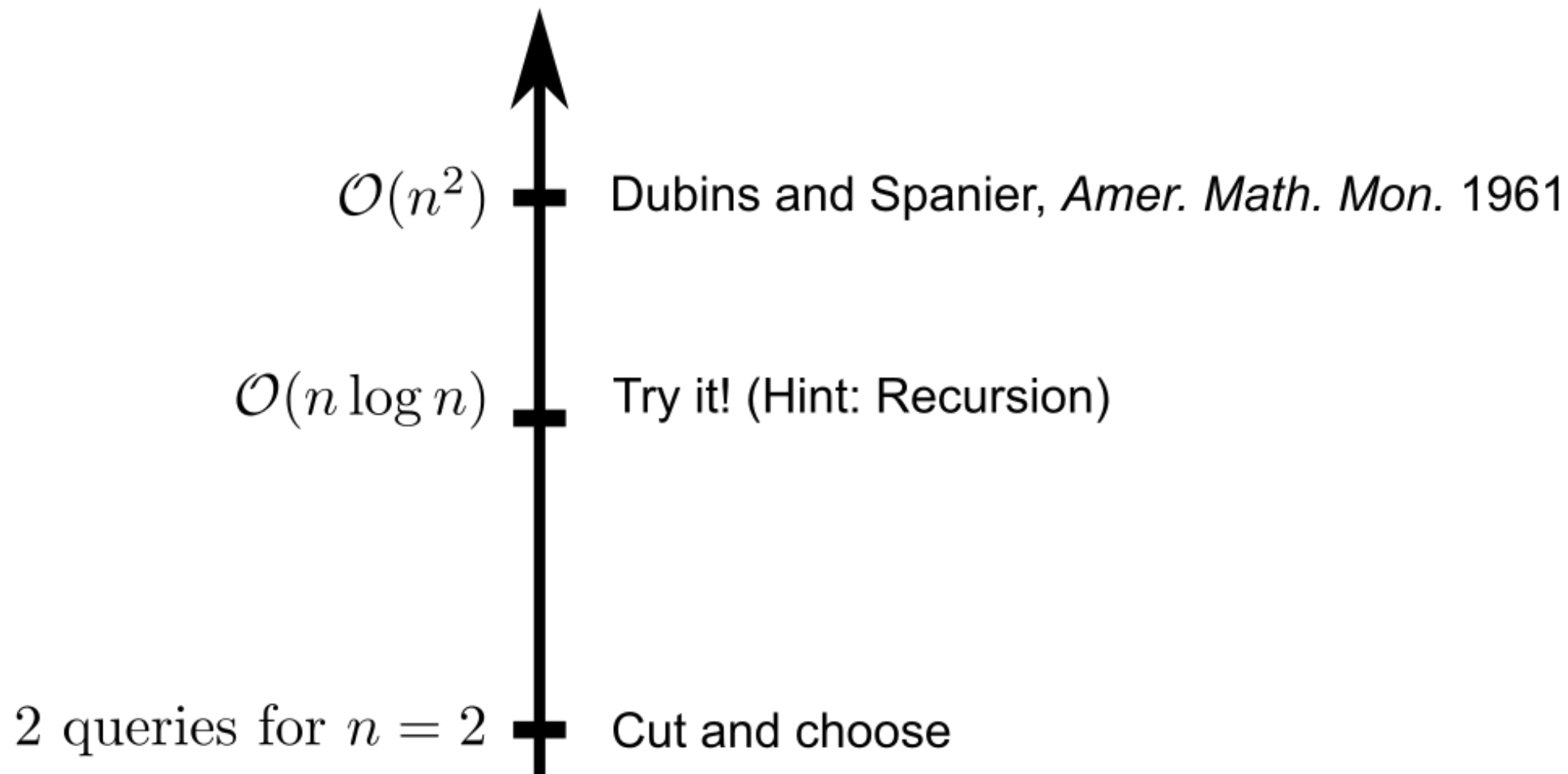
Dubins and Spanier, *Amer. Math. Mon.* 1961

2 queries for  $n = 2$

Cut and choose

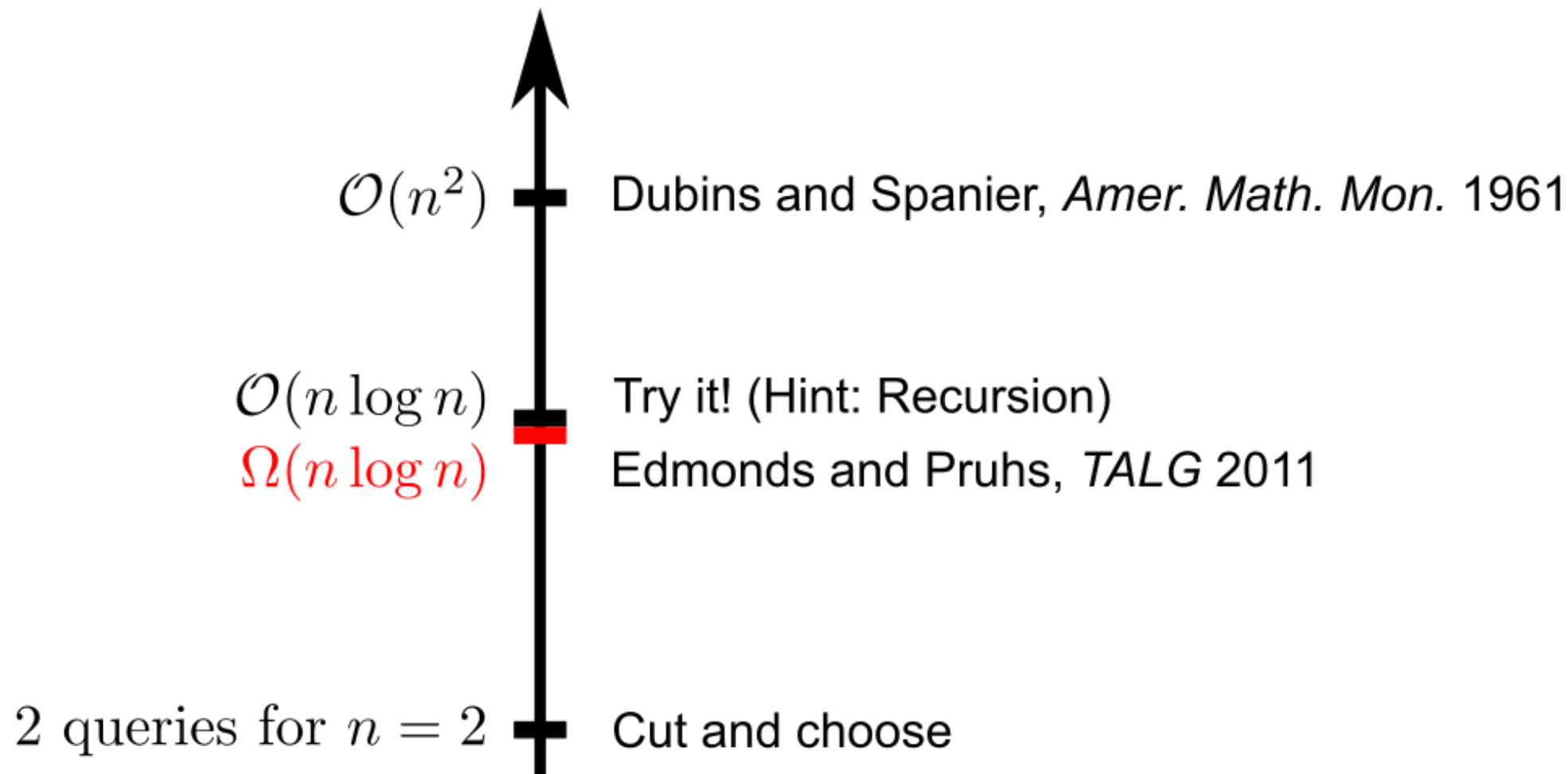
# The Story of Proportionality

query complexity



# The Story of Proportionality

query complexity





# The Story of Envy-freeness



# Selfridge-Conway Procedure

An envy-free cake division protocol for three agents

Envy-free for three

# Envy-free for three

A



B

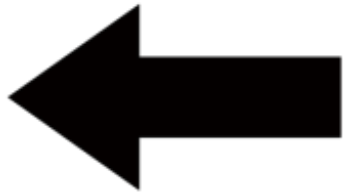


C



# Envy-free for three

A



B



C



# Envy-free for three

A



B



C



# Envy-free for three

A

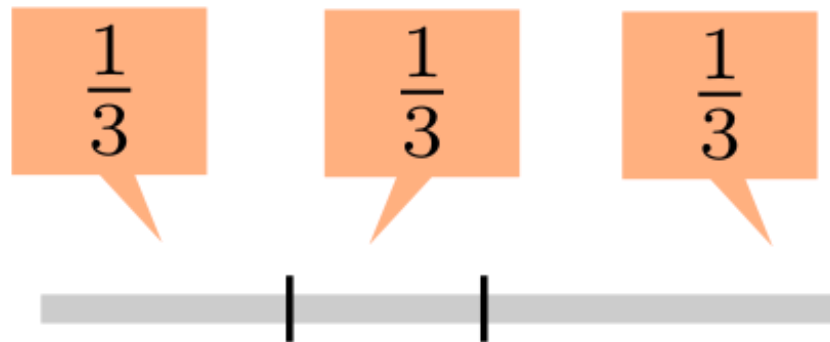


equal in  
my view

B



C



# Envy-free for three

A



B



C





# Envy-free for three

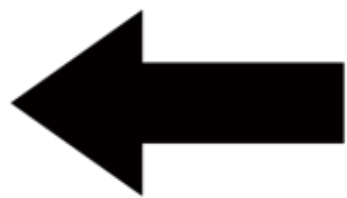
A



B



C



# Envy-free for three

A



B



two-way  
tie

C



# Envy-free for three

A



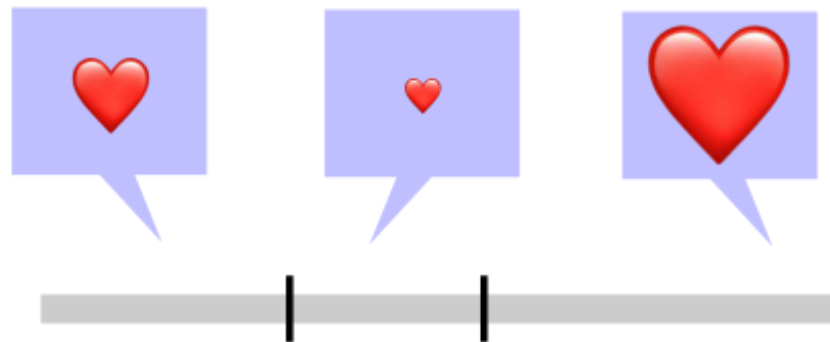
B



C



two-way  
tie



# Envy-free for three

A

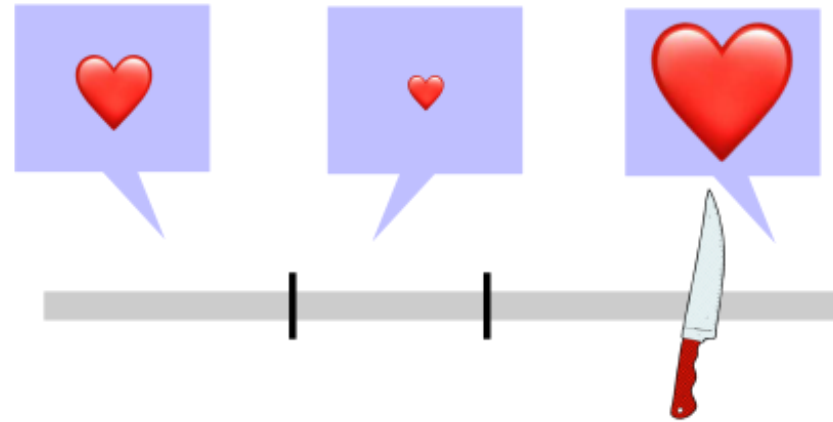


B



two-way  
tie

C



# Envy-free for three

A

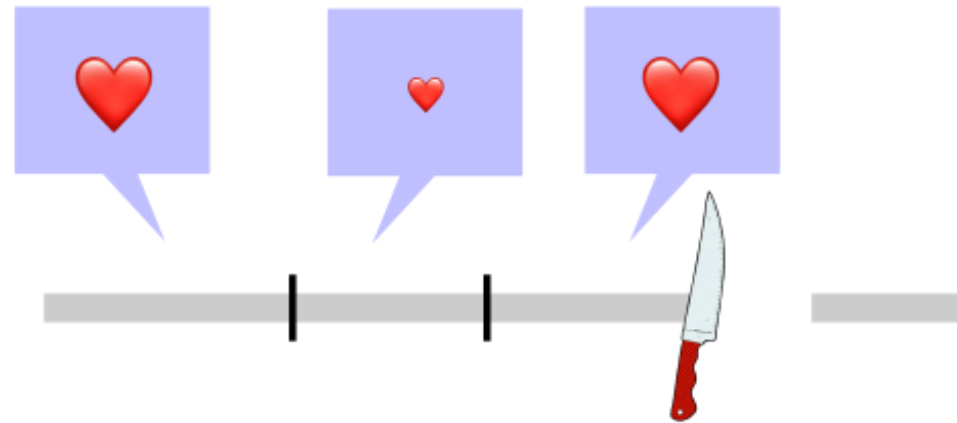


B



two-way  
tie

C



# Envy-free for three

A

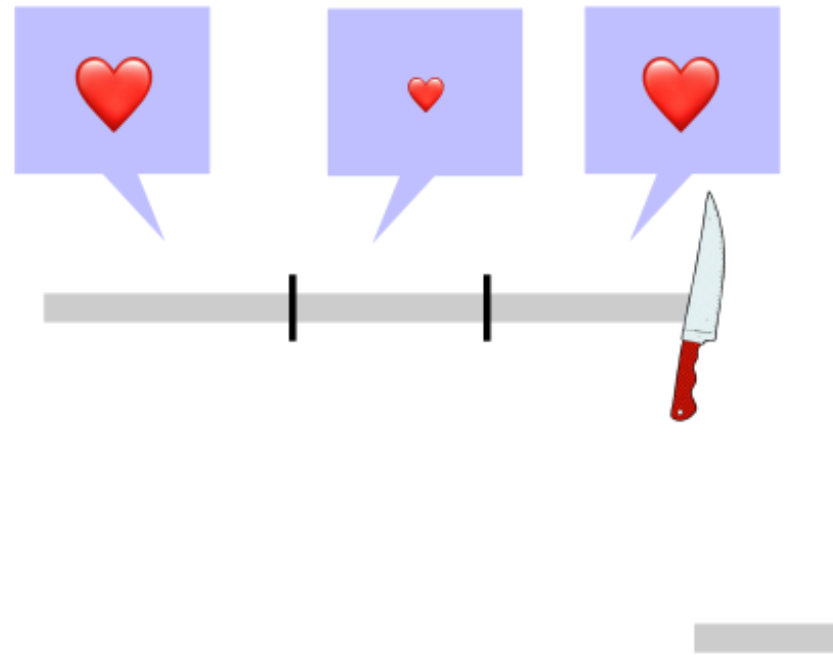


B



two-way  
tie

C



# Envy-free for three

A

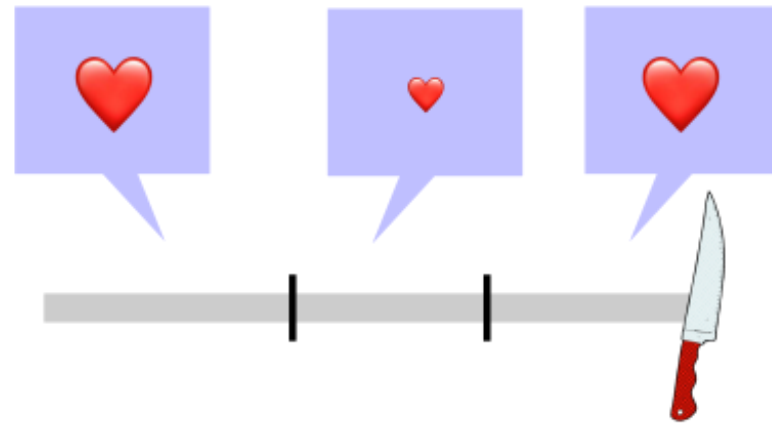


B



two-way tie

C



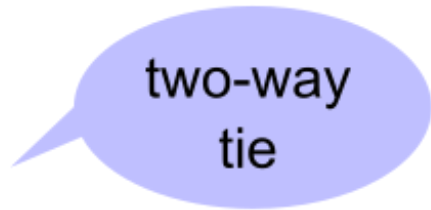
Trimmings

# Envy-free for three

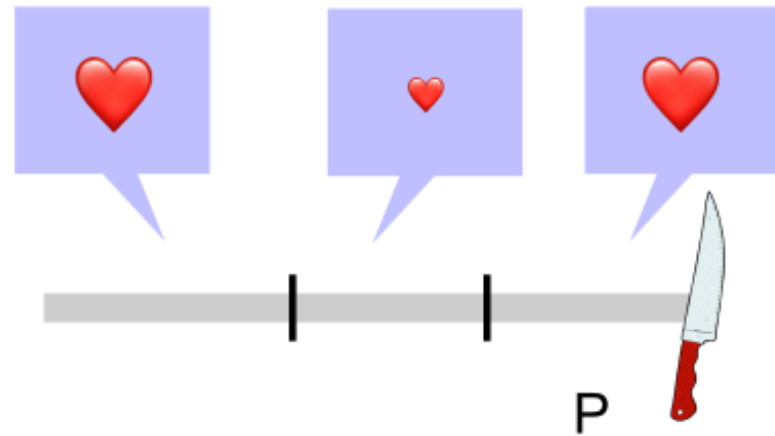
A



B



C



Trimmings



# Envy-free for three

A



B



C



P



Trimmings

# Envy-free for three

A



B



C



1<sup>st</sup>



Trimmings

# Envy-free for three

A



B



2<sup>nd</sup>

C



1<sup>st</sup>



Trimmings

# Envy-free for three

A



3<sup>rd</sup>

B



2<sup>nd</sup>

C



1<sup>st</sup>



Trimmings

# Envy-free for three

A



3<sup>rd</sup>

B



2<sup>nd</sup>

I pick P if C doesn't

C



1<sup>st</sup>



Trimmings

# Envy-free for three

A



3<sup>rd</sup>

B



2<sup>nd</sup>

I pick P if C doesn't

C



1<sup>st</sup>



Trimmings

# Envy-free for three

A



3<sup>rd</sup>

B



2<sup>nd</sup>

I pick P if C doesn't

C



1<sup>st</sup>



Trimmings

# Envy-free for three

A



3<sup>rd</sup>

B



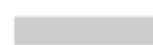
2<sup>nd</sup>

I pick P if C doesn't

C



1<sup>st</sup>



Trimmings



# Envy-free for three

A



EF because  
of equal cuts

B



EF because  
of two-way tie

C



EF because  
I picked first



Trimmings

# Envy-free for three

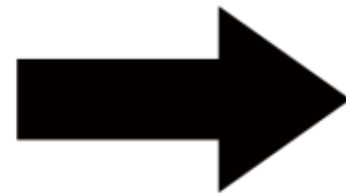
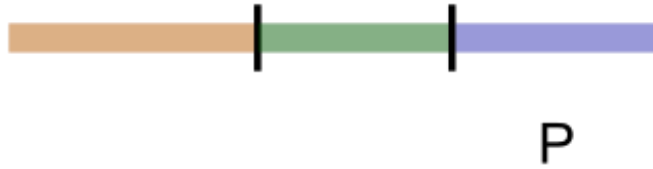
A



B



C



Trimmings

# Envy-free for three

A



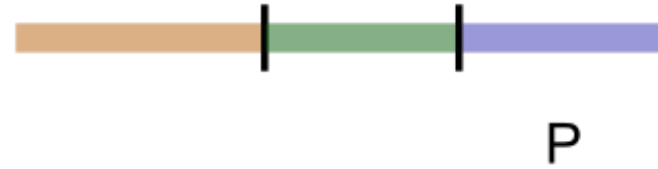
B



C



I equidivide



Trimmings

# Envy-free for three

A



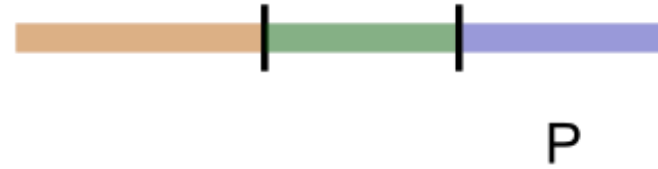
B



C



I equidivide



# Envy-free for three

A



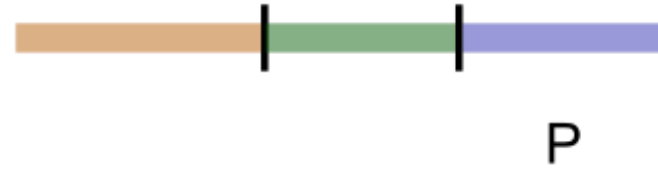
B



C



I equidivide



Trimmings

# Envy-free for three

A



B

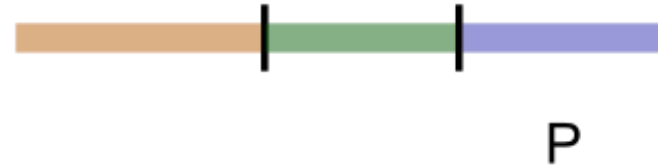


I pick first  
yay!

C



I equidivide



P



Trimmings

# Envy-free for three

A



I can pick after B does

B



I pick first yay!

C



I equidivide



 Trimmings

# Envy-free for three

A



I can pick after B does

B



I pick first yay!

C



I equidivide and pick last



 Trimmings



# Envy-free for three

A



I can pick after B does

B



I pick first yay!

C



I equidivide and pick last



 Trimmings

# Envy-free for three

A



I can pick after B does

B



I pick first yay!

C



I equidivide and pick last



 Trimmings

# Envy-free for three

A



I can pick after B does

B



I pick first yay!

C



I equidivide and pick last



 Trimmings

# Envy-free for three

A



Irrevocable  
advantage

B



EF because  
I picked first

C



EF because  
I equidivided



P



Trimmings

# Exercise

How many queries does the three-person EF protocol require?

# The Story of Envy-freeness

# The Story of Envy-freeness

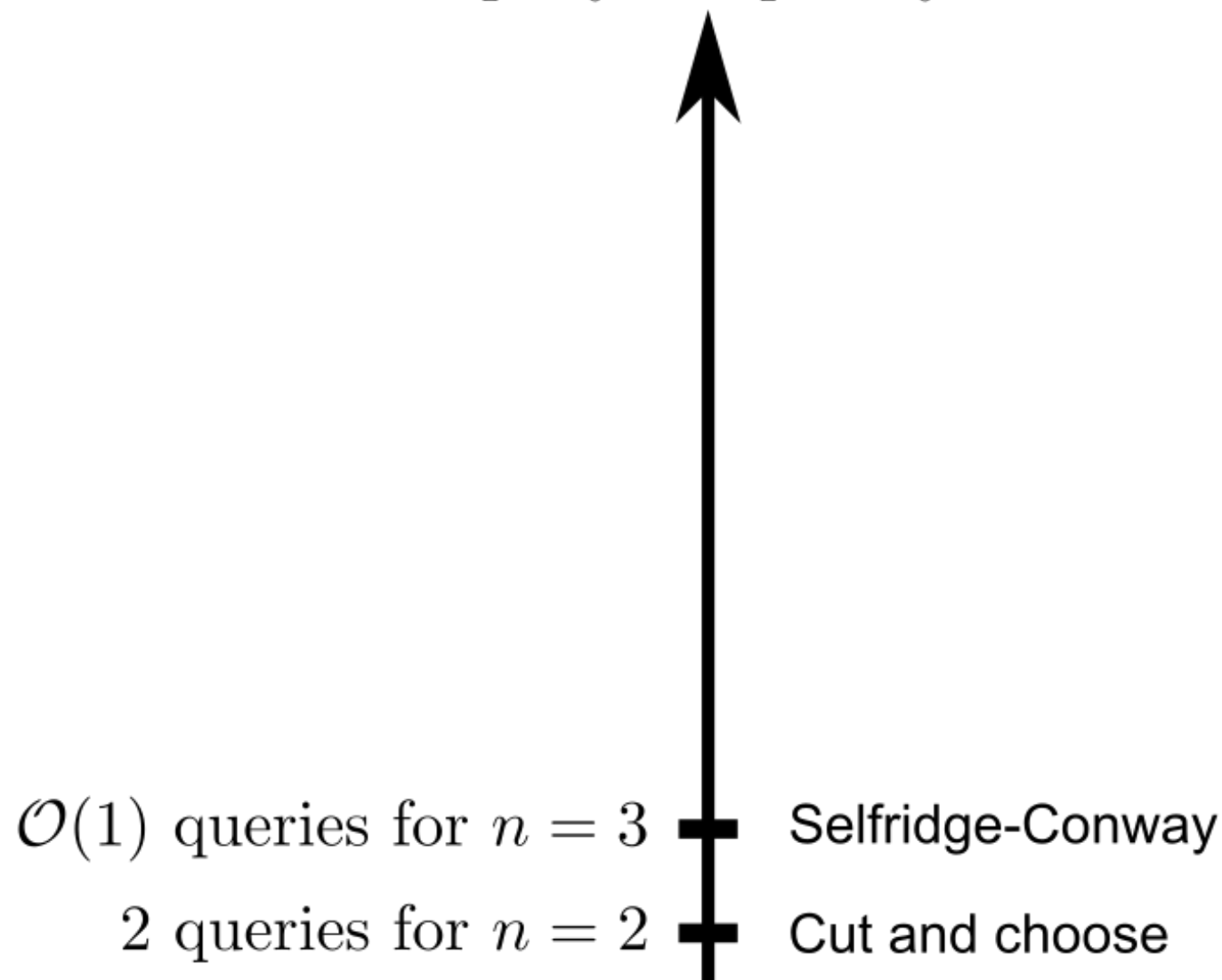
query complexity



2 queries for  $n = 2$   Cut and choose

# The Story of Envy-freeness

query complexity





# The Story of Envy-freeness

query complexity

A finite but *unbounded* protocol

Brams and Taylor, *Amer. Math. Mon.* 1995

$\mathcal{O}(1)$  queries for  $n = 3$

Selfridge-Conway

2 queries for  $n = 2$

Cut and choose



# The Story of Envy-freeness

query complexity

A finite but *unbounded* protocol

$$\mathcal{O}(n^{n^{n^{n^n}}})$$

Brams and Taylor, *Amer. Math. Mon.* 1995

Aziz and Mackenzie, *FOCS* 2016

$$\Omega(n^2)$$

Procaccia, *IJCAI* 2009

$\mathcal{O}(1)$  queries for  $n = 3$

Selfridge-Conway

2 queries for  $n = 2$

Cut and choose

# The Story of Envy-freeness

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Brams and Taylor, *Amer. Math. Mon.* 1995

$$\mathcal{O}(n^{n^{n^{n^n}}})$$

Aziz and Mackenzie, *FOCS* 2016

Open

$$\Omega(n^2)$$

Procaccia, *IJCAI* 2009

$\mathcal{O}(1)$  queries for  $n = 3$

Selfridge-Conway

2 queries for  $n = 2$

Cut and choose

# Next Time

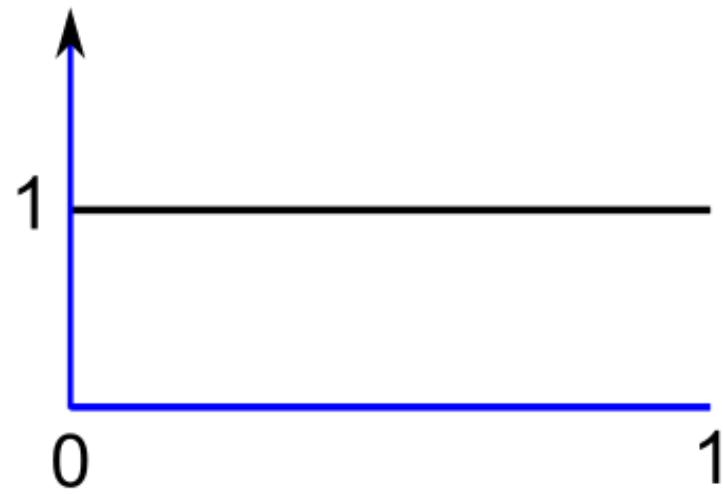
## Fair Division of Indivisible Items



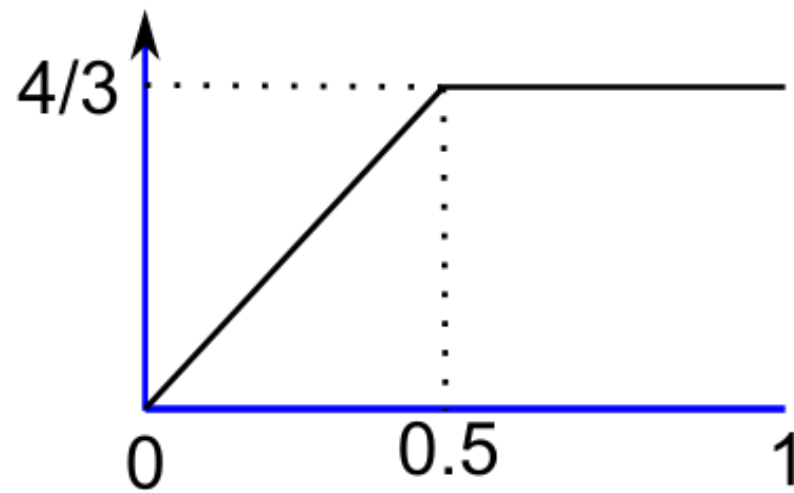
# Quiz

# Quiz

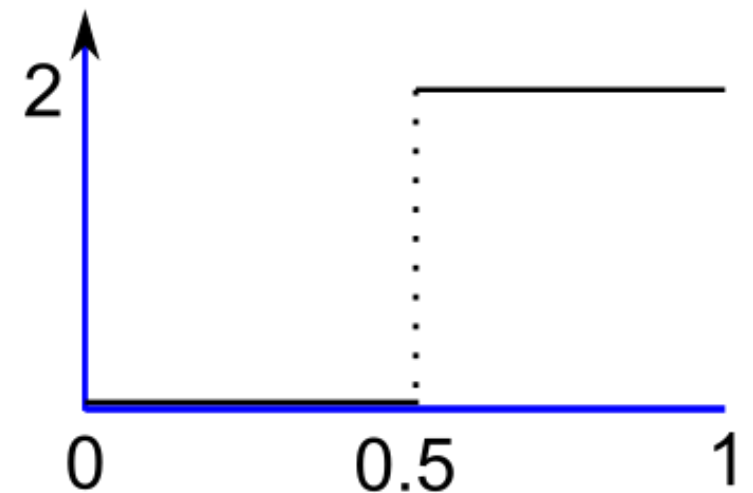
Consider a three-agent instance with the following value density functions:



agent 1



agent 2



agent 3

Identify any envy-free division in this instance.

# References

- Introduction to cake-cutting algorithms.

Ariel Procaccia

“*Cake Cutting Algorithms*”

Chapter 13 in Handbook of Computational Social Choice

- Lecture by Ariel Procaccia on “Cake cutting” in the *Optimized Democracy* course.

<https://sites.google.com/view/optdemocracy/schedule>





# Selfridge-Conway Procedure

Phase 1



# Selfridge-Conway Procedure

## Phase 1

1. Agent A divides the cake into three equal pieces (as per  $v_A$ ).

# Selfridge-Conway Procedure

## Phase 1

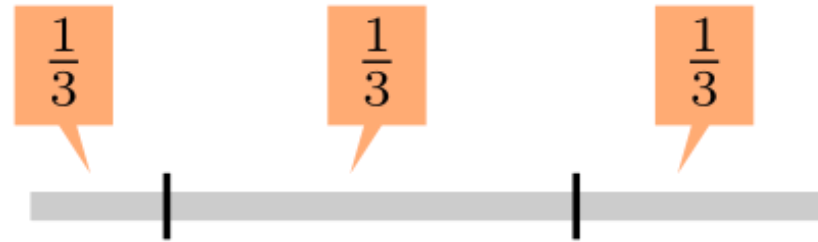
1. Agent A divides the cake into three equal pieces (as per  $v_A$ ).



# Selfridge-Conway Procedure

## Phase 1

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# Selfridge-Conway Procedure

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# Selfridge-Conway Procedure

## Phase 1

1. Agent A divides the cake into three equal pieces (as per  $v_A$ ).
2. Agent B trims its favorite piece to create a two-way tie with second-favorite.



# Selfridge-Conway Procedure

## Phase 1

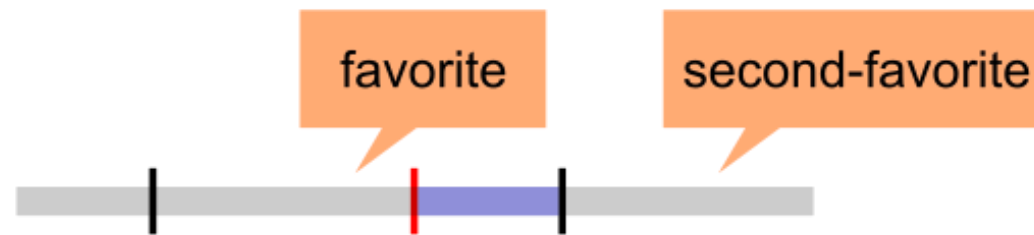
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  - Trimmings = S; Main cake M; Original cake = M  $\cup$  S



# Selfridge-Conway Procedure

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2. Agent B trims its favorite piece to create a two-way tie with second-favorite.
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# Selfridge-Conway Procedure

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  - Trimmings = S; Main cake M; Original cake = M ∪ S
3. Agent C, then B, then A, in that order, pick a piece each from main cake M.



# Selfridge-Conway Procedure

## Phase 1

1. Agent A divides the cake into three equal pieces (as per  $v_A$ ).
2. Agent B trims its favorite piece to create a two-way tie with second-favorite.
  - Trimmings = S; Main cake M; Original cake = M ∪ S
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  - Agent B must pick the trimmed piece if agent C does not.



# Selfridge-Conway Procedure

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1. Agent A divides the cake into three equal pieces (as per  $v_A$ ).
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  - Trimmings = S; Main cake M; Original cake = MUS
3. Agent C, then B, then A, in that order, pick a piece each from main cake M.
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# Selfridge-Conway Procedure

## Phase 1

1. Agent A divides the cake into three equal pieces (as per  $v_A$ ).
2. Agent B trims its favorite piece to create a two-way tie with second-favorite.
  - Trimmings = S; Main cake M; Original cake =  $M \cup S$
3. Agent C, then B, then A, in that order, pick a piece each from main cake M.
  - Agent B must pick the trimmed piece if agent C does not.

Let  $T$  = owner of the trimmed piece ( $T = B$  or  $C$ ); let  $T' = \{B, C\} \setminus T$ .



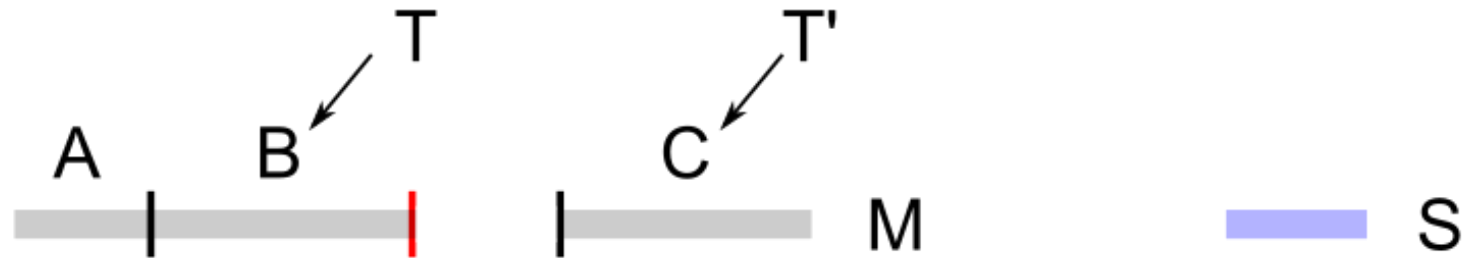


# Selfridge-Conway Procedure

## Phase 1

1. Agent A divides the cake into three equal pieces (as per  $v_A$ ).
2. Agent B trims its favorite piece to create a two-way tie with second-favorite.
  - Trimmings = S; Main cake M; Original cake =  $M \cup S$
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# Selfridge-Conway Procedure

## Phase 1

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2. Agent B trims its favorite piece to create a two-way tie with second-favorite.
  - Trimmings = S; Main cake M; Original cake =  $M \cup S$
3. Agent C, then B, then A, in that order, pick a piece each from main cake M.
  - Agent B must pick the trimmed piece if agent C does not.

Let  $T$  = owner of the trimmed piece ( $T = B$  or  $C$ ); let  $T' = \{B, C\} \setminus T$ .



# Selfridge-Conway Procedure

## Phase 1

1. Agent A divides the cake into three equal pieces (as per  $v_A$ ).
2. Agent B trims its favorite piece to create a two-way tie with second-favorite.
  - Trimmings = S; Main cake M; Original cake =  $M \cup S$
3. Agent C, then B, then A, in that order, pick a piece each from main cake M.
  - Agent B must pick the trimmed piece if agent C does not.

Let  $T$  = owner of the trimmed piece ( $T = B$  or  $C$ ); let  $T' = \{B, C\} \setminus T$ .



## Phase 2

# Selfridge-Conway Procedure

## Phase 1

1. Agent A divides the cake into three equal pieces (as per  $v_A$ ).
2. Agent B trims its favorite piece to create a two-way tie with second-favorite.
  - Trimmings = S; Main cake M; Original cake =  $M \cup S$
3. Agent C, then B, then A, in that order, pick a piece each from main cake M.
  - Agent B must pick the trimmed piece if agent C does not.

Let  $T$  = owner of the trimmed piece ( $T = B$  or  $C$ ); let  $T' = \{B, C\} \setminus T$ .



## Phase 2

4. Agent  $T'$  divides the trimmings S into three equal pieces (as per  $v_{T'}$ ).

# Selfridge-Conway Procedure

## Phase 1

1. Agent A divides the cake into three equal pieces (as per  $v_A$ ).
2. Agent B trims its favorite piece to create a two-way tie with second-favorite.
  - Trimmings = S; Main cake M; Original cake =  $M \cup S$
3. Agent C, then B, then A, in that order, pick a piece each from main cake M.
  - Agent B must pick the trimmed piece if agent C does not.

Let  $T$  = owner of the trimmed piece ( $T = B$  or  $C$ ); let  $T' = \{B, C\} \setminus T$ .



## Phase 2

4. Agent  $T'$  divides the trimmings S into three equal pieces (as per  $v_{T'}$ ).

# Selfridge-Conway Procedure

## Phase 1

1. Agent A divides the cake into three equal pieces (as per  $v_A$ ).
2. Agent B trims its favorite piece to create a two-way tie with second-favorite.
  - Trimmings = S; Main cake M; Original cake =  $M \cup S$
3. Agent C, then B, then A, in that order, pick a piece each from main cake M.
  - Agent B must pick the trimmed piece if agent C does not.

Let  $T$  = owner of the trimmed piece ( $T = B$  or  $C$ ); let  $T' = \{B, C\} \setminus T$ .



## Phase 2

4. Agent  $T'$  divides the trimmings S into three equal pieces (as per  $v_{T'}$ ).
5. Agent T, then A, then  $T'$ , in that order, pick a piece each from trimmings S.



# Selfridge-Conway Procedure

## Phase 1

1. Agent A divides the cake into three equal pieces (as per  $v_A$ ).
2. Agent B trims its favorite piece to create a two-way tie with second-favorite.
  - Trimmings = S; Main cake M; Original cake =  $M \cup S$
3. Agent C, then B, then A, in that order, pick a piece each from main cake M.
  - Agent B must pick the trimmed piece if agent C does not.

Let  $T$  = owner of the trimmed piece ( $T = B$  or  $C$ ); let  $T' = \{B, C\} \setminus T$ .



## Phase 2

4. Agent  $T'$  divides the trimmings  $S$  into three equal pieces (as per  $v_{T'}$ ).
5. Agent  $T$ , then  $A$ , then  $T'$ , in that order, pick a piece each from trimmings  $S$ .

# Selfridge-Conway Procedure





# Selfridge-Conway Procedure

- Is any part of the cake left unassigned in the final allocation?



# Selfridge-Conway Procedure

- Is any part of the cake left unassigned in the final allocation? No.



# Selfridge-Conway Procedure

- Is the final allocation envy-free from agent C's perspective?



# Selfridge-Conway Procedure

- Is the final allocation envy-free from agent C's perspective? Yes.



# Selfridge-Conway Procedure

- Is the final allocation envy-free from agent C's perspective? Yes.
  - Within the main cake M, C does not envy A or B because it chooses first.



# Selfridge-Conway Procedure

- Is the final allocation envy-free from agent C's perspective? Yes.
  - Within the main cake M, C does not envy A or B because it chooses first.
  - Within the trimmings S, C does not envy A or B because:



# Selfridge-Conway Procedure

- **Is the final allocation envy-free from agent C's perspective?** Yes.
  - Within the main cake M, C does not envy A or B because it chooses first.
  - Within the trimmings S, C does not envy A or B because:
    - If C is T, then it chooses first in S.



# Selfridge-Conway Procedure

- **Is the final allocation envy-free from agent C's perspective?** Yes.
  - Within the main cake M, C does not envy A or B because it chooses first.
  - Within the trimmings S, C does not envy A or B because:
    - If C is T, then it chooses first in S.
    - If C is T', then it divides S into three equal pieces.





# Selfridge-Conway Procedure

- **Is the final allocation envy-free from agent C's perspective?** Yes.
  - Within the main cake  $M$ , C does not envy A or B because it chooses first.
  - Within the trimmings  $S$ , C does not envy A or B because:
    - If C is T, then it chooses first in  $S$ .
    - If C is T', then it divides  $S$  into three equal pieces.
  - By additivity across  $M \cup S$ , C does not envy A or B w.r.t. the entire cake.



# Selfridge-Conway Procedure

- Is the final allocation envy-free from agent B's perspective?



# Selfridge-Conway Procedure

- Is the final allocation envy-free from agent B's perspective? Yes.



# Selfridge-Conway Procedure

- Is the final allocation envy-free from agent B's perspective? Yes.
  - Within the main cake M, B does not envy A or C because of two-way tie.



# Selfridge-Conway Procedure

- Is the final allocation envy-free from agent B's perspective? Yes.
  - Within the main cake M, B does not envy A or C because of two-way tie.
  - Within the trimmings S, B does not envy A or C because:



# Selfridge-Conway Procedure

- Is the final allocation envy-free from agent B's perspective? Yes.
  - Within the main cake M, B does not envy A or C because of two-way tie.
  - Within the trimmings S, B does not envy A or C because:
    - If B is T, then it chooses first in S.



# Selfridge-Conway Procedure

- **Is the final allocation envy-free from agent B's perspective?** Yes.
  - Within the main cake M, B does not envy A or C because of two-way tie.
  - Within the trimmings S, B does not envy A or C because:
    - If B is T, then it chooses first in S.
    - If B is T', then it cuts S into three equal pieces.



# Selfridge-Conway Procedure

- **Is the final allocation envy-free from agent B's perspective?** Yes.
  - Within the main cake  $M$ , B does not envy A or C because of two-way tie.
  - Within the trimmings  $S$ , B does not envy A or C because:
    - If B is  $T$ , then it chooses first in  $S$ .
    - If B is  $T'$ , then it cuts  $S$  into three equal pieces.
  - By additivity across  $M \cup S$ , B does not envy A or C w.r.t. the entire cake.





# Selfridge-Conway Procedure

- Is the final allocation envy-free from agent A's perspective?



# Selfridge-Conway Procedure

- Is the final allocation envy-free from agent A's perspective? Yes.



# Selfridge-Conway Procedure

- Is the final allocation envy-free from agent A's perspective? Yes.
  - Within the main cake M, A does not envy B or C because it was the cutter and it never gets the trimmed piece.



# Selfridge-Conway Procedure

- **Is the final allocation envy-free from agent A's perspective?** Yes.
  - Within the main cake M, A does not envy B or C because it was the cutter and it never gets the trimmed piece.
  - Within the trimmings S, A does not envy:



# Selfridge-Conway Procedure

- **Is the final allocation envy-free from agent A's perspective?** Yes.
  - Within the main cake M, A does not envy B or C because it was the cutter and it never gets the trimmed piece.
  - Within the trimmings S, A does not envy:
    - T' because it picks before T' does.



# Selfridge-Conway Procedure

- **Is the final allocation envy-free from agent A's perspective?** Yes.
  - Within the main cake M, A does not envy B or C because it was the cutter and it never gets the trimmed piece.
  - Within the trimmings S, A does not envy:
    - T' because it picks before T' does.
    - T because of "irrevocable advantage" from Phase 1.



# Selfridge-Conway Procedure

- **Is the final allocation envy-free from agent A's perspective?** Yes.
  - Within the main cake  $M$ , A does not envy B or C because it was the cutter and it never gets the trimmed piece.
  - Within the trimmings  $S$ , A does not envy:
    - T' because it picks before T' does.
    - T because of "irrevocable advantage" from Phase 1.
  - By additivity across  $M \cup S$ , A does not envy B or C w.r.t. the entire cake.



