

Bidding Games on Graphs: In Theory and in Practice

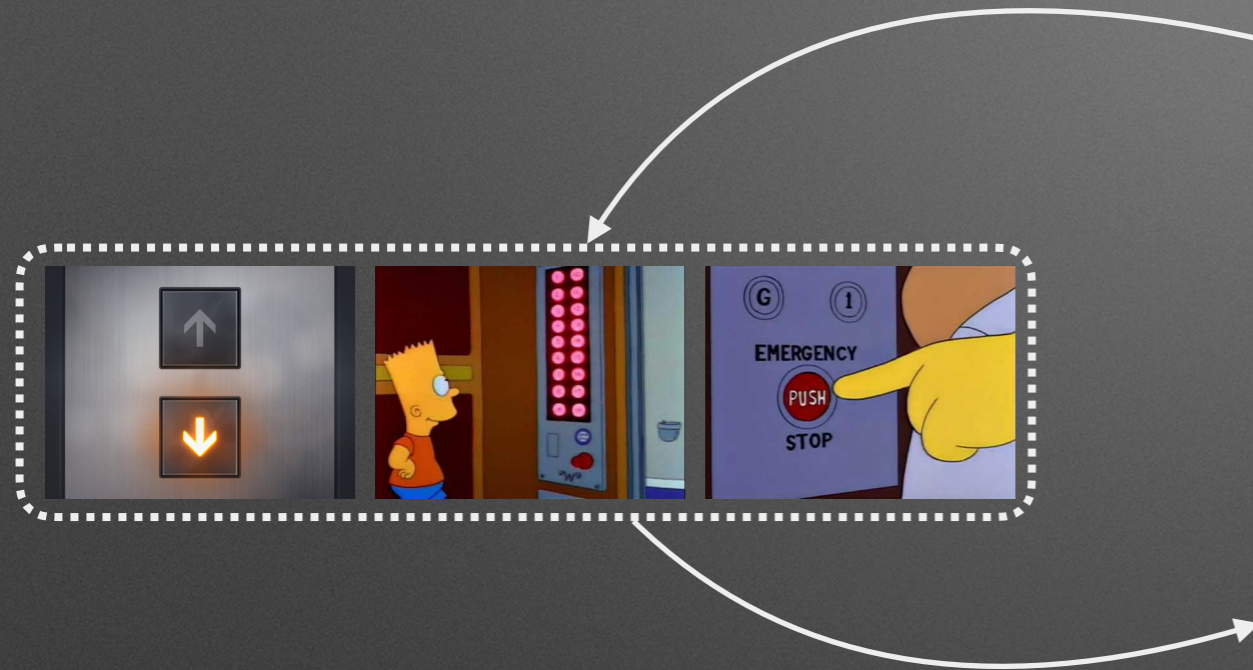
Suman Sadhukhan¹

Talk at IARCS Verification Seminar

March 19, 2024

Work in collaboration with Guy Avni¹ and Kaushik Mallik²
¹University of Haifa, ²IST Austria

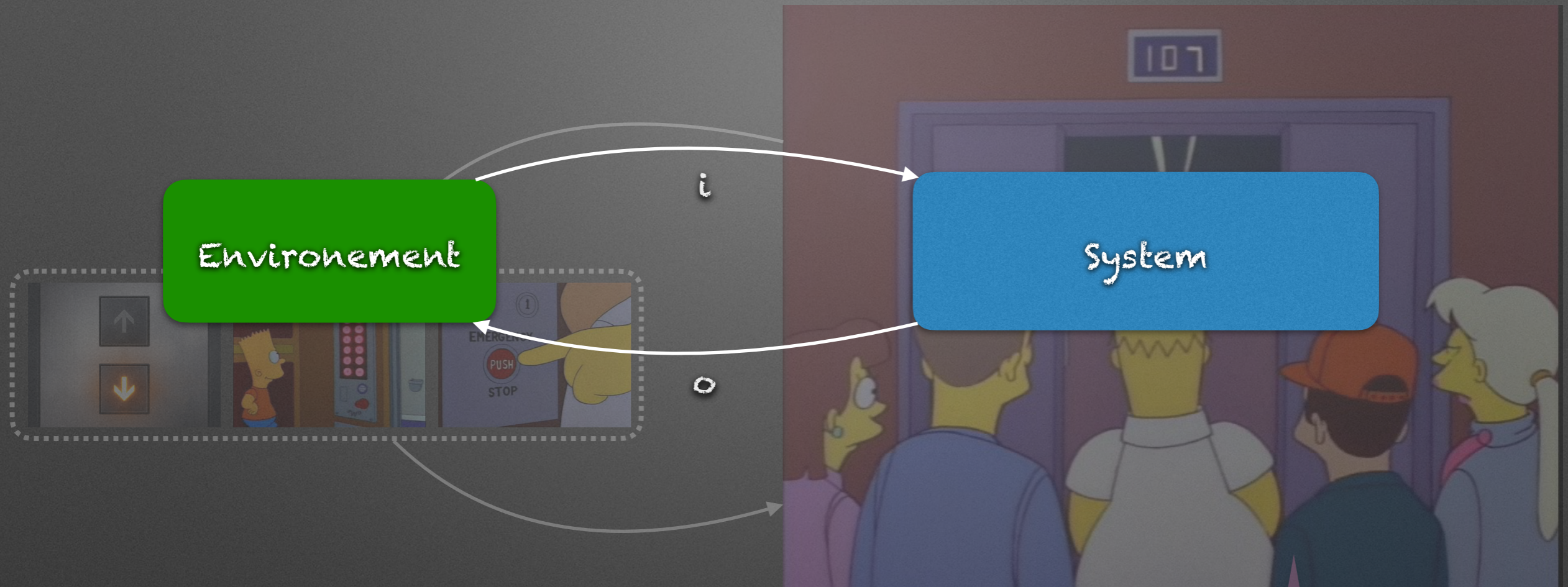
Games in Formal Verification



- Door opens iff the lift is at the correct level
- Stops when someone calls **EMERGENCY!!**

....

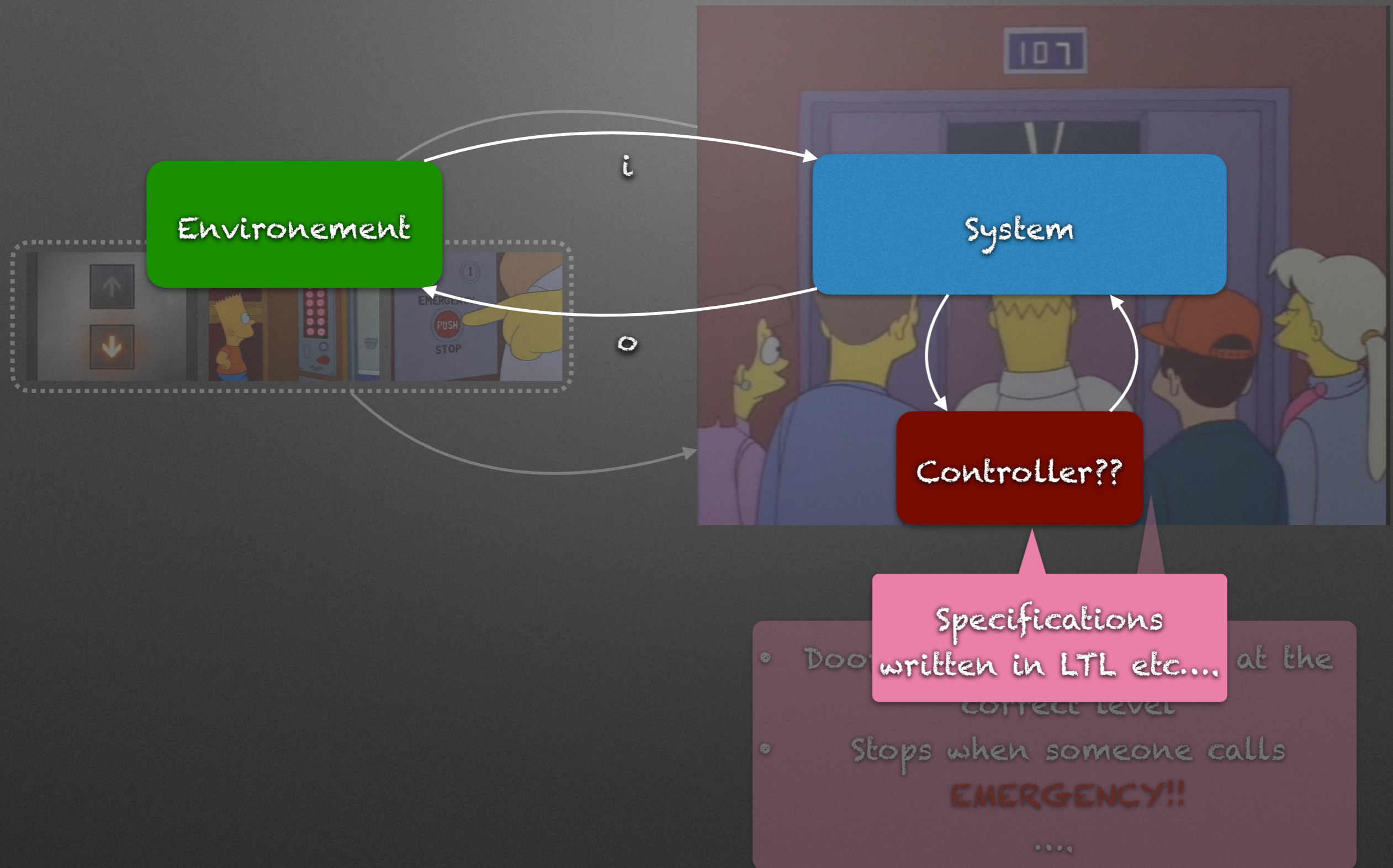
Games in Formal Verification



- Door opens iff the lift is at the correct level
- Stops when someone calls **EMERGENCY!!**

....

Games in Formal Verification



Games in Formal Verification

Environnement

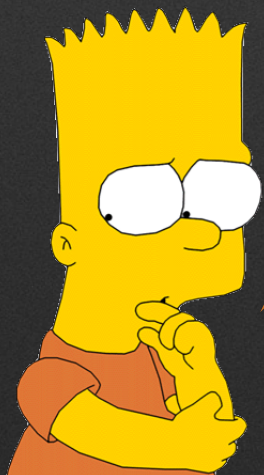
System

Controller??

Given a model of interactions with the environment, and a specification that the system needs to satisfy, does there exist a controller who can guarantee that?

Specifications

- Door written in LTL etc.... at the correct level
- Stops when someone calls EMERGENCY!!



Games in Formal Verification

Environnement

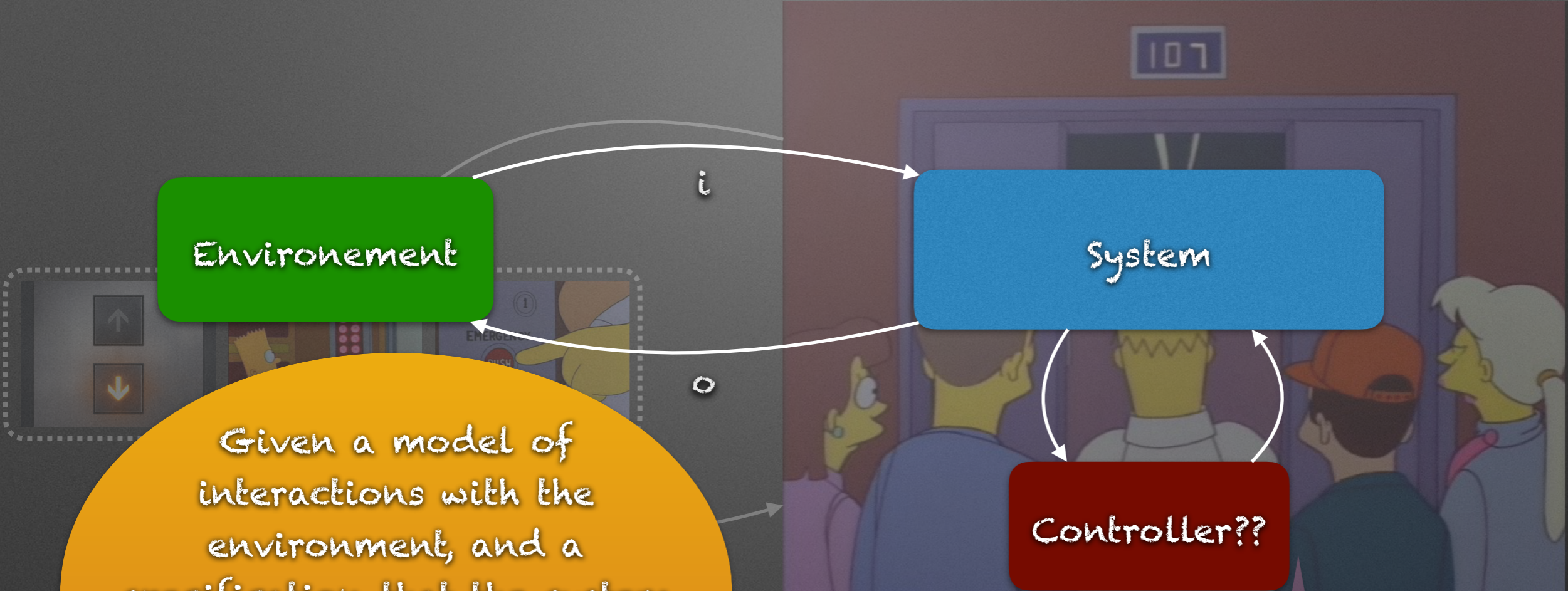
System

Controller??

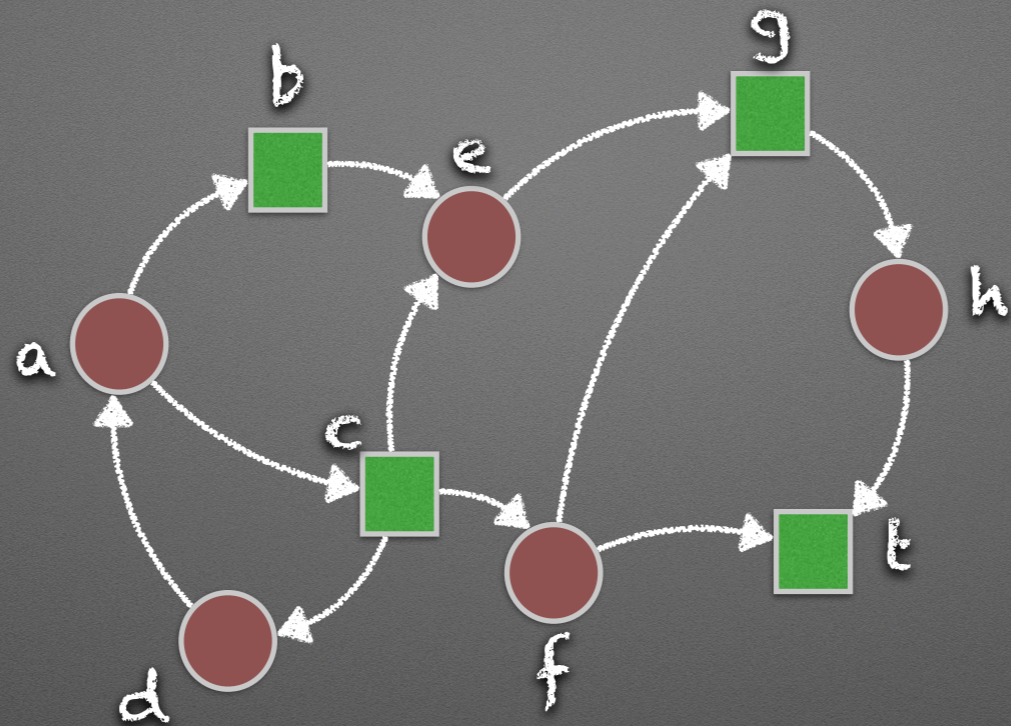
Given a model of interactions with the environment, and a specification that the system needs to satisfy, does there exist a controller who can guarantee that?

Specifications written in LTL etc....

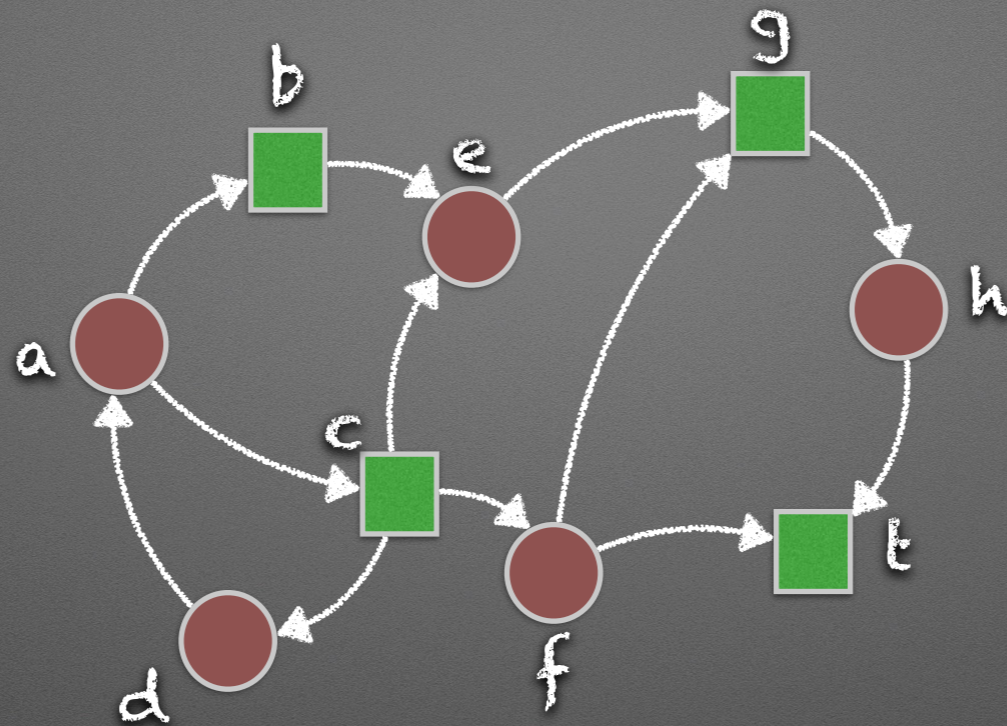
We construct a two-player zero-sum game which models the interactions, encode specs in winning conditions, and
Winning strategy == correct-by-design controller



Background: Turn-based Graph Games



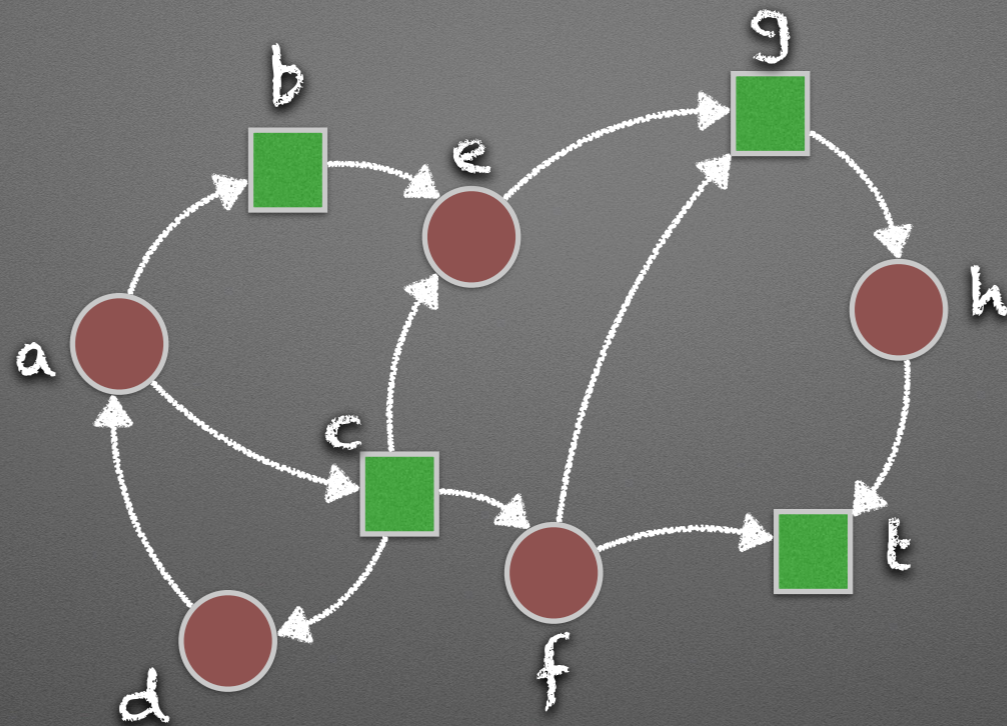
Background: Turn-based Graph Games



Background: Turn-based Graph Games

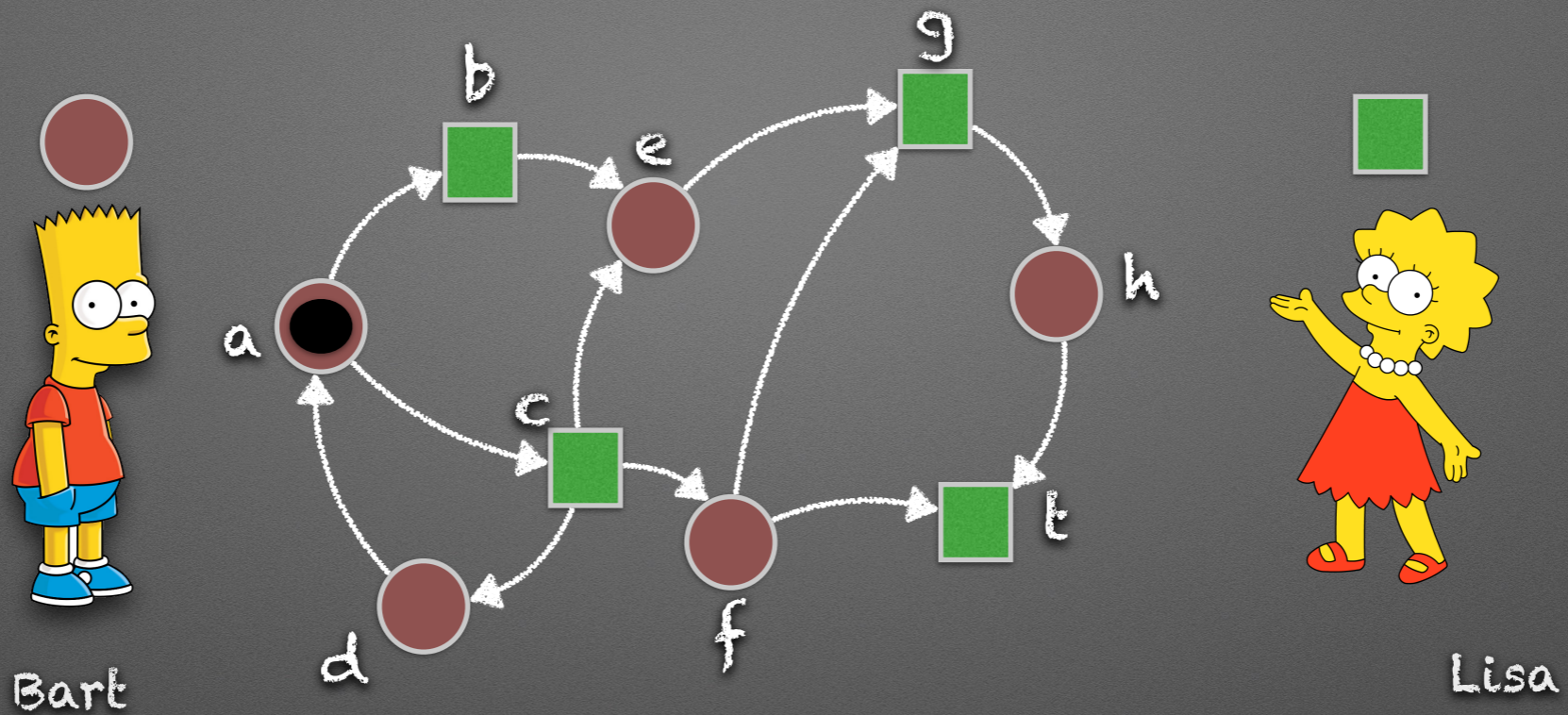


Bart



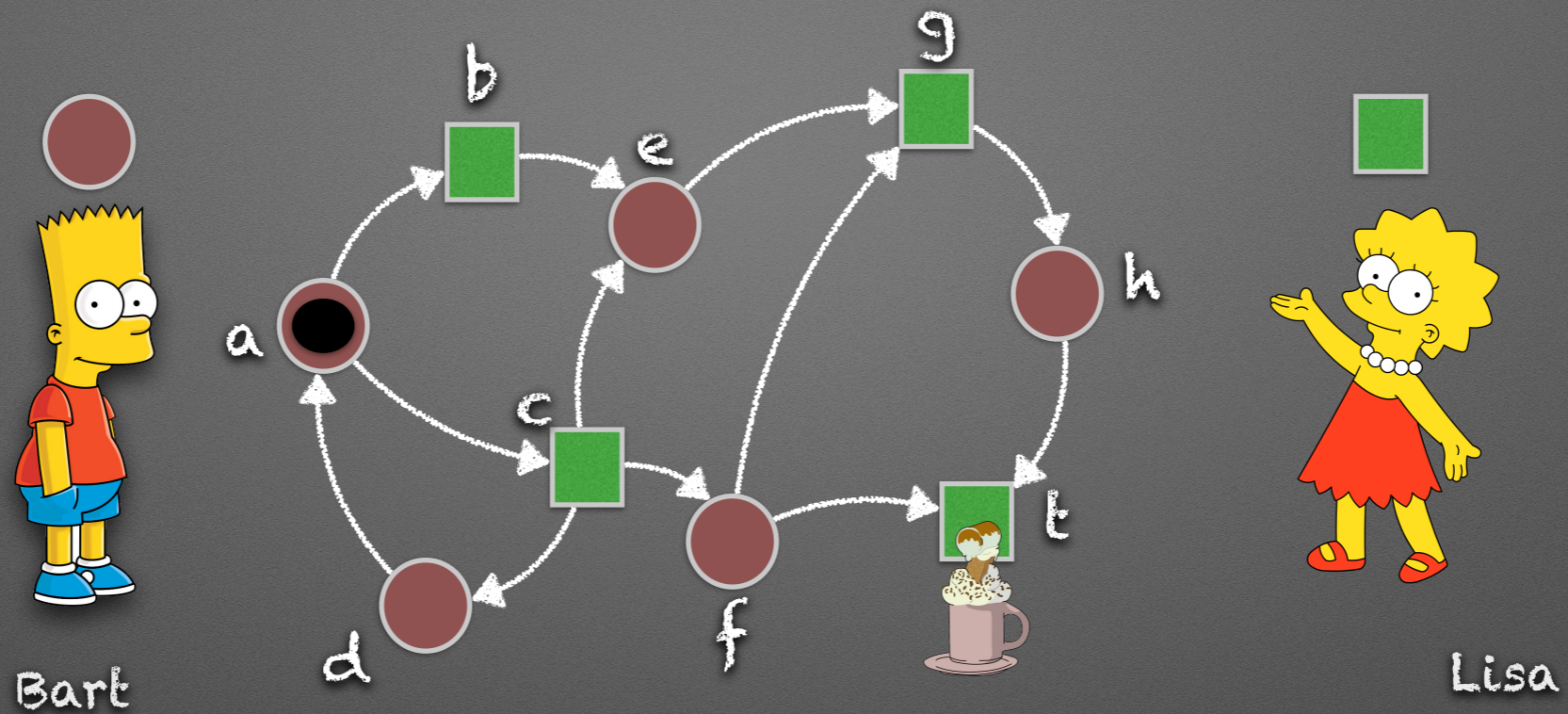
Lisa

Background: Turn-based Graph Games



Turn-based: Players alternate turns in moving the token

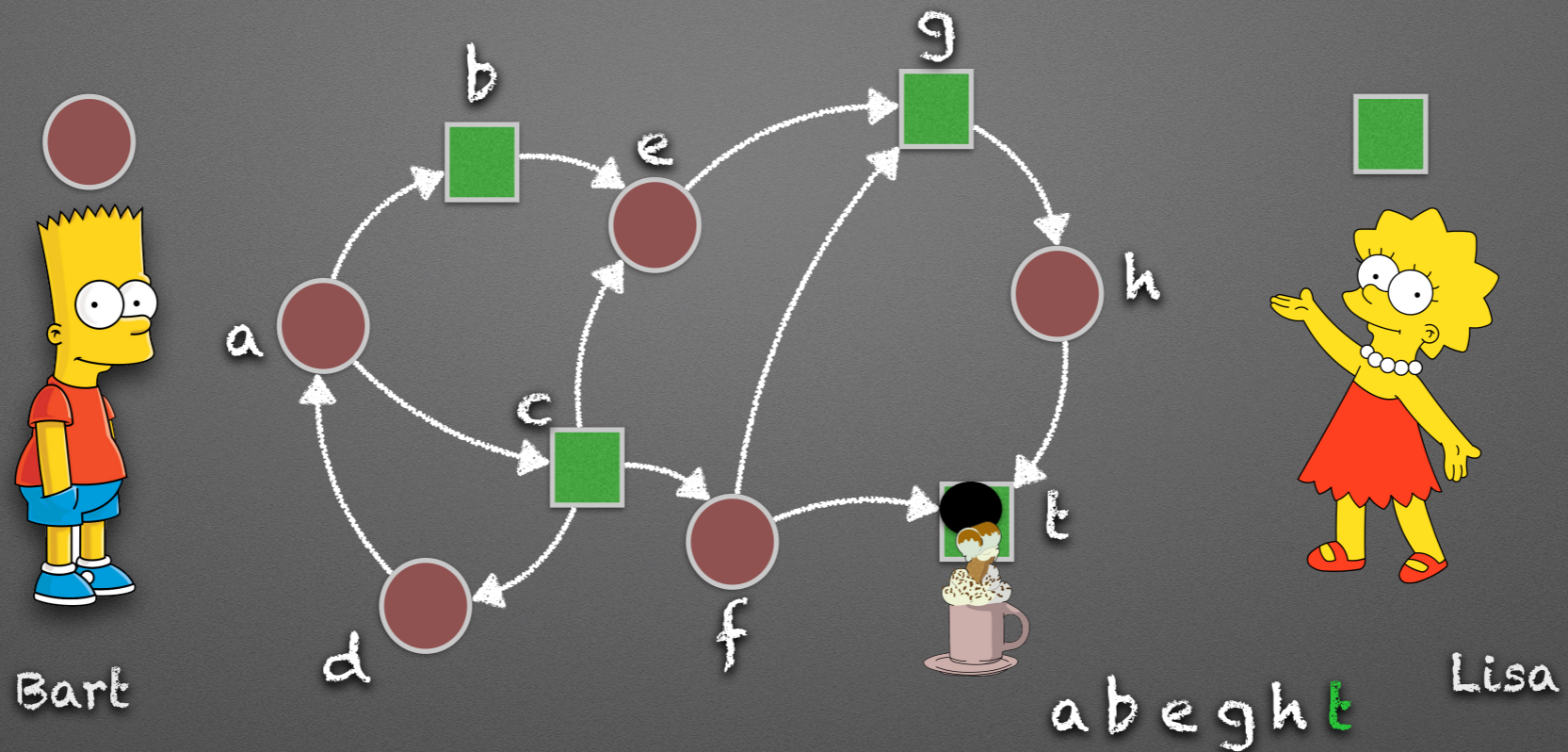
Background: Turn-based Graph Games



Turn-based: Players alternate turns in moving the token



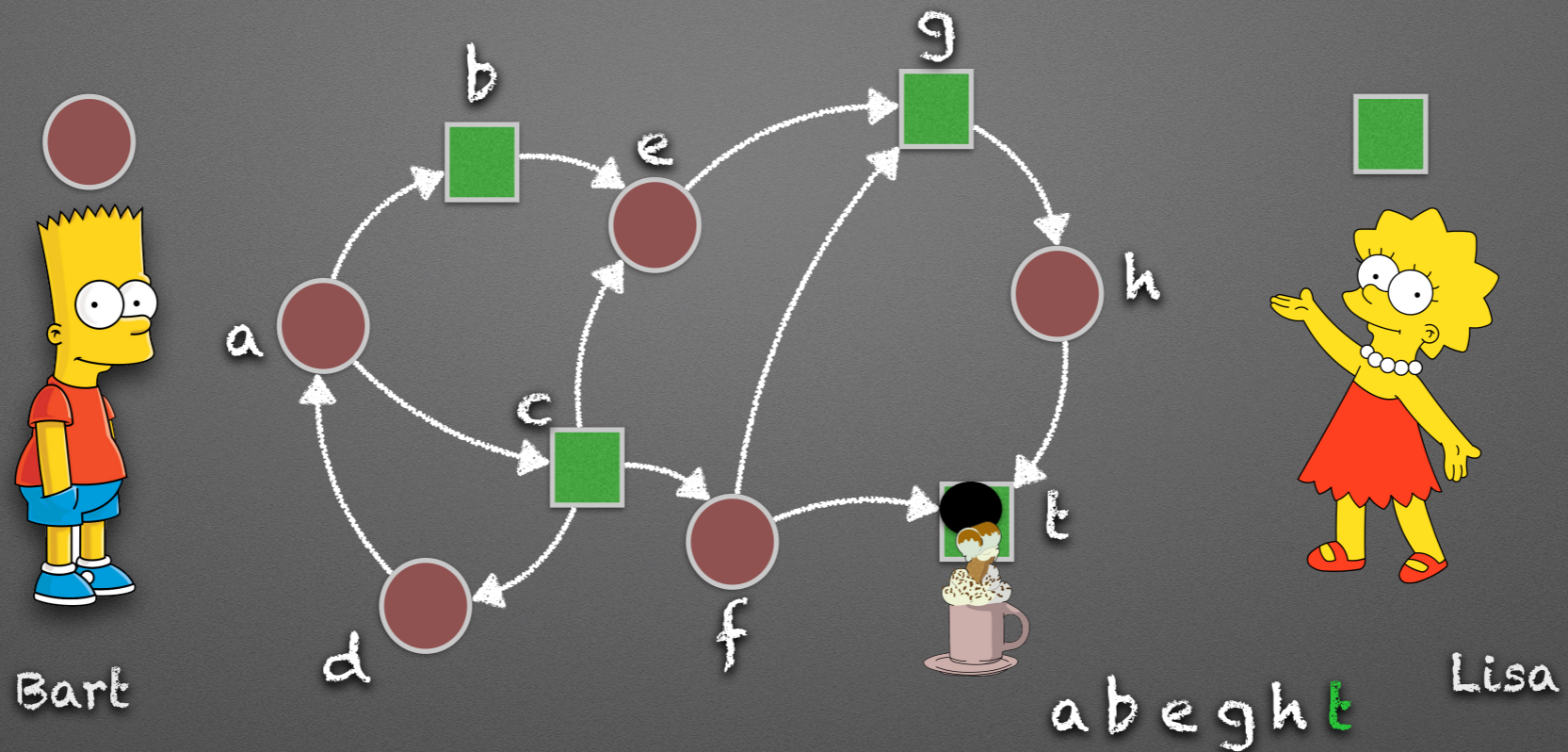
Background: Turn-based Graph Games



Turn-based: Players alternate turns in moving the token



Background: Turn-based Graph Games

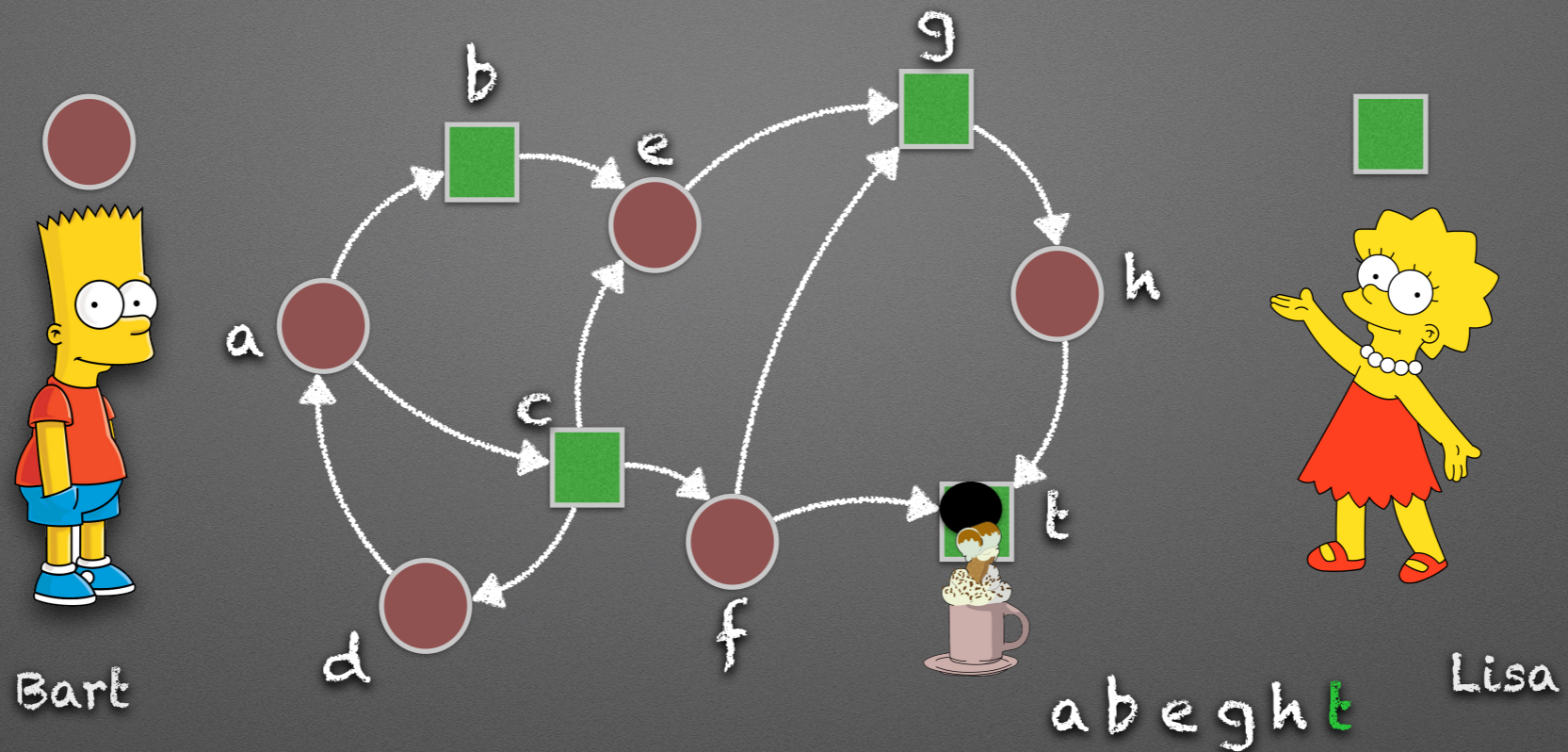


Turn-based: Players alternate turns in moving the token

Winning Conditions: Reachability, Buchi, Parity



Background: Turn-based Graph Games



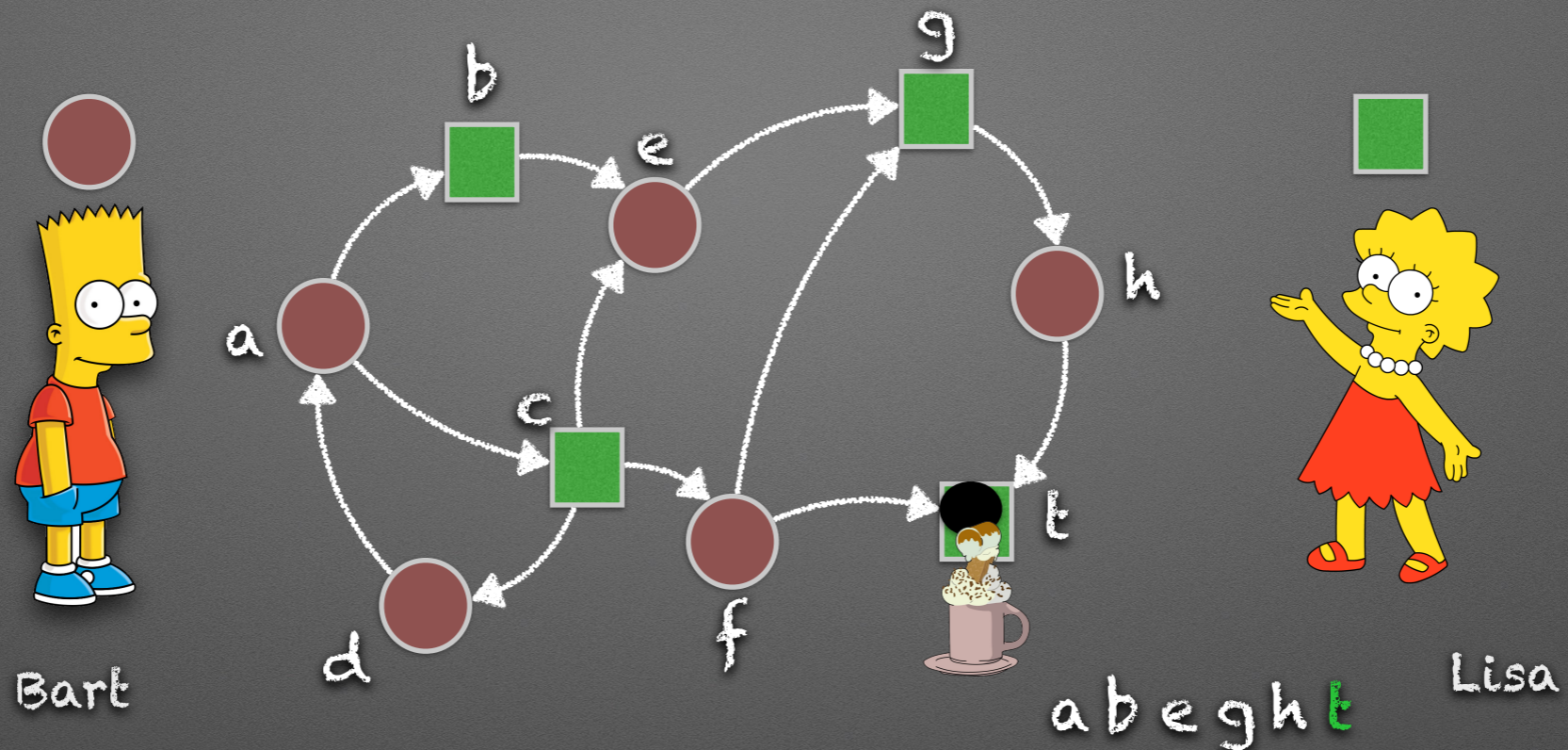
Turn-based: Players alternate turns in moving the token

Winning Conditions: Reachability, Buchi, Parity

Zero-sum games: Every infinite play has a winner



Background: Turn-based Graph Games



Turn-based: Players alternate turns in moving the token

Winning Conditions: Reachability, Buchi, Parity

Zero-sum games: Every infinite play has a winner

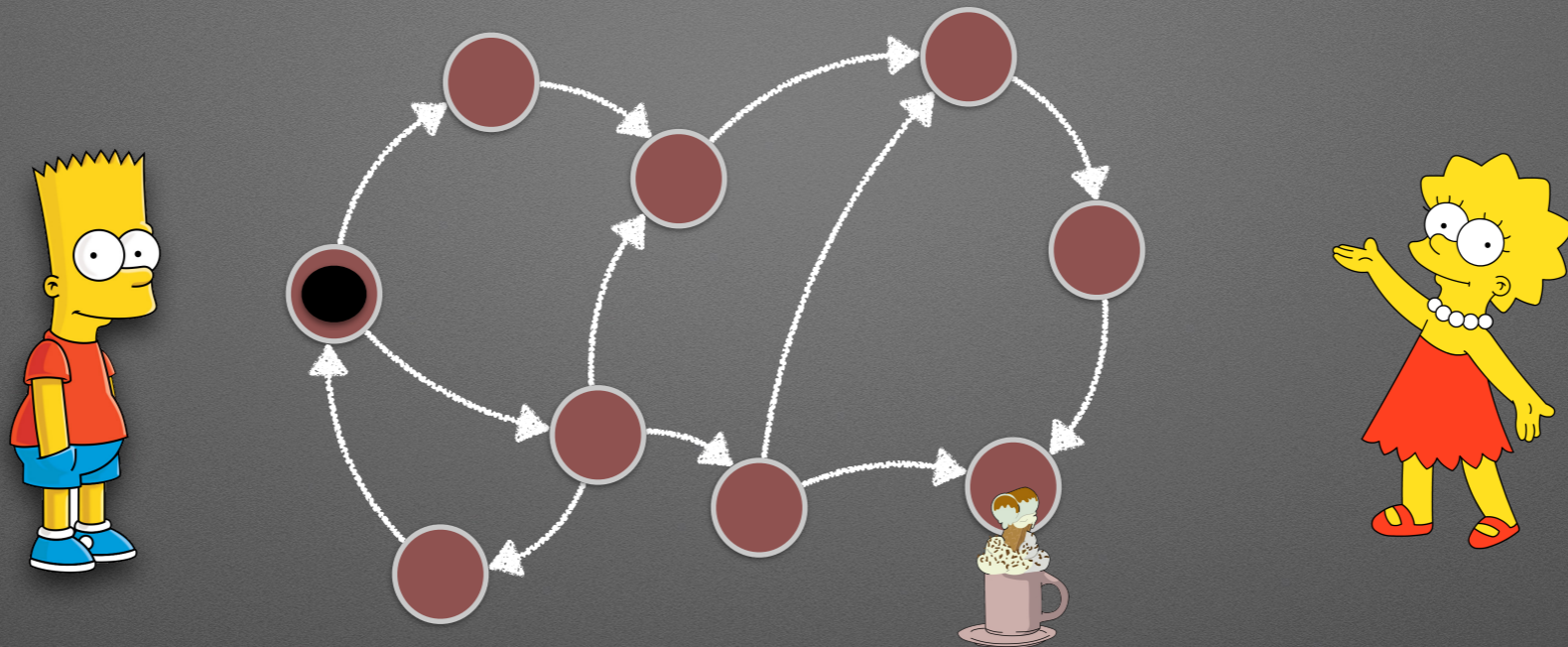


Decision Problem:

Input: A game graph \mathcal{G} , a winning condition \mathcal{W} for Bart, and initial configuration (vertex) v .

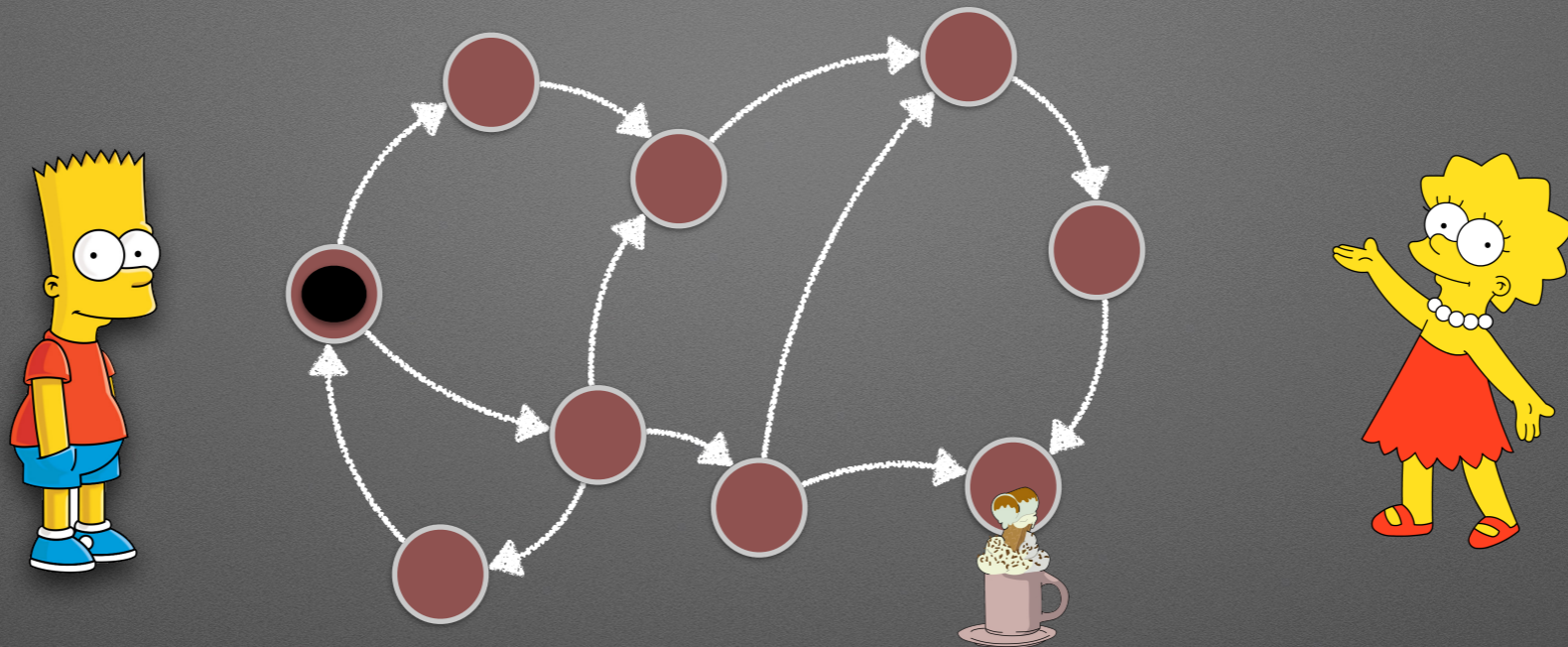
Output: **Yes**, iff Bart has a winning strategy for \mathcal{W} from v in \mathcal{G}

Bidding Games on Graphs



Graph Games: Two-player zero-sum infinite-duration games

Bidding Games on Graphs

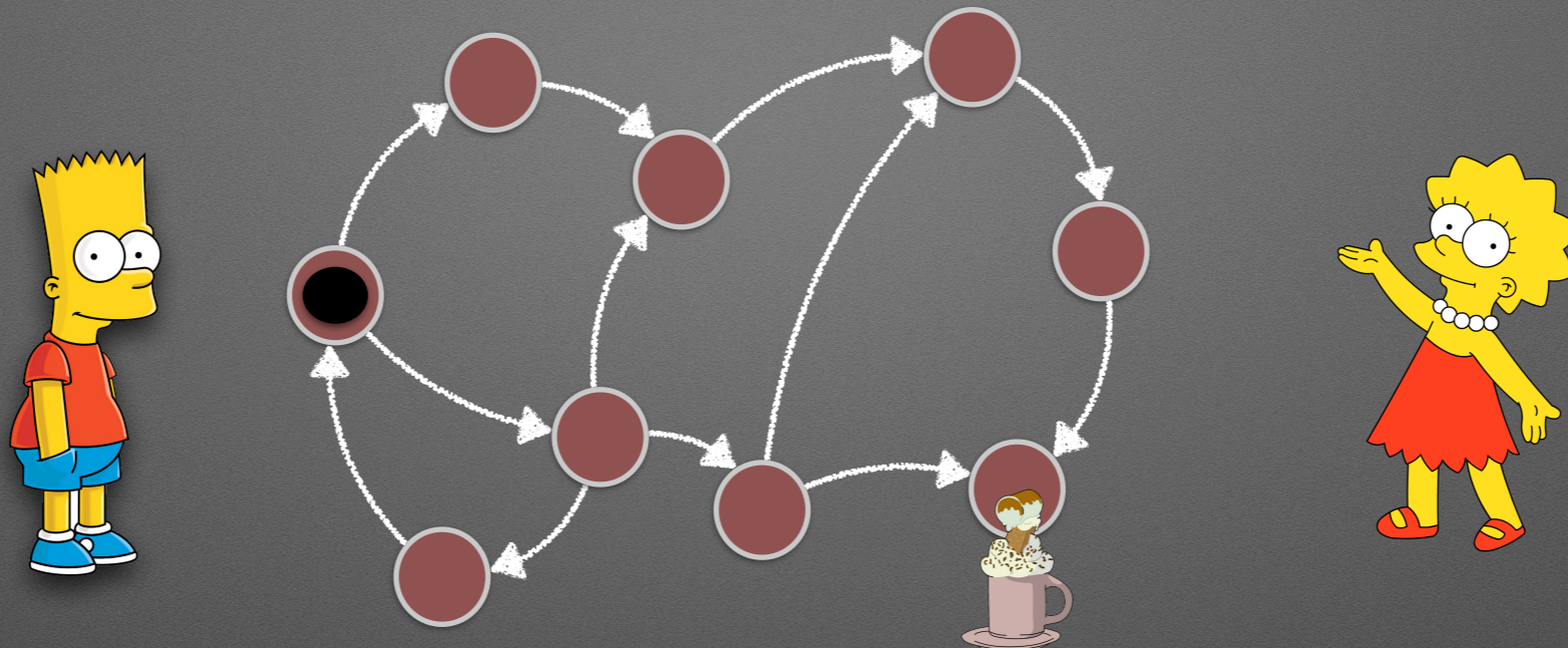


Graph Games: Two-player zero-sum infinite-duration games

Both players have budgets
In each turn, each
player bids for getting
the turn to move the
token



Bidding Games on Graphs



Graph Games: Two-player zero-sum infinite-duration games

Both players have budgets
In each turn, each
player bids for getting
the turn to move the
token

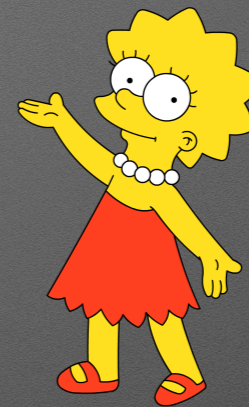
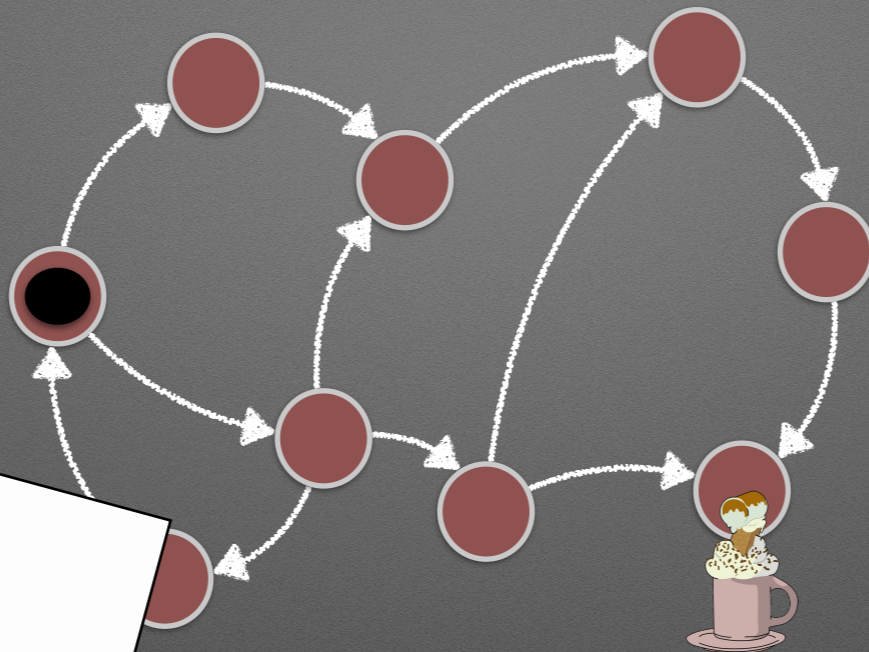


Decision Problem:

Input: A game graph \mathcal{G} , a winning condition \mathcal{W} for Bart, and initial configuration (vertex+budget) c .

Output: **Yes**, iff Bart has a winning strategy for \mathcal{W} from c in \mathcal{G}

Bidding Games on Graphs



player zero-sum infinite-duration games

Both players have budgets
 In each turn, each
 player bids for getting
 the turn to move the
 token



Decision Problem:

graph \mathcal{G} , a winning condition \mathcal{W} for Bart, and initial
 vertex+budget) c .

Bart has a winning strategy for \mathcal{W} from c in \mathcal{G}

Richman Games

ANDREW J. LAZARUS, DANIEL E. LOEB,
 JAMES G. PROPP, AND DANIEL ULLMAN

Dedicated to David Richman, 1956–1991

Games and Economic Behavior 27, 229–264 (1999)
 Article ID game.1998.0676, available online at <http://www.idealibrary.com> on IDEAL®

Combinatorial Games under Auction Play*

Andrew J. Lazarus[†]
 Berkeley, California 94705

Daniel E. Loeb[‡]

Daniel H. Wagner Associates, Malvern, Pennsylvania 19355

James G. Propp[§]

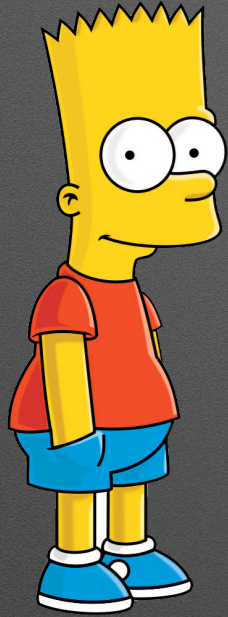
University of Wisconsin, Madison, Wisconsin 53706

Walter R. Stromquist[¶]

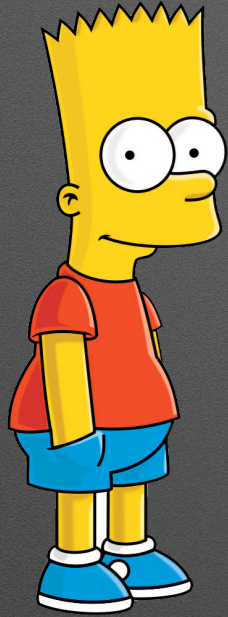
Berwyn, Pennsylvania 19312

and

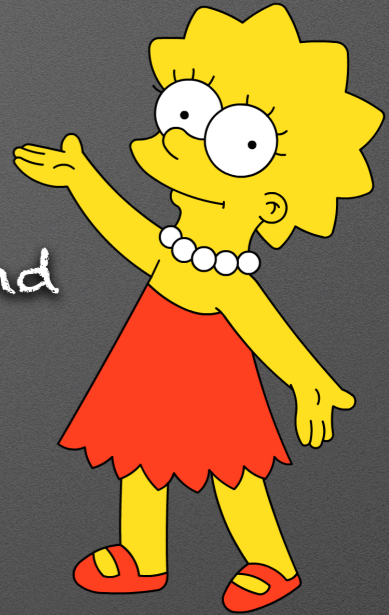
Bidding Mechanisms



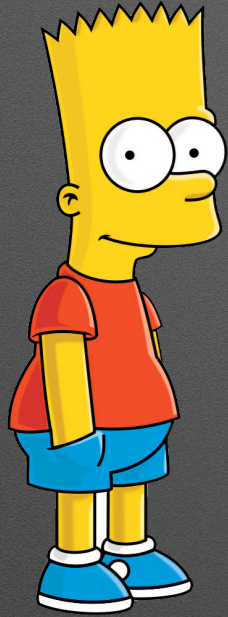
Bidding Mechanisms



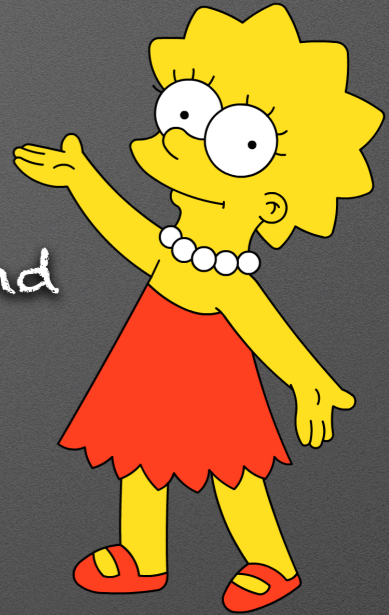
In each turn, both players simultaneously submit "legal" bids, and the higher bidder moves the token.



Bidding Mechanisms



In each turn, both players simultaneously submit "legal" bids, and the higher bidder moves the token.

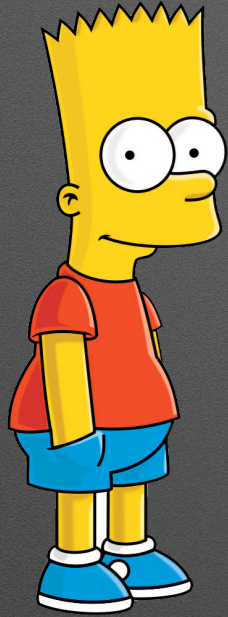


Who pays?

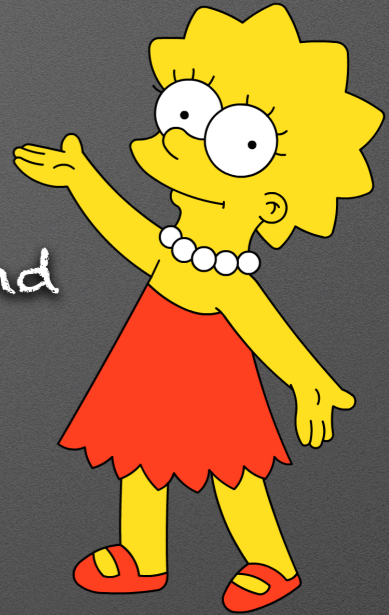
Where?

What?

Bidding Mechanisms



In each turn, both players simultaneously submit "legal" bids, and the higher bidder moves the token.



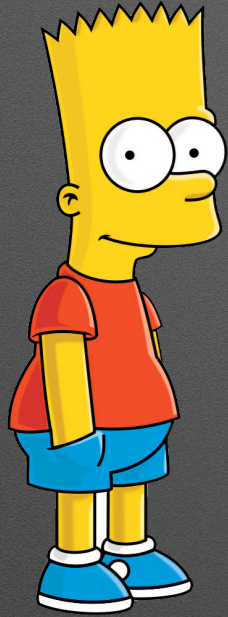
Who pays?

Where?

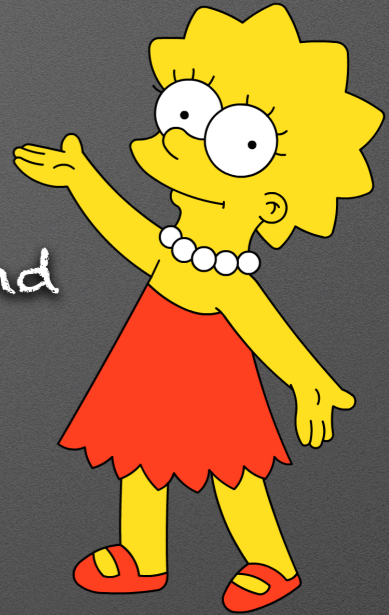
What?

{ first-price, all-pay }

Bidding Mechanisms



In each turn, both players simultaneously submit "legal" bids, and the higher bidder moves the token.

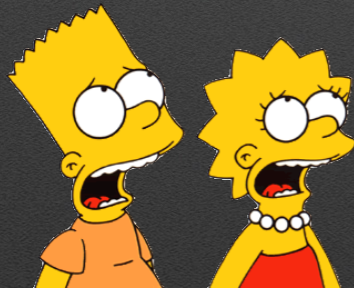


Who pays?

Where?

What?

{ first-price, all-pay }



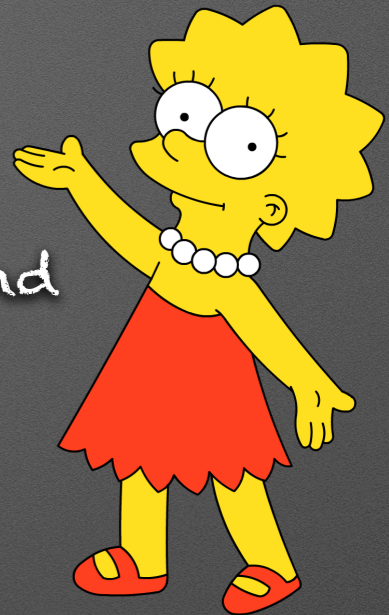
Higher bidder

Both

Bidding Mechanisms



In each turn, both players simultaneously submit "legal" bids, and the higher bidder moves the token.

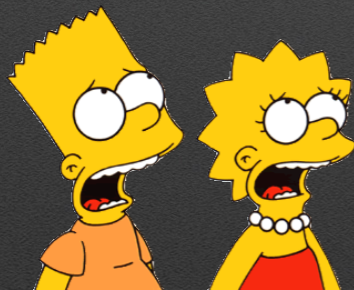


Who pays?

Where?

What?

{ first-price, all-pay } × { Richman, Poorman }



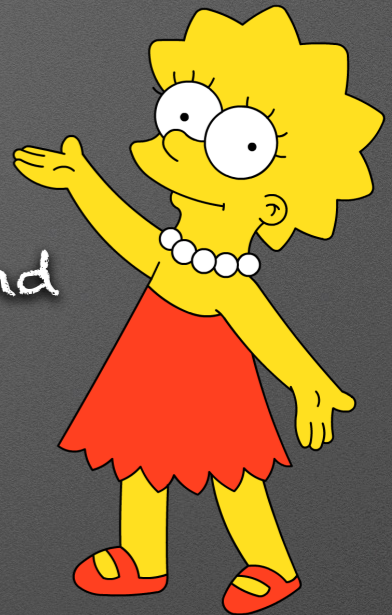
Higher bidder

Both

Bidding Mechanisms



In each turn, both players simultaneously submit "legal" bids, and the higher bidder moves the token.

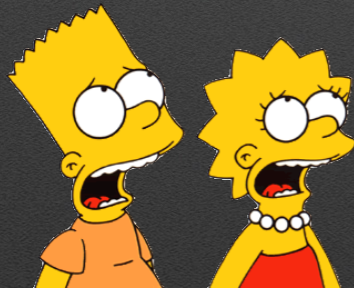


Who pays?

Where?

What?

{ first-price, all-pay } × { Richman, Poorman }

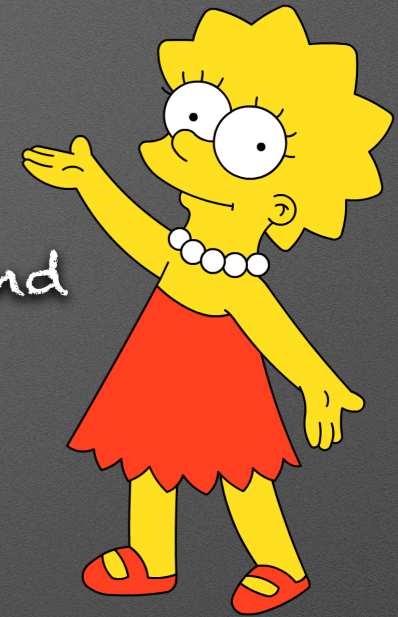


Higher bidder

Both

pay the other bidder

Bidding Mechanisms



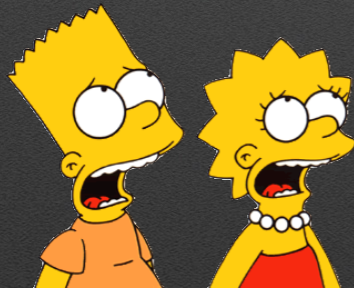
In each turn, both players simultaneously submit "legal" bids, and the higher bidder moves the token.

Who pays?

Where?

What?

{ first-price, all-pay } × { Richman, Poorman }



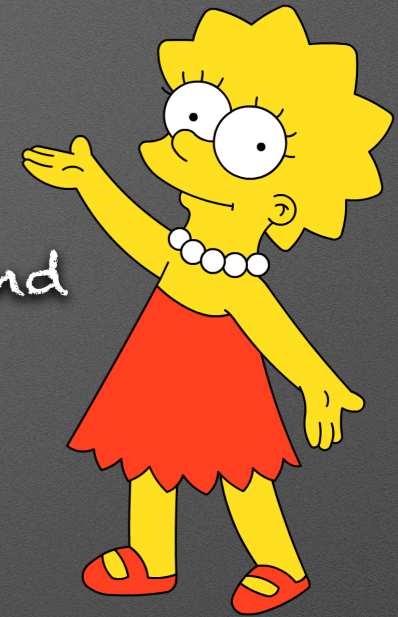
Higher bidder

Both

pay the other bidder

pay the bank

Bidding Mechanisms



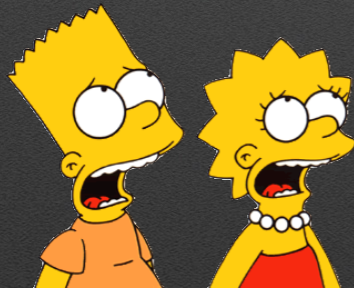
In each turn, both players simultaneously submit "legal" bids, and the higher bidder moves the token.

Who pays?

Where?

What?

{ first-price, all-pay } × { Richman, Poorman } × { continuous, discrete }



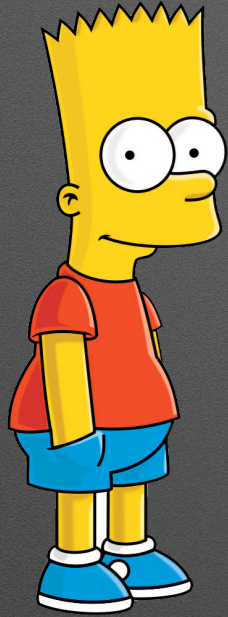
Higher bidder

Both

pay the other bidder

pay the bank

Bidding Mechanisms



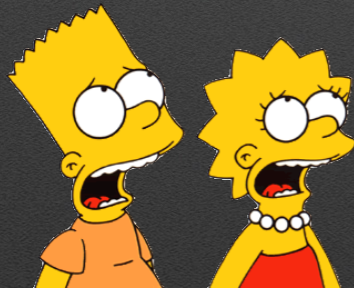
In each turn, both players simultaneously submit "legal" bids, and the higher bidder moves the token.

Who pays?

Where?

What?

{ first-price, all-pay } × { Richman, Poorman } × { continuous, discrete }



Higher bidder

Both

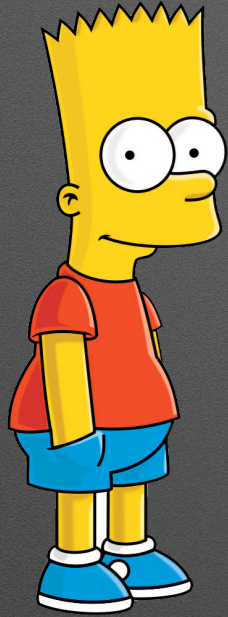
pay the other bidder

pay the bank

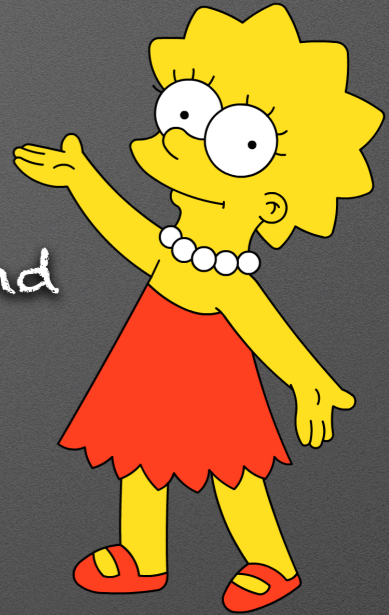
arbitrary

fixed granularity

Bidding Mechanisms



In each turn, both players simultaneously submit "legal" bids, and the higher bidder moves the token.



Who pays?

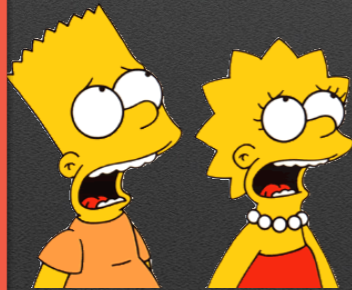
Where?

What?

{ first-price, all-pay } × { Richman, Poorman } × { continuous, discrete }



Higher bidder



Both



pay the other bidder



pay the bank

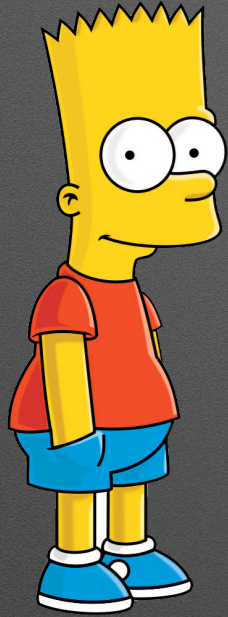


arbitrary



fixed granularity

Bidding Mechanisms



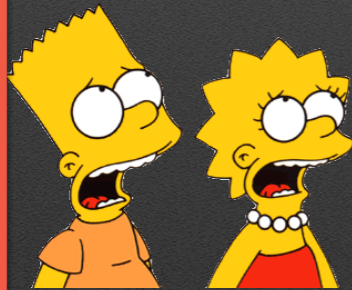
In each turn, both players simultaneously submit "legal" bids, and the higher bidder moves the token.

Who pays?

Where?

What?

{ first-price, all-pay } × { Richman, Poorman } × { continuous, discrete }



Higher bidder

Both

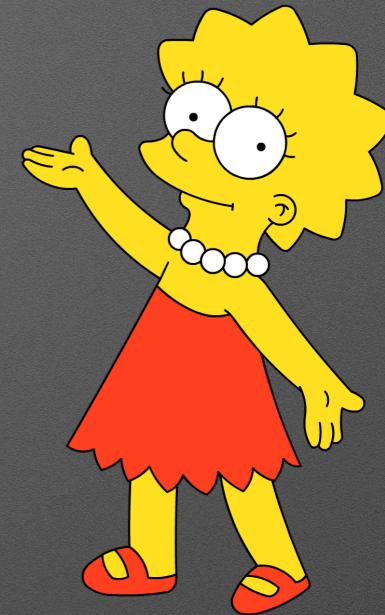
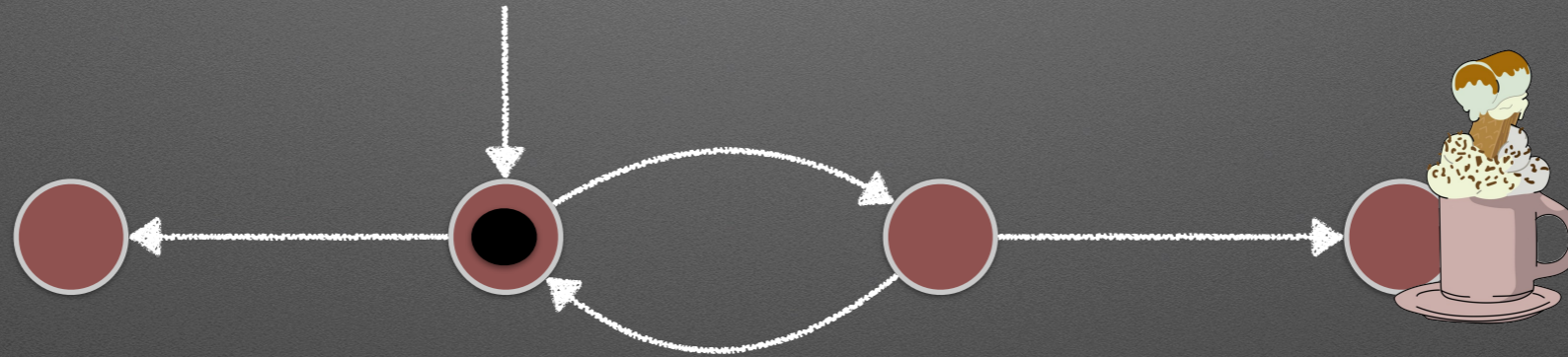
pay the other bidder

pay the bank

arbitrary

fixed granularity

Reachability first-price Richman continuous [Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

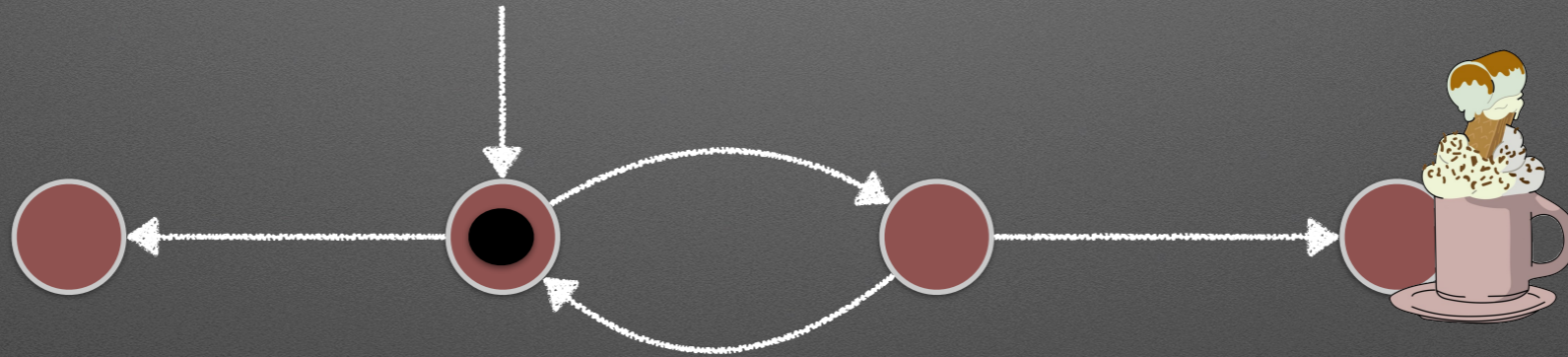


Reachability first-price Richman continuous

[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



Given a game and initial budgets, decide which player has a winning bidding strategy from a given vertex.

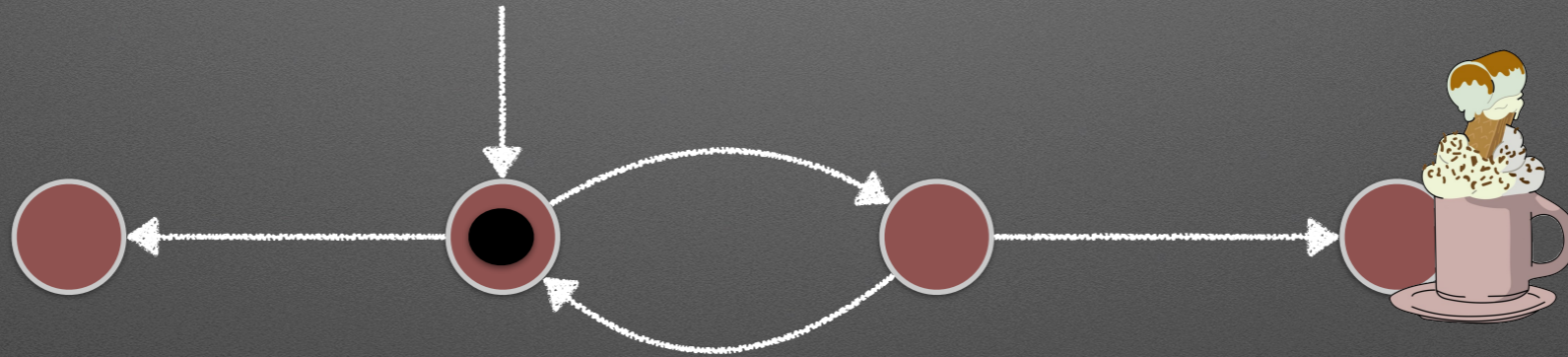


Reachability first-price Richman continuous

[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



How much initial budget is necessary & sufficient for Bart to win?

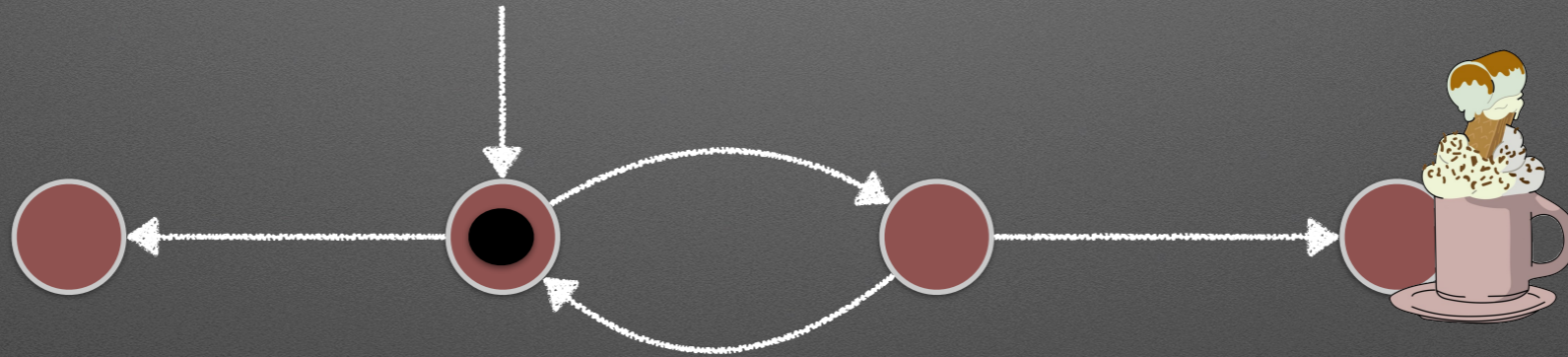


Reachability first-price Richman continuous

[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



How much initial budget is necessary & sufficient for Bart to win?



Total budget is normalised to 1

Reachability first-price Richman continuous

[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

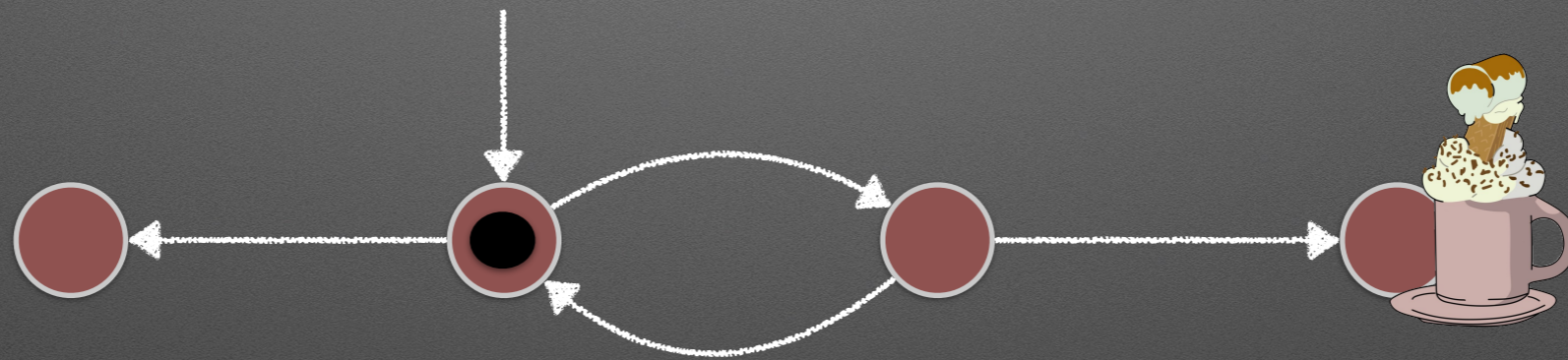


How much initial budget is necessary & sufficient for Bart to win?



Easy:

$$0.75 + \epsilon$$



Total budget is normalised to 1

Reachability first-price Richman continuous

[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



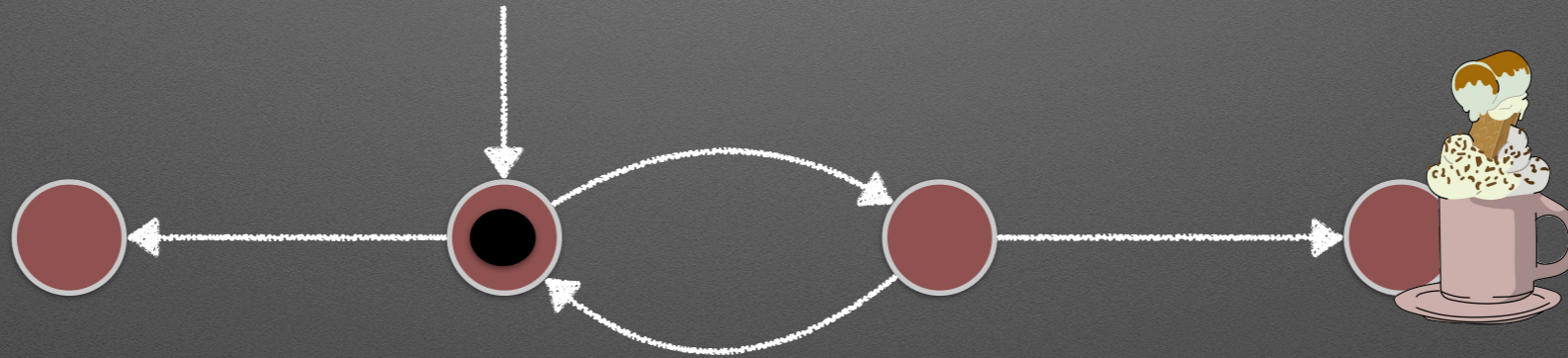
How much initial budget is necessary & sufficient for Bart to win?



Easy:

$0.75 + \epsilon$

$0.25 - \epsilon$



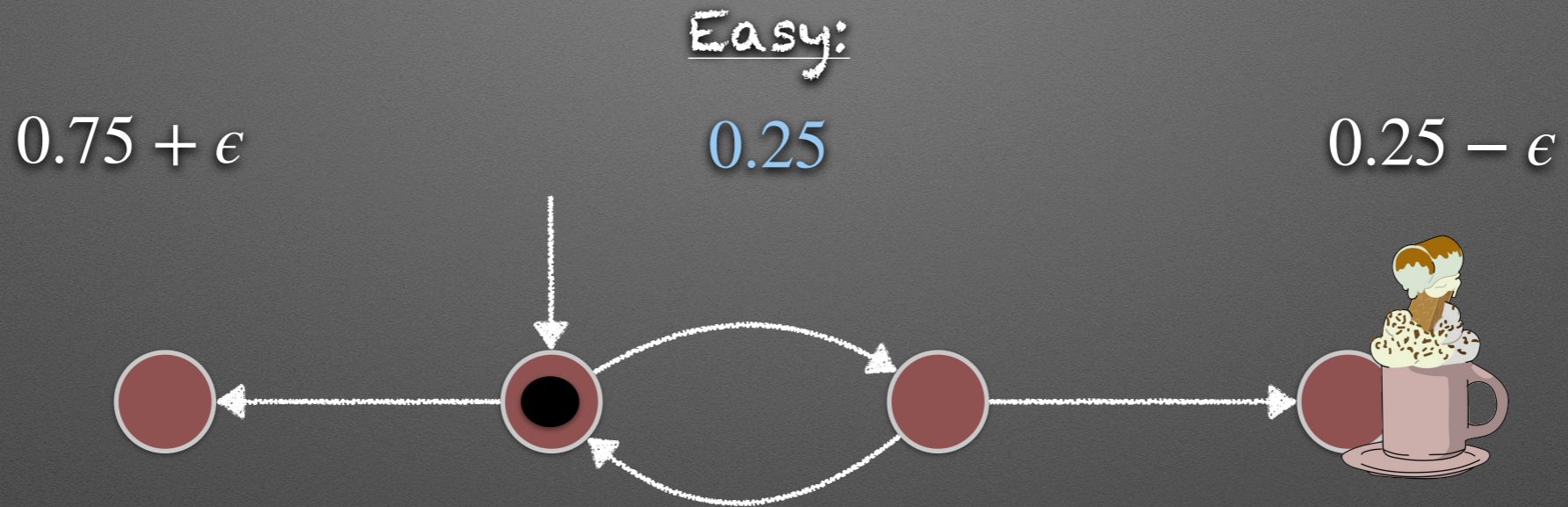
Total budget is normalised to 1

Reachability first-price Richman continuous

[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



How much initial budget is necessary & sufficient for Bart to win?



Total budget is normalised to 1

Reachability first-price Richman continuous

[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



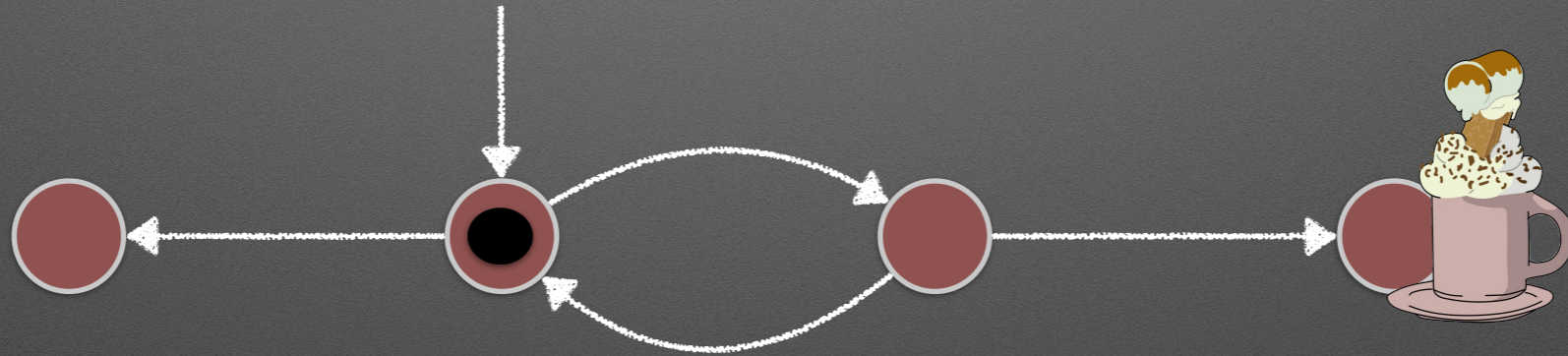
How much initial budget is necessary & sufficient for Bart to win?



Easy:

$0.75 + \epsilon$

$0.25 - \epsilon$



Total budget is normalised to 1

Reachability first-price Richman continuous

[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



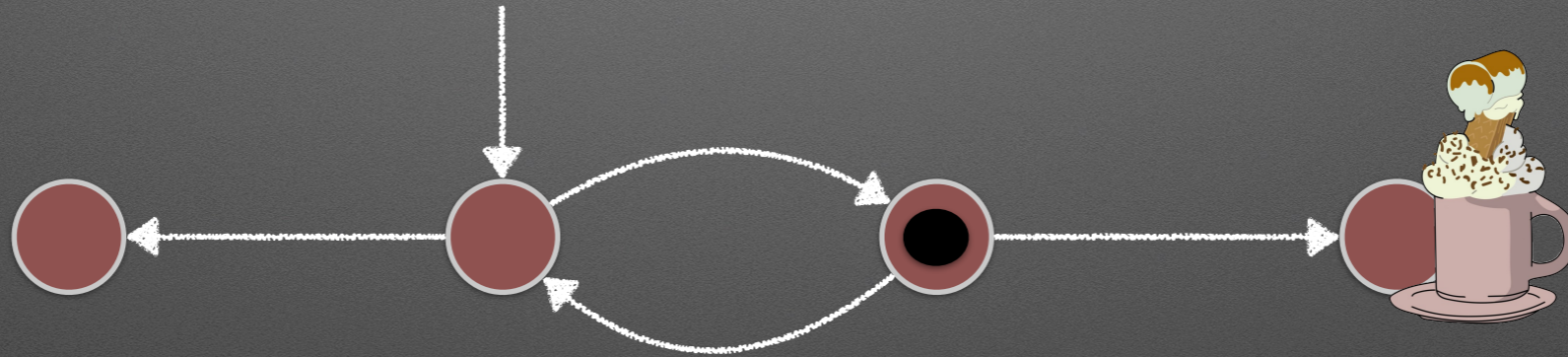
How much initial budget is necessary & sufficient for Bart to win?



Easy:

$0.5 + \epsilon$

$0.5 - \epsilon$



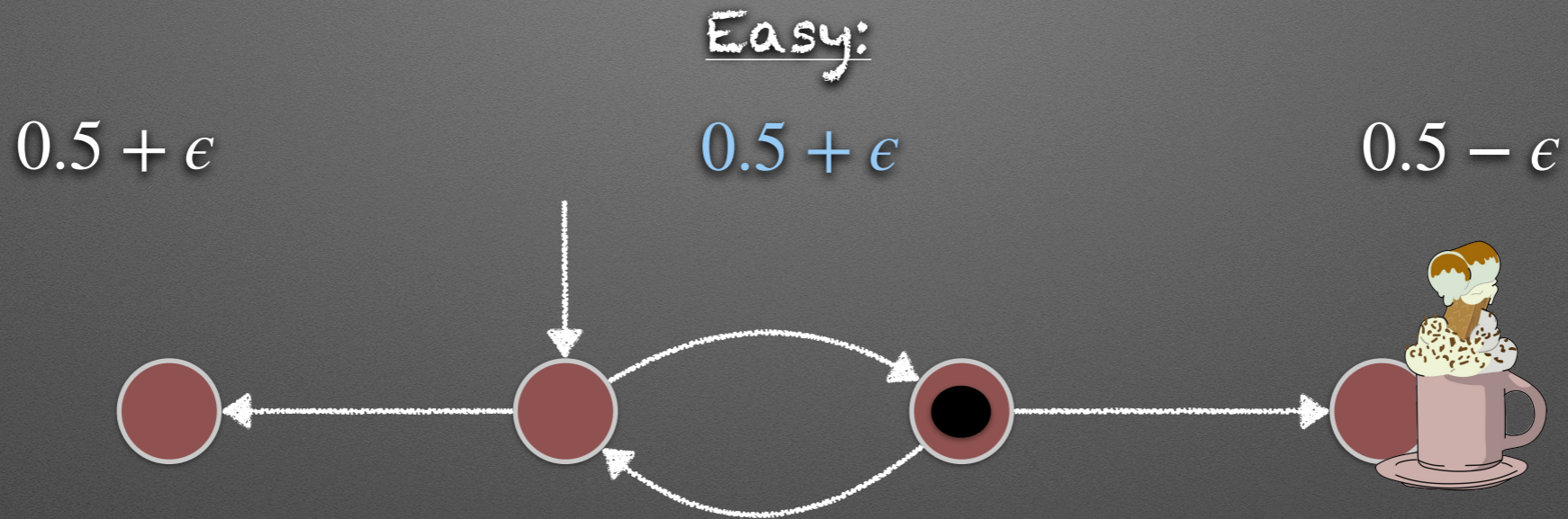
Total budget is normalised to 1

Reachability first-price Richman continuous

[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



How much initial budget is necessary & sufficient for Bart to win?



Total budget is normalised to 1

Reachability first-price Richman continuous [Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

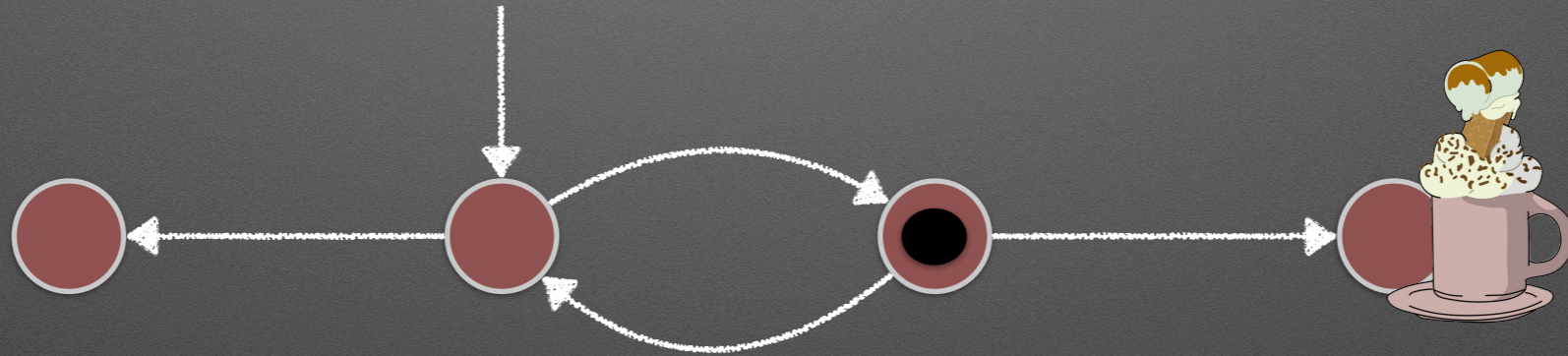


How much initial budget is necessary & sufficient for Bart to win?



Easy:

$0.5 + \epsilon$



$0.5 + \epsilon$

Total budget is normalised to 1

Reachability first-price Richman continuous

[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

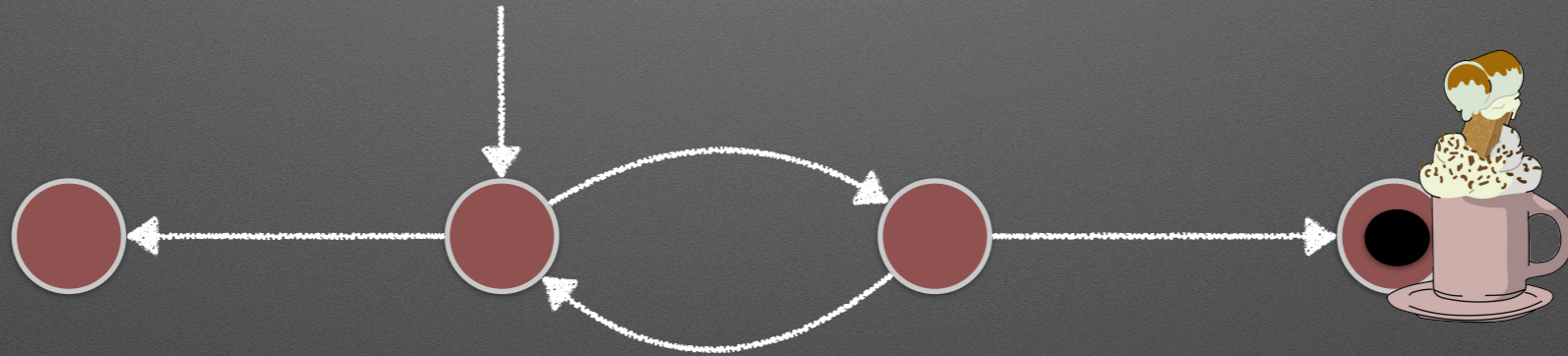


How much initial budget is necessary & sufficient for Bart to win?

Easy:

0

1

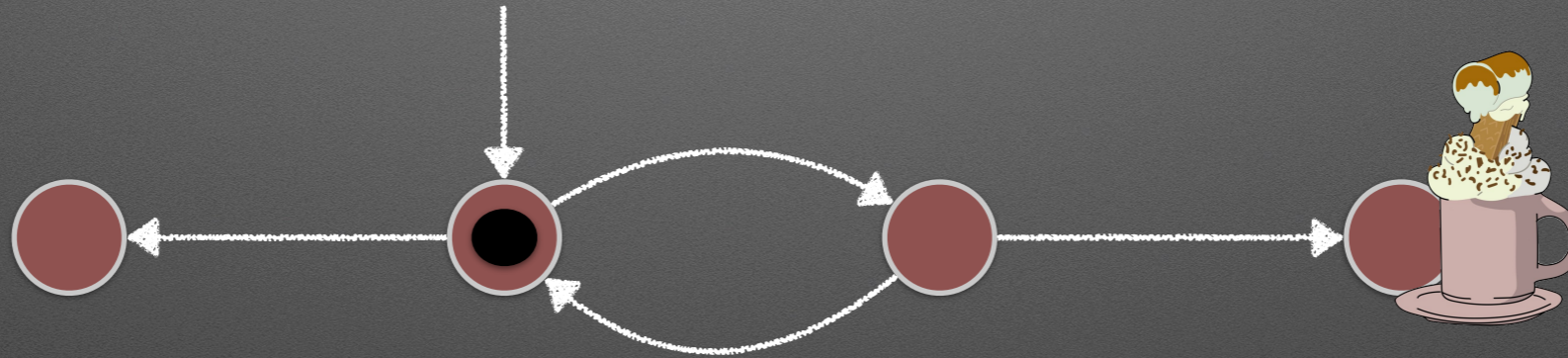
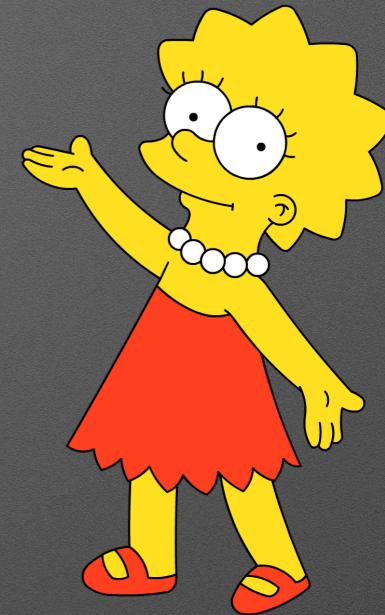


Total budget is normalised to 1

Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



Can he do any better?

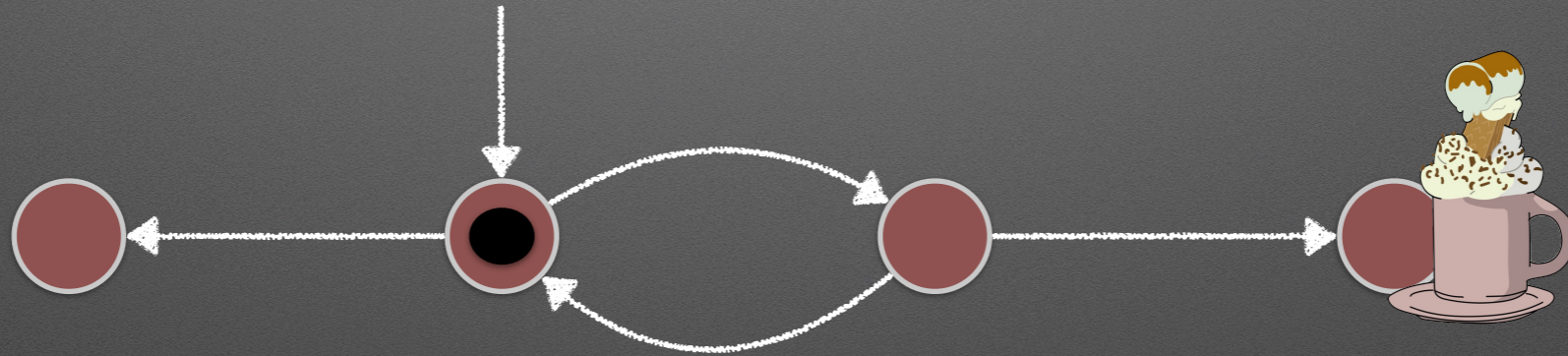


Total budget is normalised to 1

Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



Can he do any better?
Yes!



Total budget is normalised to 1

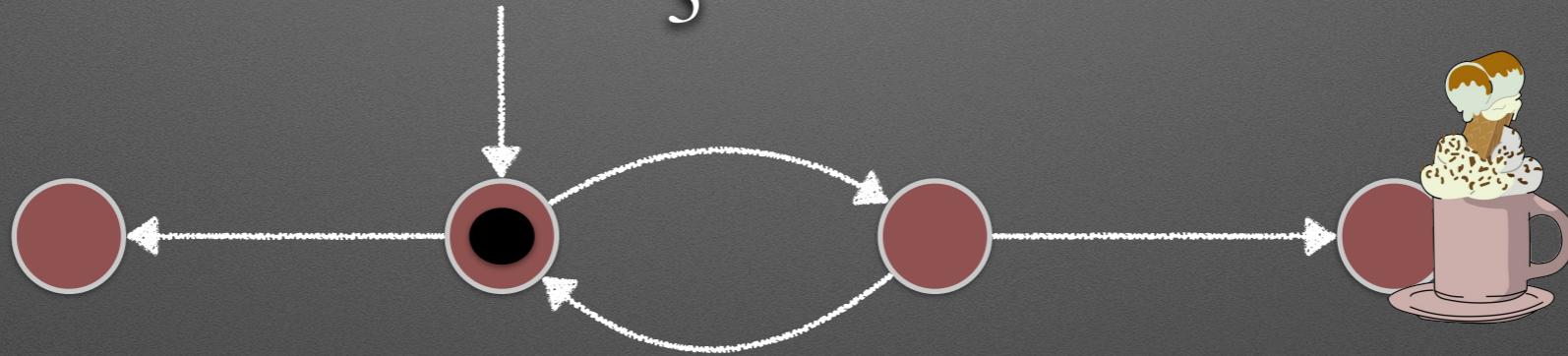
Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



Can he do any better?

Yes!

$$\frac{2}{3} + \epsilon$$

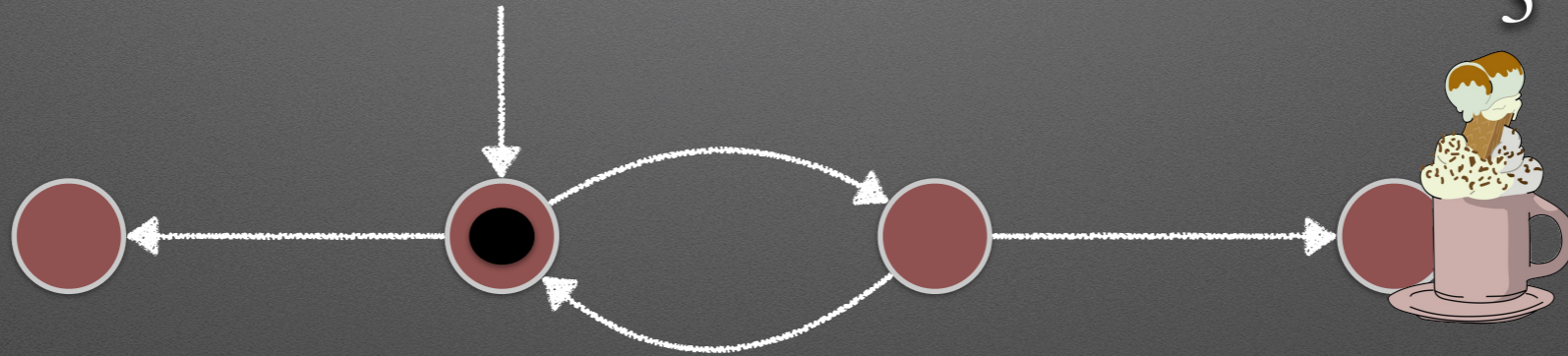


Total budget is normalised to 1

Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



$$\frac{2}{3} + \epsilon$$



$$\frac{1}{3} - \epsilon$$



Total budget is normalised to 1

Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

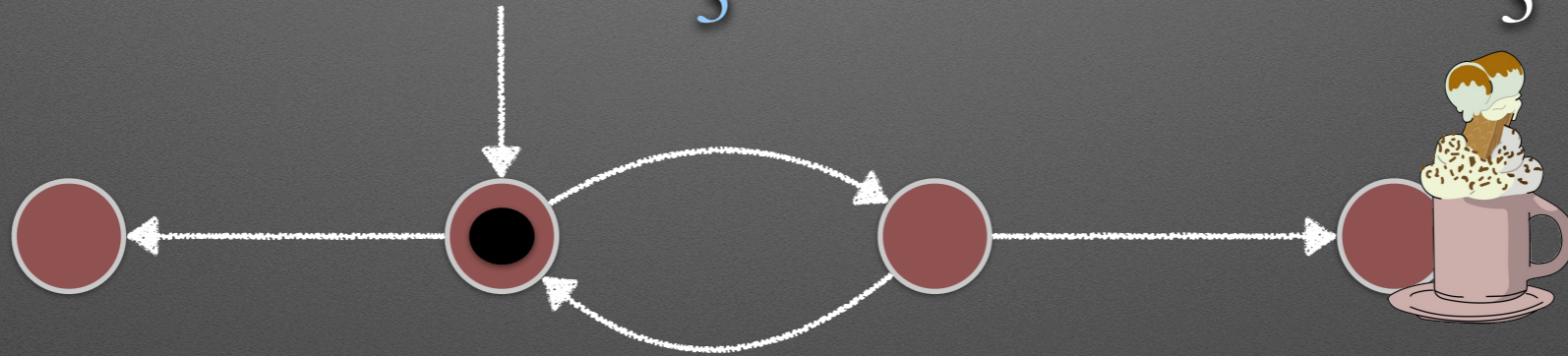


Can he do any better?

$$\frac{2}{3} + \epsilon$$

$$\frac{1}{3}$$

$$\frac{1}{3} - \epsilon$$

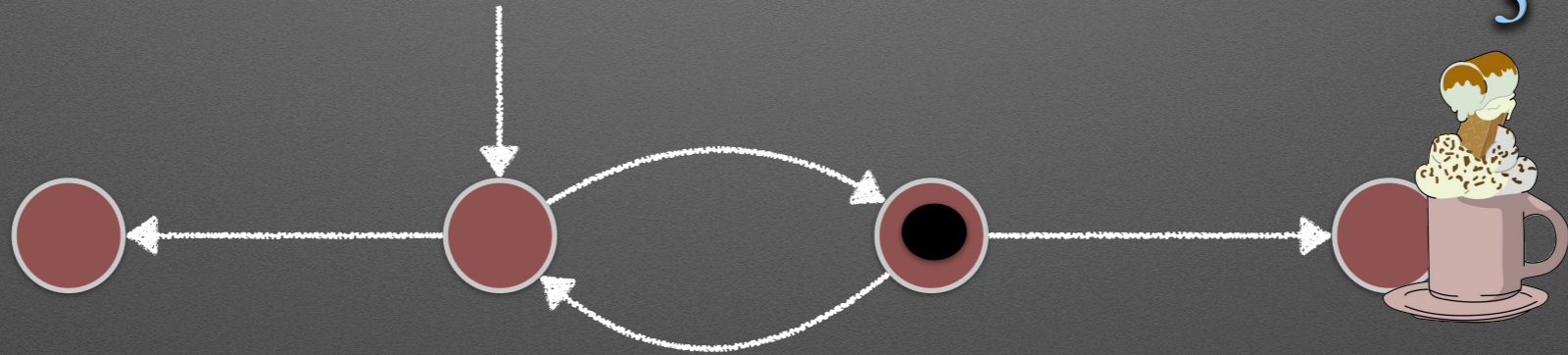


Total budget is normalised to 1

Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



$$\frac{2}{3} + \epsilon$$



$$\frac{1}{3} - \epsilon$$



Can he do any better?

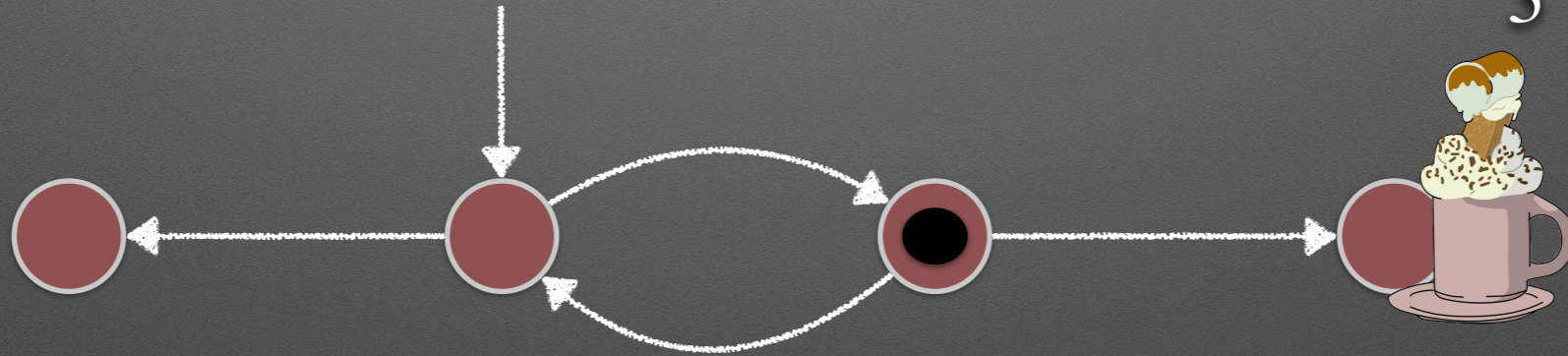
Total budget is normalised to 1

Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

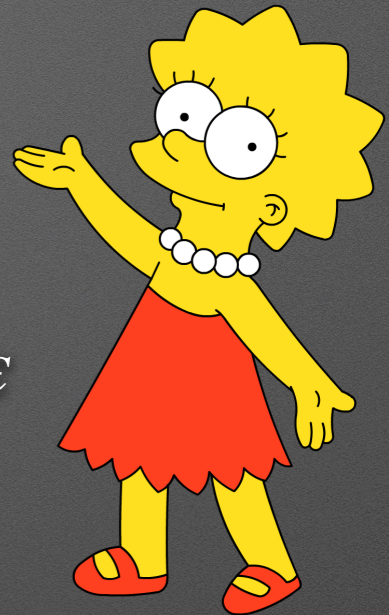


Can he do any better?

$$\frac{1}{3} + \epsilon$$



$$\frac{2}{3} - \epsilon$$

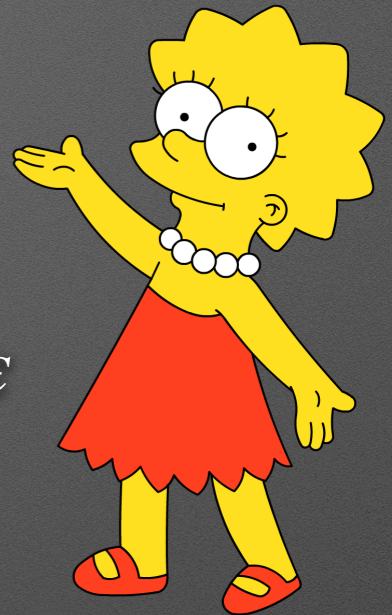
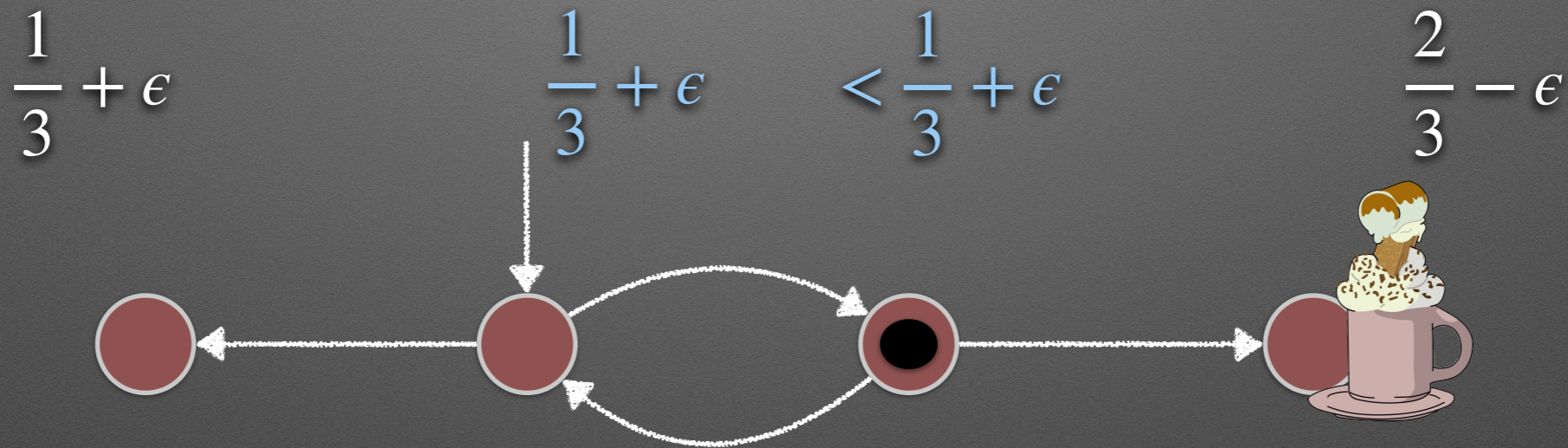


Total budget is normalised to 1

Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



Can he do any better?



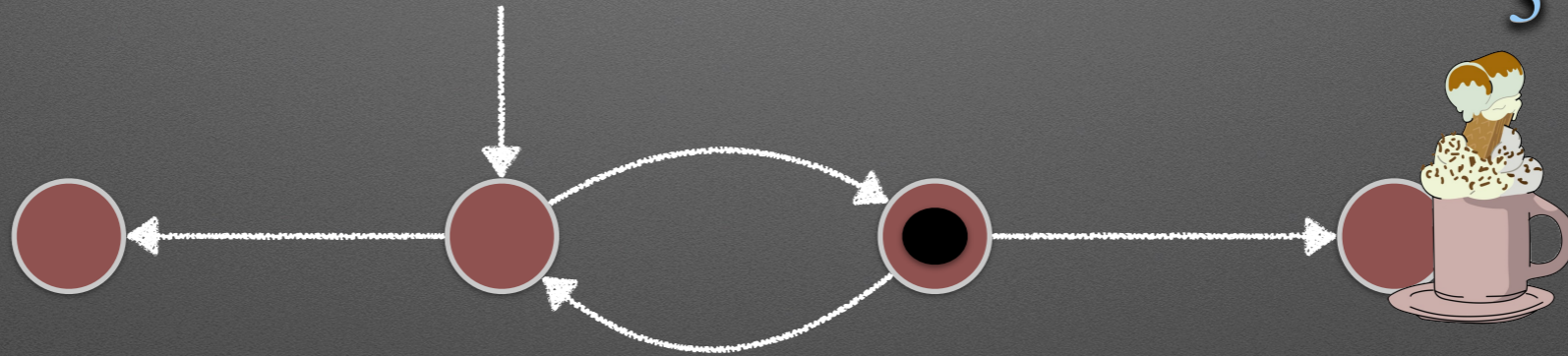
Total budget is normalised to 1

Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

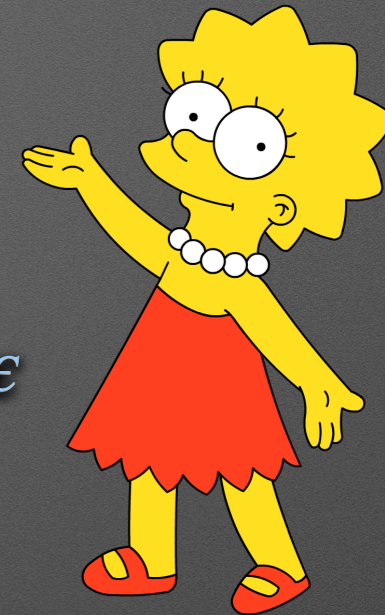


Can he do any better?

$$\frac{1}{3} + \epsilon$$



$$\frac{2}{3} + \epsilon$$



Total budget is normalised to 1

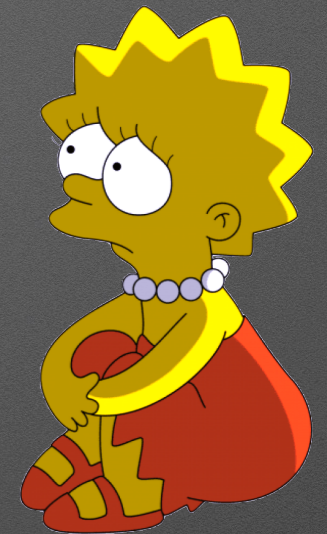
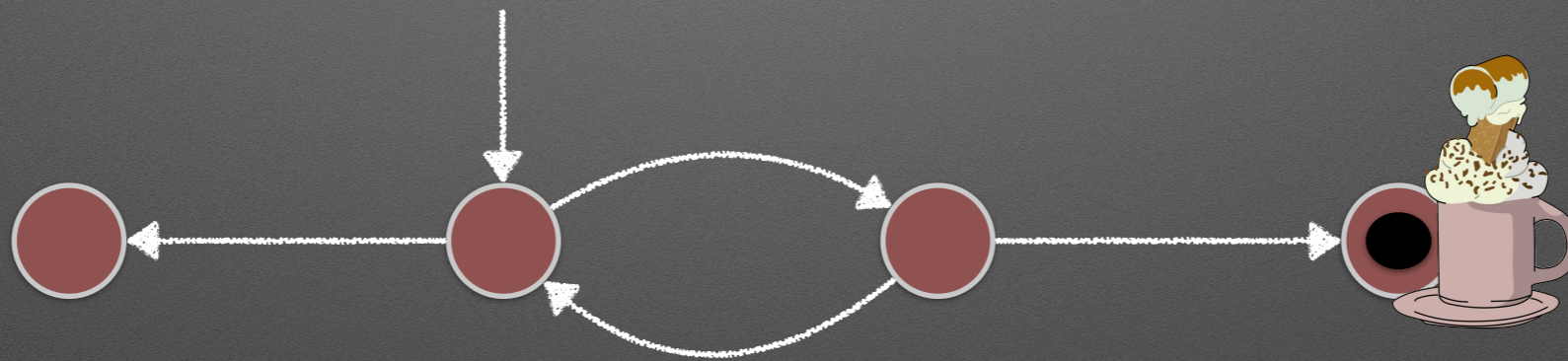
Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



Can he do any better?

0

1



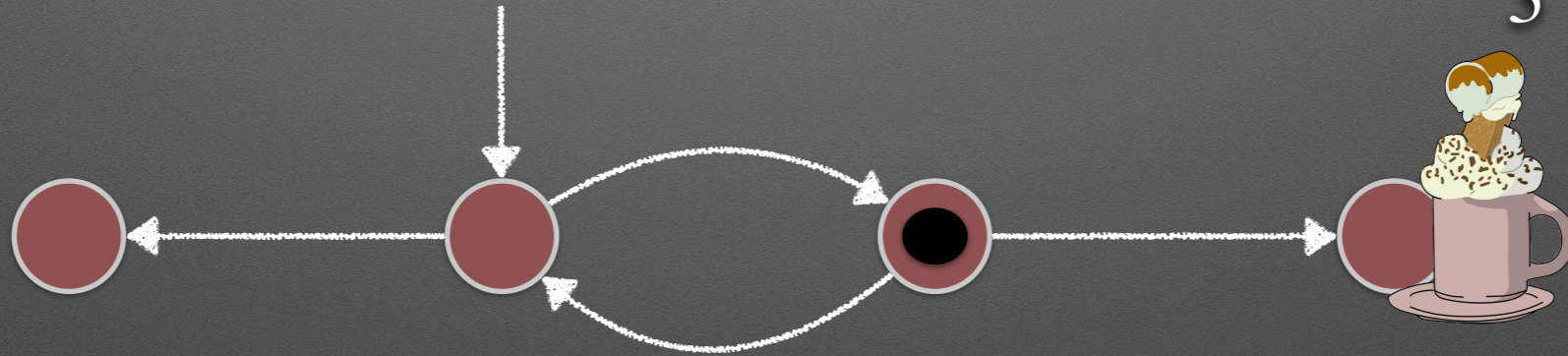
Total budget is normalised to 1

Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

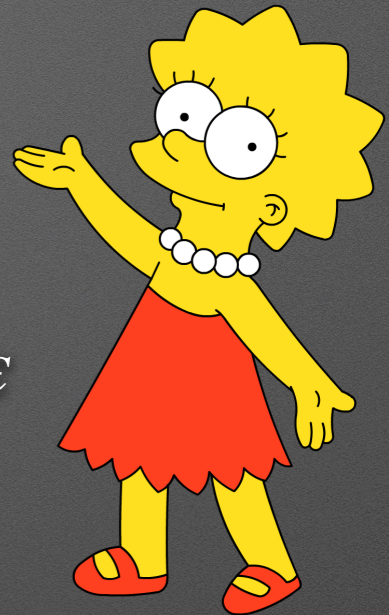


Can he do any better?

$$\frac{1}{3} + \epsilon$$



$$\frac{2}{3} - \epsilon$$



Total budget is normalised to 1

Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

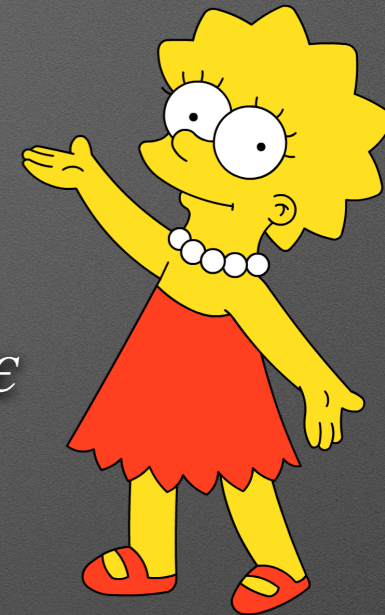
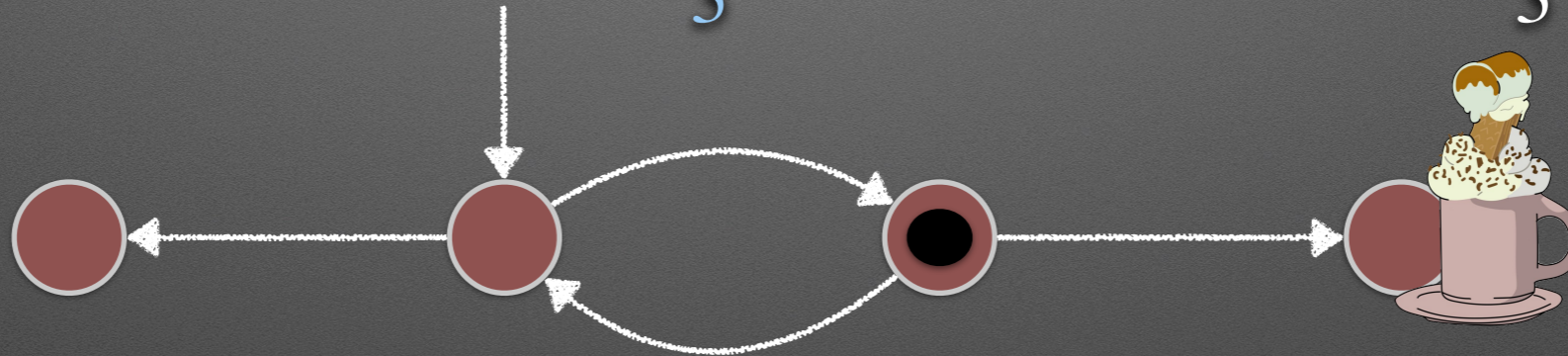


Can he do any better?

$$\frac{1}{3} + \epsilon$$

$$> \frac{1}{3} + \epsilon$$

$$\frac{2}{3} - \epsilon$$



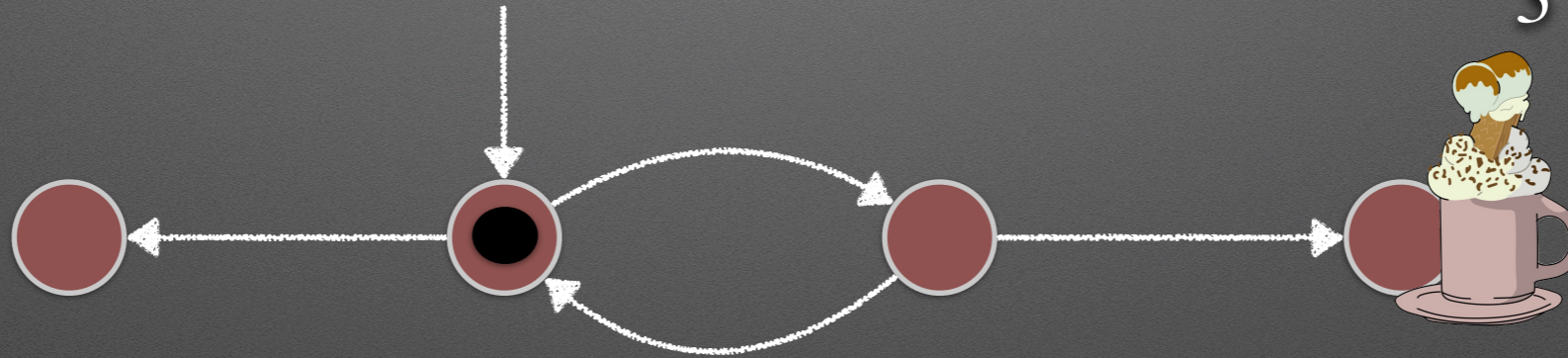
Total budget is normalised to 1

Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

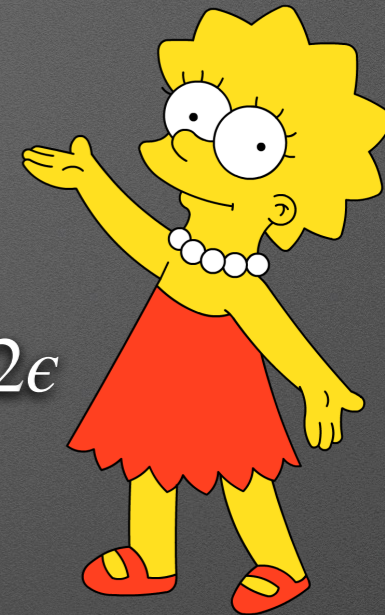


Can he do any better?

$$\frac{2}{3} + 2\epsilon$$



$$\frac{1}{3} - 2\epsilon$$



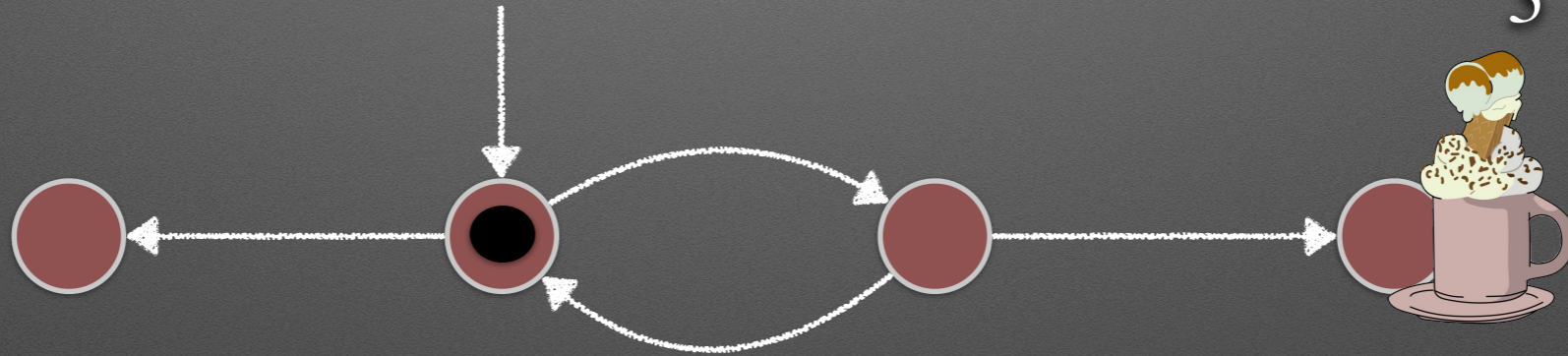
Total budget is normalised to 1

Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

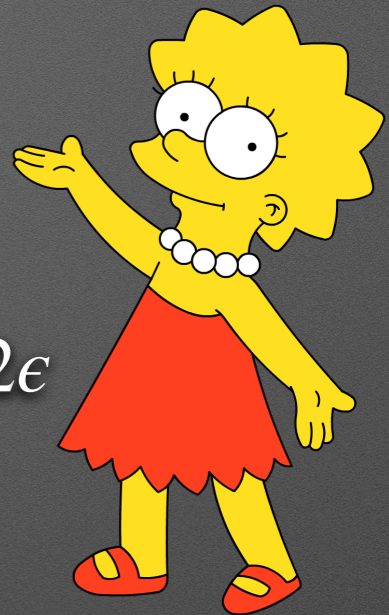


Can he do any better?

$$\frac{2}{3} + 2\epsilon$$



$$\frac{1}{3} - 2\epsilon$$



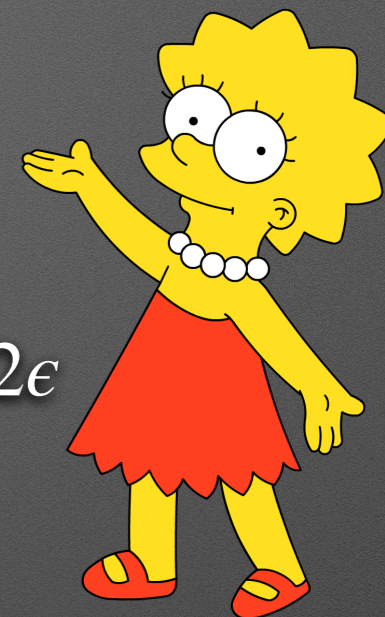
Total budget is normalised to 1

Reachability first-price Richman continuous

[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

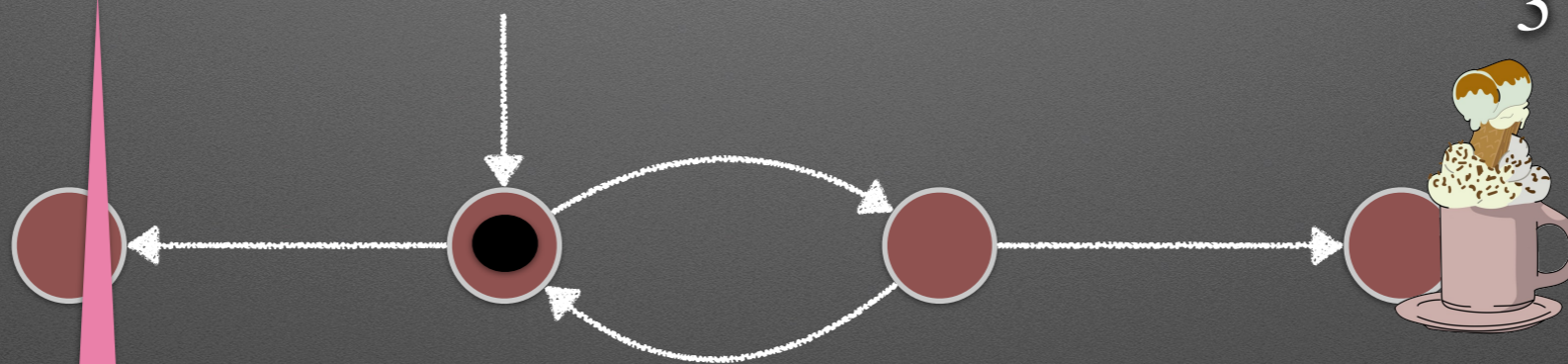


Can he do any better?



$$\frac{2}{3} + 2\epsilon$$

$$\frac{1}{3} - 2\epsilon$$



Total budget is normalised to 1

Continue until he has budget > 0.75 , then he wins

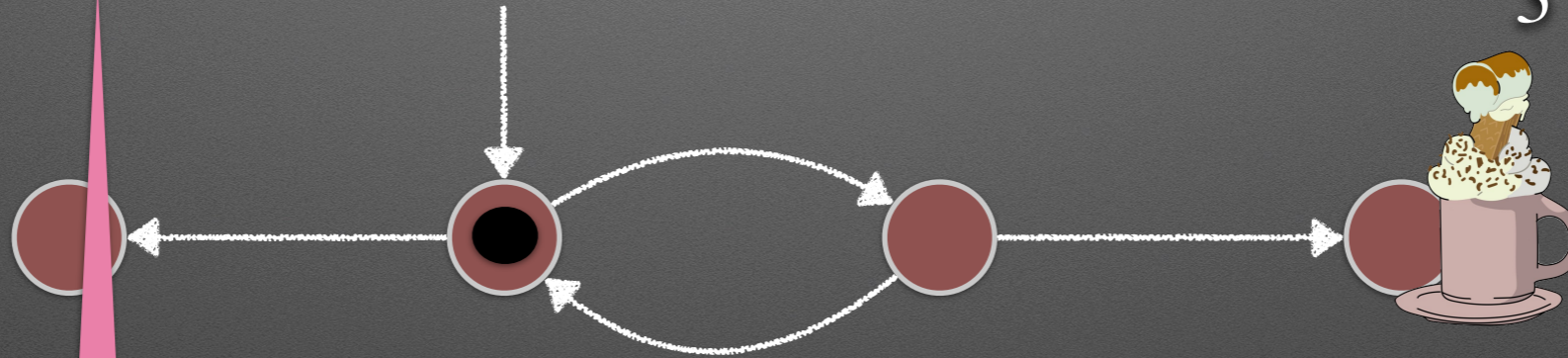
Reachability first-price Richman continuous

[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

Can he do any better?



$$\frac{2}{3} + 2\epsilon$$



$$\frac{1}{3} - 2\epsilon$$

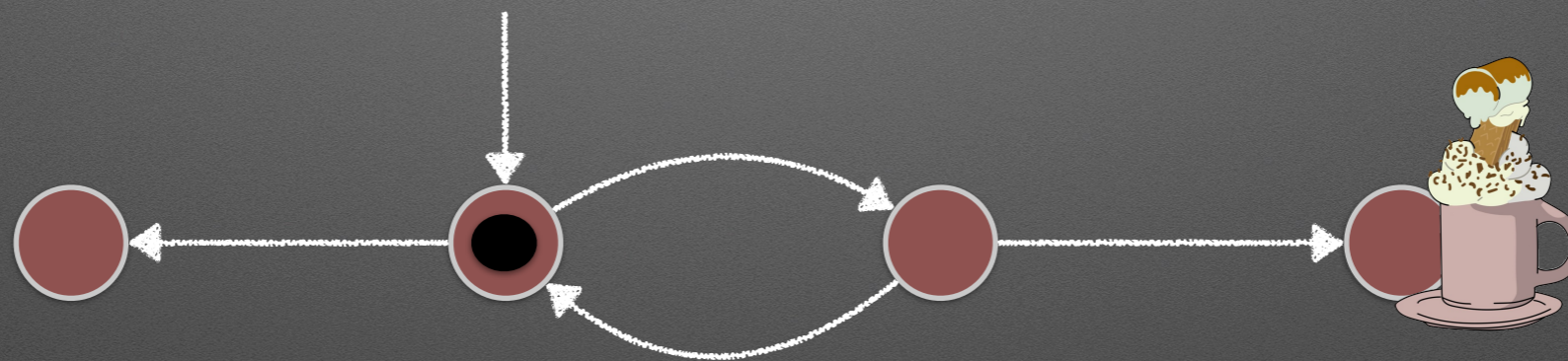


Total budget is normalised to 1

Continue until he has budget > 0.75 , then he wins

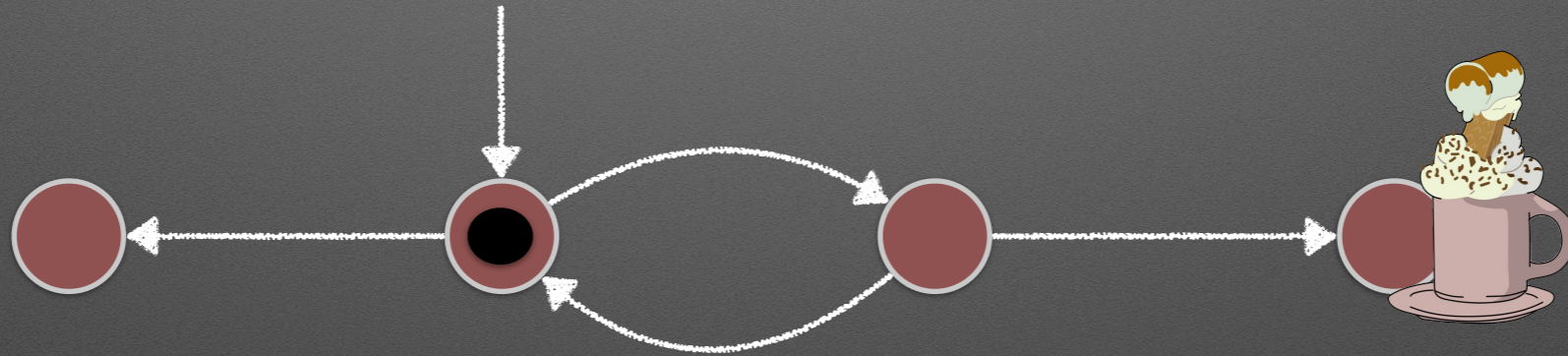
Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

Can he do any better than $\frac{2}{3}$?



Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

Can he do any better than $\frac{2}{3}$?
The answer is No!

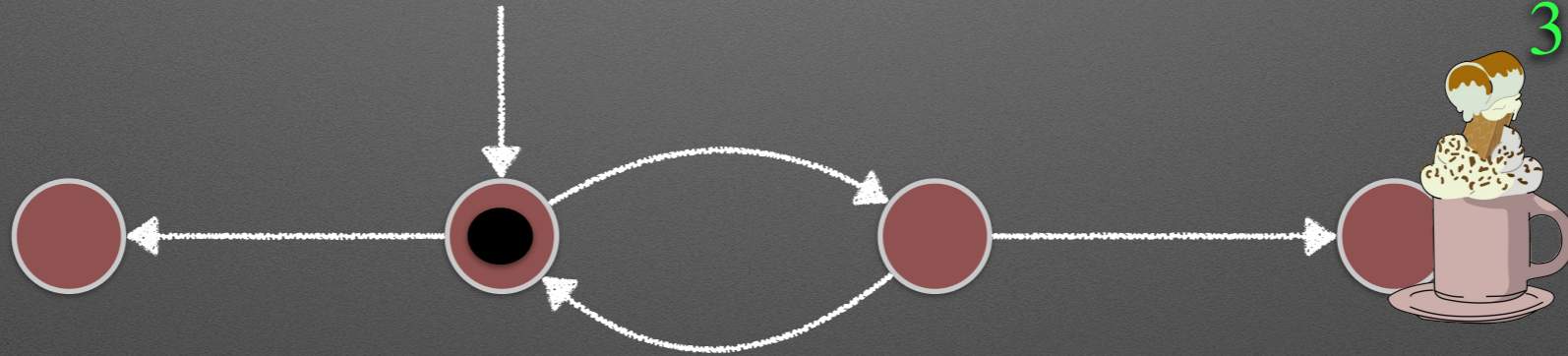


Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

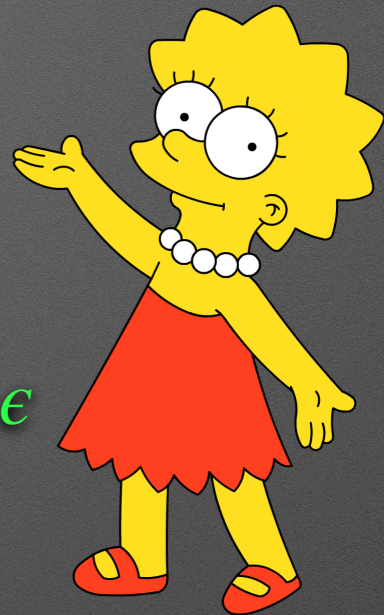
Can he do any better than $\frac{2}{3}$?
The answer is No!



$$\frac{2}{3} - \epsilon$$



$$\frac{1}{3} + \epsilon$$

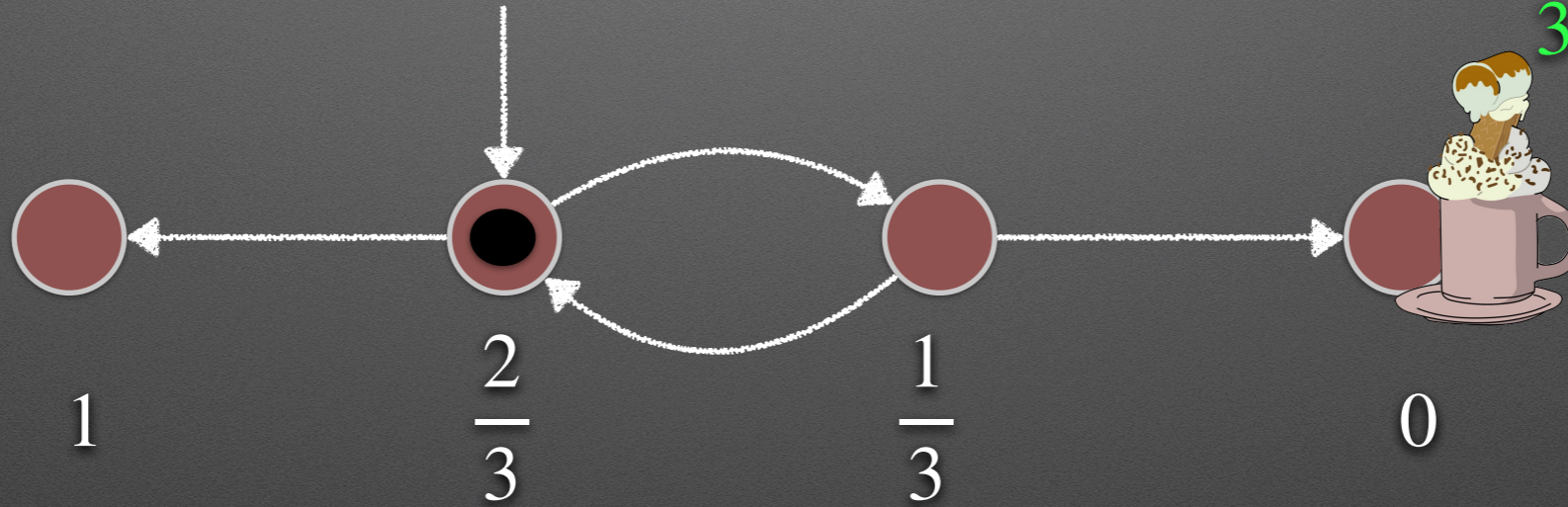


Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

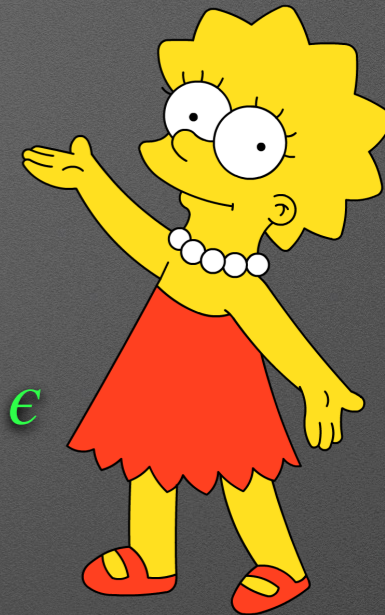
Can he do any better than $\frac{2}{3}$?
The answer is No!



$$\frac{2}{3} - \epsilon$$

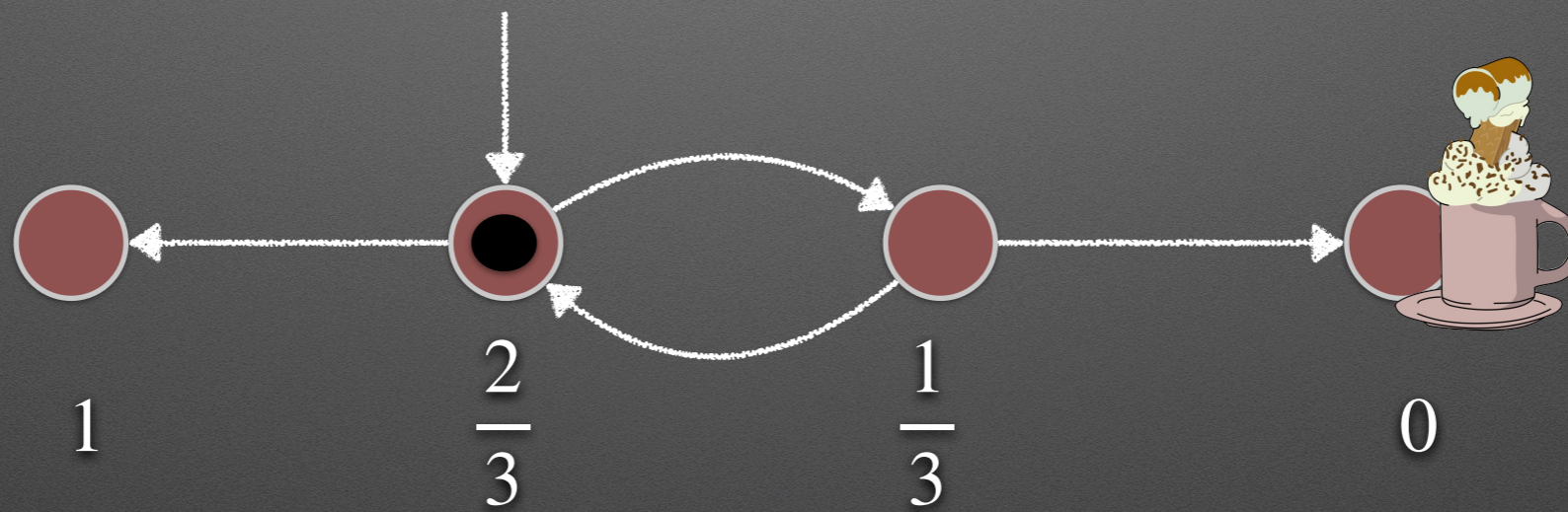
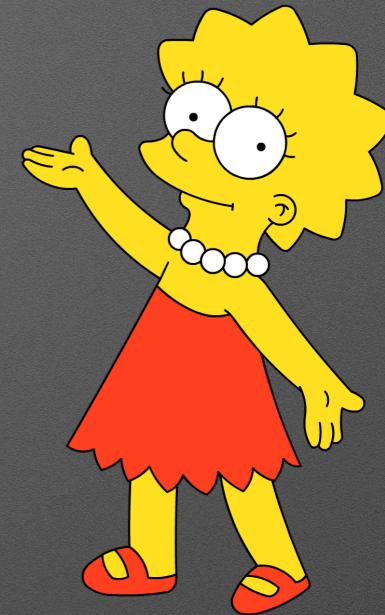


$$\frac{1}{3} + \epsilon$$



Reachability first-price Richman continuous
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

Can he do any better than $\frac{2}{3}$?
The answer is No!

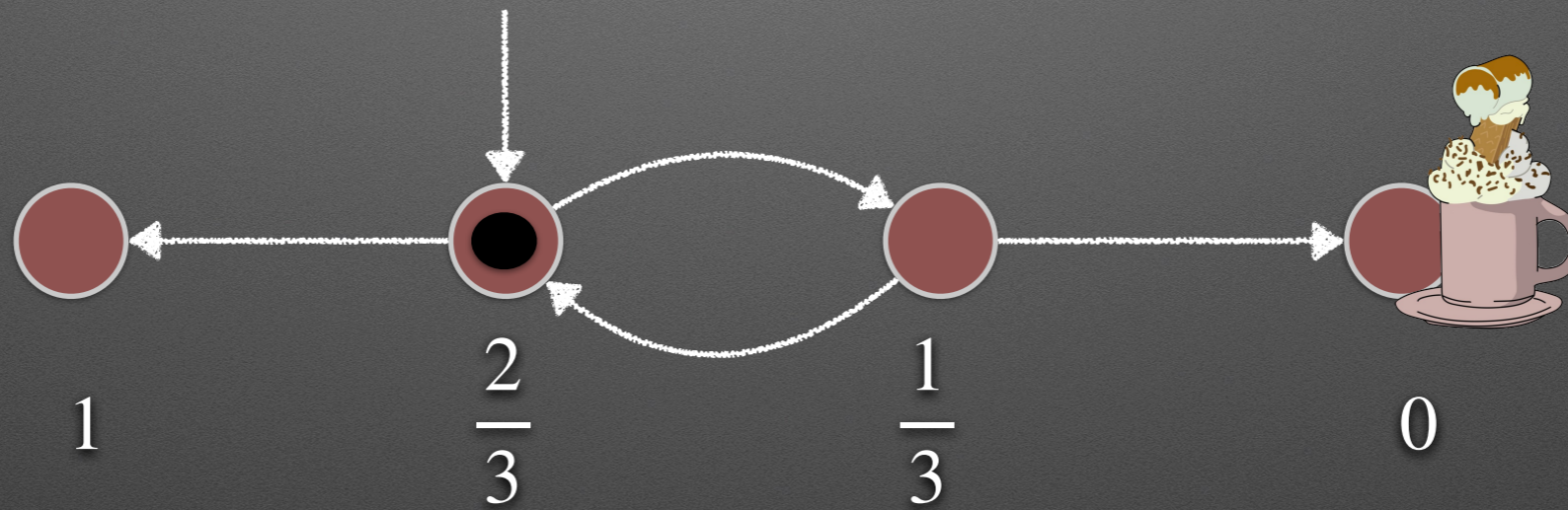


Reachability first-price Richman continuous

[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



How much initial budget is necessary & sufficient for Bart to win?

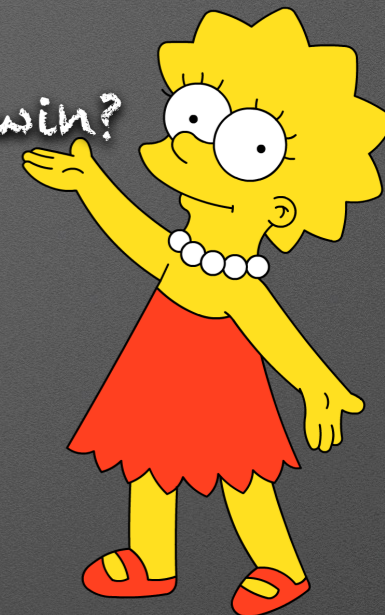


Reachability first-price Richman continuous

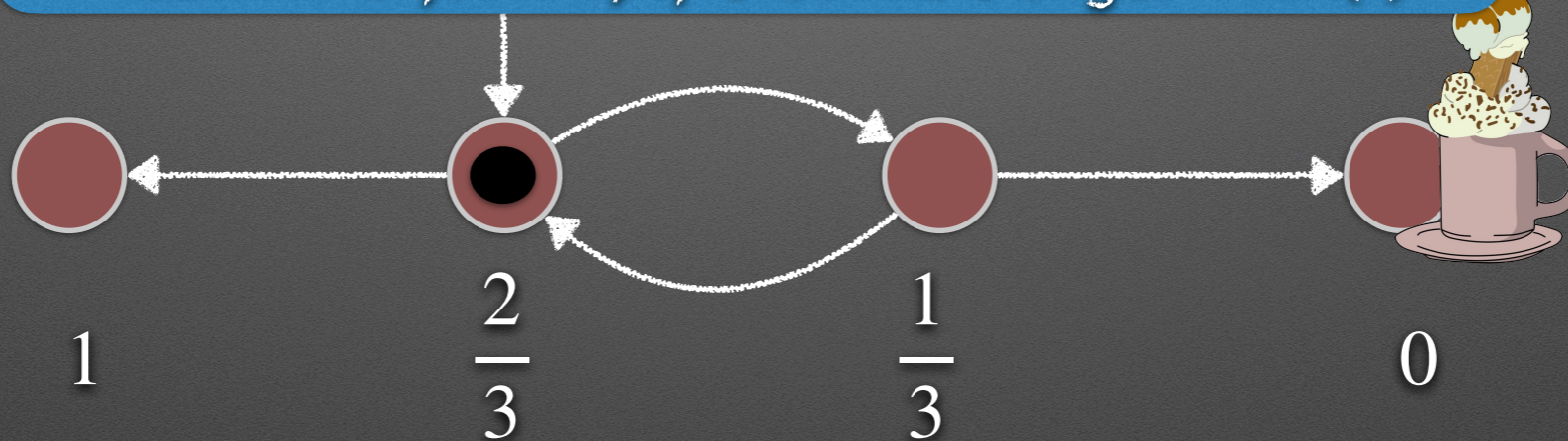
[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



How much initial budget is necessary & sufficient for Bart to win?



Theorem:
Bidding games are determined.
- Bart wins from v , if he has budget $> Th(v)$
- Lisa wins from v , if Bart has budget $< Th(v)$



Reachability first-price Richman continuous [Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]



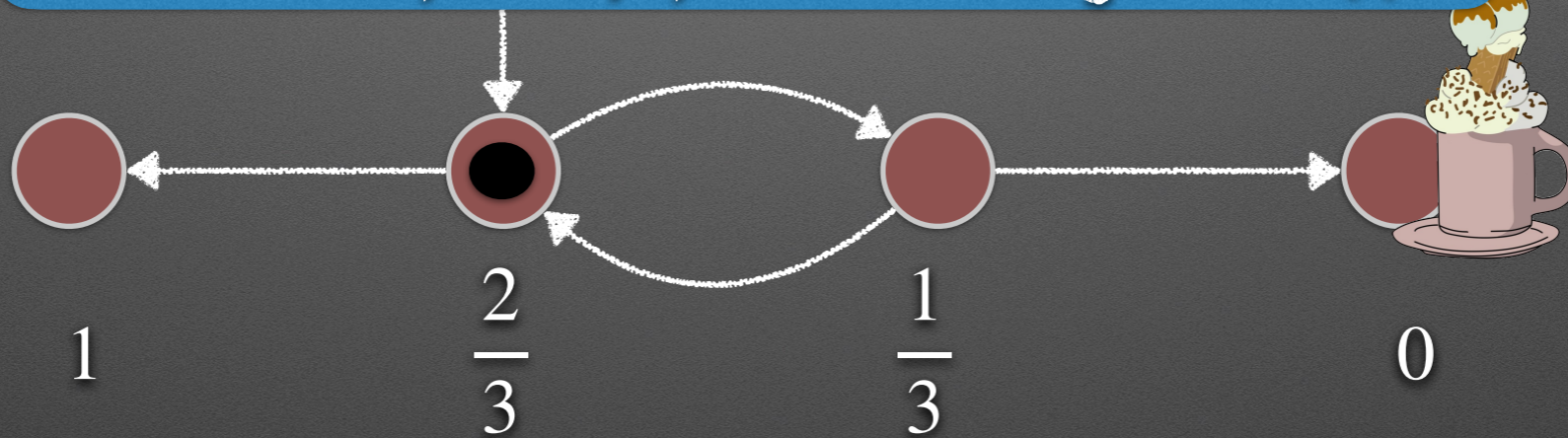
How much initial budget is necessary & sufficient for Bart to win?



Theorem:

Bidding games are determined.

- Bart wins from v , if he has budget $> Th(v)$
- Lisa wins from v , if Bart has budget $< Th(v)$



Theorem [LLPU96, LLPSU99]:

- (1) Threshold budgets exist
- (2) They satisfy an average property
- (3) Optimal bids can be derived from the threshold budgets
- (4) In $NP \cap co-NP$ via a (simple) reduction to stochastic games

Reachability first-price Richman continuous

[Lazarus, Loeb, Propp, Stromquist, Ullman '96, '99]

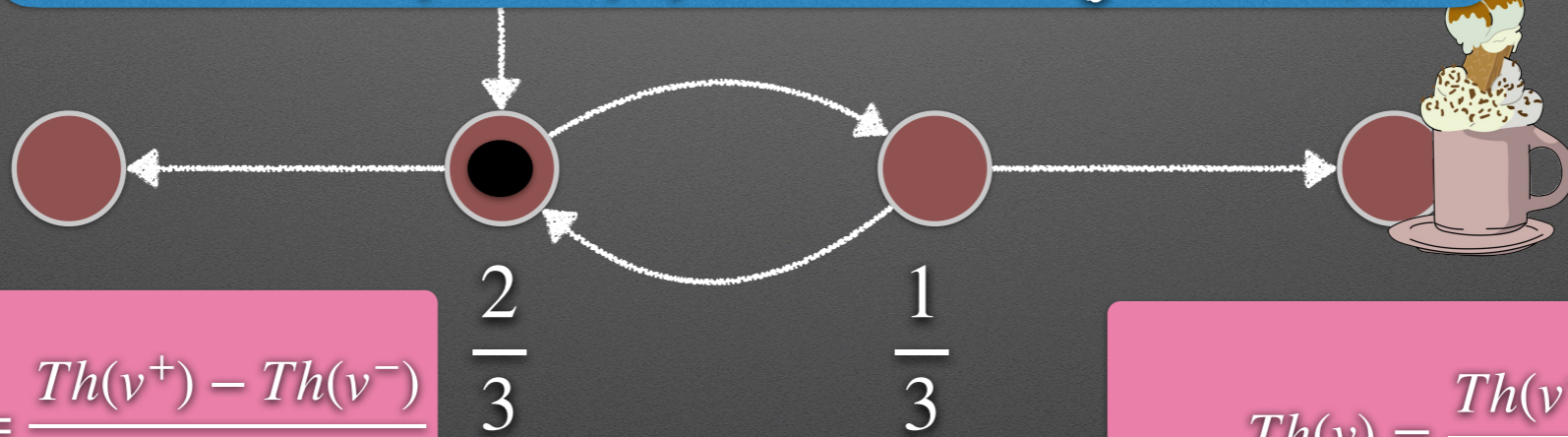


How much initial budget is necessary & sufficient for Bart to win?

Theorem:

Bidding games are determined.

- Bart wins from v , if he has budget $> Th(v)$
- Lisa wins from v , if Bart has budget $< Th(v)$



Optimal bids: $b(v) = \frac{Th(v^+) - Th(v^-)}{2}$

$$Th(v) = \frac{Th(v^+) + Th(v^-)}{2}$$

Theorem [LLPU96, LLPSU99]:

- (1) Threshold budgets exist
- (2) They satisfy an average property
- (3) Optimal bids can be derived from the threshold budgets
- (4) In $NP \cap co-NP$ via a (simple) reduction to stochastic games

P.S. v^+ and v^- are the max/min neighbours wrt $Th()$

Part I (in Theory):
Discrete Bidding Games

Reachability first-price Richman discrete

[Develin & Payne, 2009]

Reachability first-price Richman discrete

[Develin & Payne, 2009]

A bidding game is played on an arena: $\langle k, V, E \rangle$

where $k \in \mathbb{N}$ is the total budget

Reachability first-price Richman discrete

[Develin & Payne, 2009]

A bidding game is played on an arena: $\langle k, V, E \rangle$

where $k \in \mathbb{N}$ is the total budget

A configuration is (v, B_1, B_2) with $B_1 + B_2 = k$

Reachability first-price Richman discrete

[Develin & Payne, 2009]

A bidding game is played on an arena: $\langle k, V, E \rangle$

where $k \in \mathbb{N}$ is the total budget

A configuration is (v, B_1, B_2) with $B_1 + B_2 = k$

At each turn, Player i bids an integer $b_i \leq B_i$

Reachability first-price Richman **discrete**

[Develin & Payne, 2009]

A bidding game is played on an arena: $\langle k, V, E \rangle$

where $k \in \mathbb{N}$ is the total budget

A configuration is (v, B_1, B_2) with $B_1 + B_2 = k$

At each turn, Player i bids an integer $b_i \leq B_i$

Discrete

Reachability first-price Richman **discrete**

[Develin & Payne, 2009]

A bidding game is played on an arena: $\langle k, V, E \rangle$

where $k \in \mathbb{N}$ is the total budget

A configuration is (v, B_1, B_2) with $B_1 + B_2 = k$

Discrete

At each turn, Player i bids an integer $b_i \leq B_i$

If $b_1 > b_2$, then Player 1 moves, and $B'_1 = B_1 - b_1, B'_2 = B_2 + b_2$

Reachability first-price Richman **discrete**

[Develin & Payne, 2009]

A bidding game is played on an arena: $\langle k, V, E \rangle$

where $k \in \mathbb{N}$ is the total budget

A configuration is (v, B_1, B_2) with $B_1 + B_2 = k$

Discrete

At each turn, Player i bids an integer $b_i \leq B_i$

If $b_1 > b_2$, then Player 1 moves, and $B'_1 = B_1 - b_1, B'_2 = B_2 + b_2$

Tie breaking (when $b_1 = b_2$)

Reachability first-price Richman **discrete**

[Develin & Payne, 2009]

A bidding game is played on an arena: $\langle k, V, E \rangle$

where $k \in \mathbb{N}$ is the total budget

A configuration is (v, B_1, B_2) with $B_1 + B_2 = k$

Discrete

At each turn, Player i bids an integer $b_i \leq B_i$

If $b_1 > b_2$, then Player 1 moves, and $B'_1 = B_1 - b_1, B'_2 = B_2 + b_2$

Tie breaking (when $b_1 = b_2$)



8



10

Reachability first-price Richman **discrete**

[Develin & Payne, 2009]

A bidding game is played on an arena: $\langle k, V, E \rangle$

where $k \in \mathbb{N}$ is the total budget

A configuration is (v, B_1, B_2) with $B_1 + B_2 = k$

Discrete

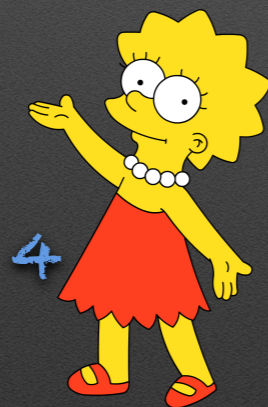
At each turn, Player i bids an integer $b_i \leq B_i$

If $b_1 > b_2$, then Player 1 moves, and $B'_1 = B_1 - b_1, B'_2 = B_2 + b_2$

Tie breaking (when $b_1 = b_2$)



8



10

Reachability first-price Richman **discrete**

[Develin & Payne, 2009]

A bidding game is played on an arena: $\langle k, V, E \rangle$

where $k \in \mathbb{N}$ is the total budget

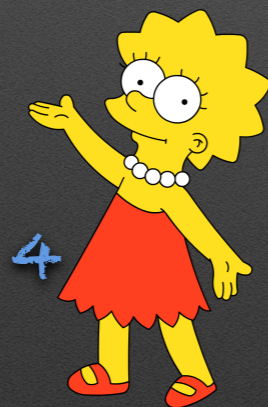
A configuration is (v, B_1, B_2) with $B_1 + B_2 = k$

At each turn, Player i bids an integer $b_i \leq B_i$

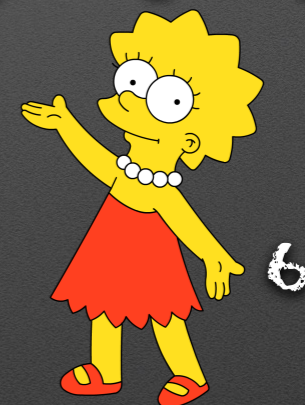
If $b_1 > b_2$, then Player 1 moves, and $B'_1 = B_1 - b_1, B'_2 = B_2 + b_2$

Discrete

Tie breaking (when $b_1 = b_2$)



12



Reachability first-price Richman discrete

[Develin & Payne, 2009]

A bidding game is played on an arena: $\langle k, V, E \rangle$

where $k \in \mathbb{N}$ is the total budget

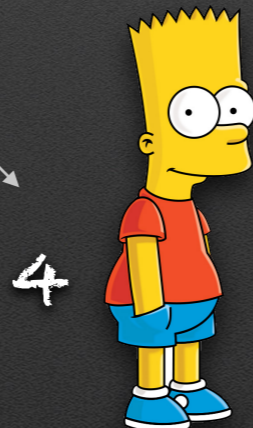
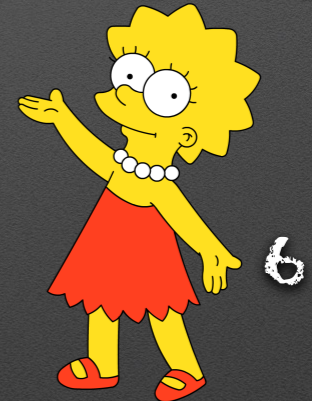
A configuration is (v, B_1, B_2) with $B_1 + B_2 = k$

At each turn, Player i bids an integer $b_i \leq B_i$

If $b_1 > b_2$, then Player 1 moves, and $B'_1 = B_1 - b_1, B'_2 = B_2 + b_2$

Discrete

Tie breaking (when $b_1 = b_2$)



Reachability first-price Richman discrete

[Develin & Payne, 2009]

A bidding game is played on an arena: $\langle k, V, E \rangle$

where $k \in \mathbb{N}$ is the total budget

A configuration is (v, B_1, B_2) with $B_1 + B_2 = k$

Discrete

At each turn, Player i bids an integer $b_i \leq B_i$

If $b_1 > b_2$, then Player 1 moves, and $B'_1 = B_1 - b_1, B'_2 = B_2 + b_2$

Tie breaking (when $b_1 = b_2$)



8

4



10

4

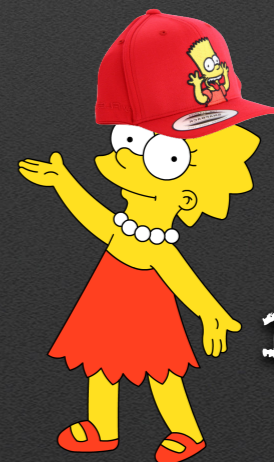
12



4



6



14

Budgets are of the form B or B^*

Reachability first-price Richman discrete

[Develin & Payne, 2009]

A bidding game is played on an arena: $\langle k, V, E \rangle$

where $k \in \mathbb{N}$ is the total budget

A configuration is (v, B_1, B_2) with $B_1 + B_2 = k$

Discrete

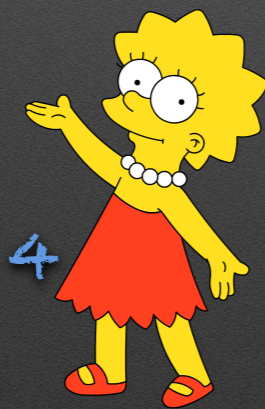
At each turn, Player i bids an integer $b_i \leq B_i$

If $b_1 > b_2$, then Player 1 moves, and $B'_1 = B_1 - b_1, B'_2 = B_2 + b_2$

Tie breaking (when $b_1 = b_2$)



8



10

12



6



Budgets are of the form B or B^*

The possible budgets are as follows:
 $0 < 0^* < 1 < 1^* \dots k < k^* < k + 1$

Reachability first-price Richman **discrete**

[Develin & Payne, 2009]

A bidding game is played on an arena: $\mathcal{A} = \langle k, V, E \rangle$

where $k \in \mathbb{N}$ is the total budget

A configuration is (v, B_1, B_2) with $B_1 + B_2 = k$

At each turn, Player i bids an integer $b_i \leq B_i$

If $b_1 > b_2$, then Player 1 moves, and $B'_1 = B_1 - b_1, B'_2 = B_2 + b_2$

Decision Problem:

Input: A game graph \mathcal{G} , total budget k (encoded in binary),
Winning condition \mathcal{W} , and initial configuration $\langle v, B_1, k \ominus B_1 \rangle$,
where $B_1 = \text{Bart's initial budget}$

Output: **Yes** iff Bart wins the game from v with budget B_1



Continuous vs Discrete Bidding



arbitrary

Reachability

fixed granularity



Continuous vs Discrete Bidding



arbitrary

Reachability

fixed granularity

Theorem[LLPU '96, LLPSU '99]:

- (1) Threshold budgets exist
- (2) Threshold budgets satisfy **average property**
- (3) Bids are derived from the thresholds
- (4) Computing threshold budgets is in $NP \cap coNP$



Continuous vs Discrete Bidding



arbitrary

Reachability

fixed granularity

Theorem[LLPU '96, LLPSU '99]:

- (1) Threshold budgets exist
- (2) Threshold budgets satisfy **average property**
- (3) Bids are derived from the thresholds
- (4) Computing threshold budgets is in $NP \cap coNP$

Theorem[Develin & Payne '09]:

A discrete version of (1)-(3) holds
EXPTIME value iteration algorithm for computing thresholds.



Continuous vs Discrete Bidding



arbitrary

Reachability

fixed granularity

Theorem[LLPU '96, LLPSU '99]:

- (1) Threshold budgets exist
- (2) Threshold budgets satisfy **average property**
- (3) Bids are derived from the thresholds
- (4) Computing threshold budgets is in $NP \cap coNP$

Theorem[Develin & Payne '09]:

A discrete version of (1)-(3) holds
EXPTIME value iteration algorithm for computing thresholds.

Buchi



Continuous vs Discrete Bidding



arbitrary

Reachability

fixed granularity

Theorem[LLPU '96, LLPSU '99]:

- (1) Threshold budgets exist
- (2) Threshold budgets satisfy **average property**
- (3) Bids are derived from the thresholds
- (4) Computing threshold budgets is in $NP \cap coNP$

Theorem[Develin & Payne '09]:

A discrete version of (1)-(3) holds
 EXPTIME value iteration algorithm for computing thresholds.

Buchi

Theorem[Avni, Henzinger, Chonev '19]:
 (Easily) Reduce to reachability games



Continuous vs Discrete Bidding



arbitrary

Reachability

fixed granularity

Theorem[LLPU '96, LLPSU '99]:

- (1) Threshold budgets exist
- (2) Threshold budgets satisfy **average property**
- (3) Bids are derived from the thresholds
- (4) Computing threshold budgets is in $NP \cap coNP$

Theorem[Develin & Payne '09]:

A discrete version of (1)-(3) holds
 EXPTIME value iteration algorithm for computing thresholds.

Buchi

Theorem[Avni, Henzinger, Chonev '19]:
 (Easily) Reduce to reachability games

Theorem[Aghajohari, Avni, Henzinger '21]:
 Muller games are determined



Continuous vs Discrete Bidding



arbitrary

Reachability

fixed granularity

Theorem[LLPU '96, LLPSU '99]:

- (1) Threshold budgets exist
- (2) Threshold budgets satisfy **average property**
- (3) Bids are derived from the thresholds
- (4) Computing threshold budgets is in $NP \cap coNP$

Theorem[Develin & Payne '09]:

A discrete version of (1)-(3) holds
 EXPTIME value iteration algorithm for computing thresholds.

Buchi

Theorem[Avni, Henzinger, Chonev '19]:
 (Easily) Reduce to reachability games

Theorem[Aghajohari, Avni, Henzinger '21]:
 Muller games are determined

- No known structure on the threshold budgets
- Do Threshold budgets satisfy the average property?
- Do threshold budgets give rise to bids?
- Best algorithm to compute them is exponential



Continuous vs Discrete Bidding



arbitrary

Reachability

fixed granularity

Theorem[LLPU '96, LLPSU '99]:

- (1) Threshold budgets exist
- (2) Threshold budgets satisfy **average property**
- (3) Bids are derived from the thresholds
- (4) Computing threshold budgets is in $NP \cap coNP$

Theorem[Develin & Payne '09]:

A discrete version of (1)-(3) holds
EXPTIME value iteration algorithm for computing thresholds.

Buchi

Theorem[Avni, Henzinger, Chonev '19]:
(Easily) Reduce to reachability games

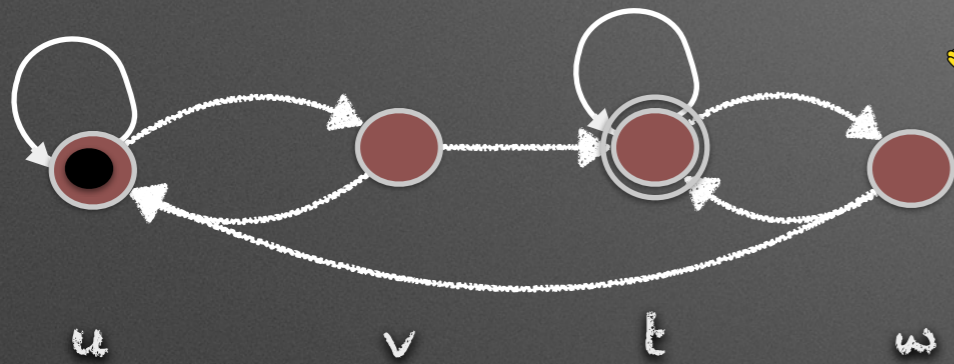
Theorem[Aghajohari, Avni, Henzinger '21]:
Muller games are determined

- No known structure on the threshold budgets
- Do Threshold budgets satisfy the average property? 🔍
- Do threshold budgets give rise to bids? 🔍
- Best algorithm to compute them is exponential 🔍

Buchi Games

Buchi winning condition:

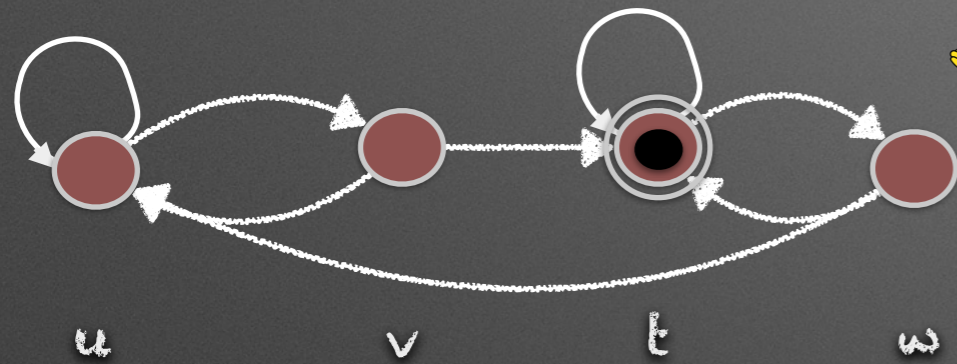
Bart wins iff the set of target vertices T is visited infinitely often



Buchi Games

Buchi winning condition:

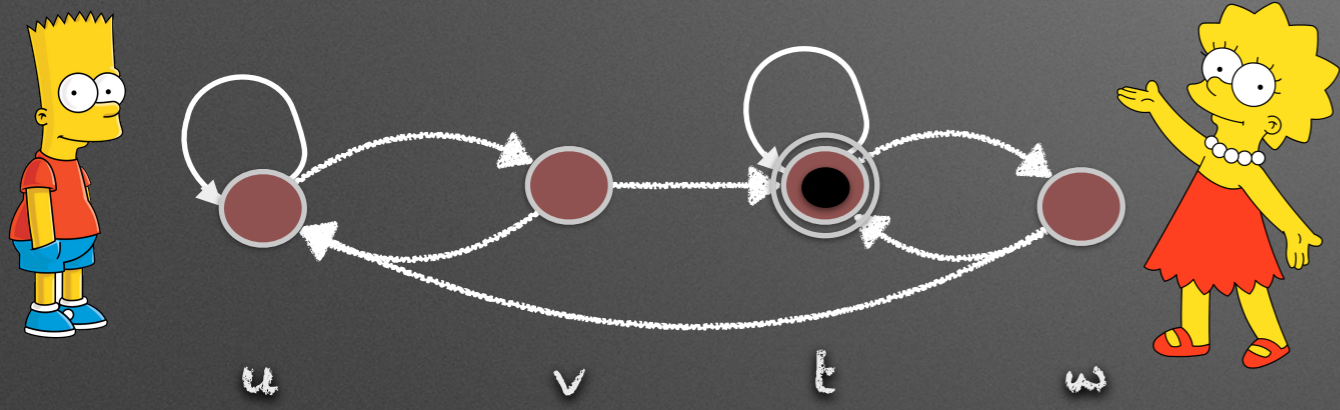
Bart wins iff the set of target vertices T is visited infinitely often



Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



Determinacy [Aghajohari et al'21]



Computing Bart's Buchi Threshold

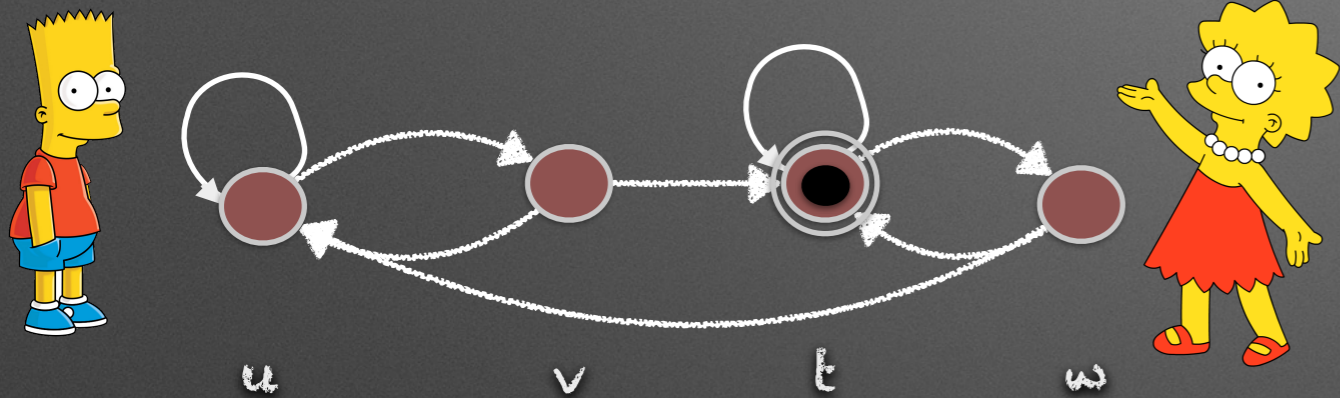


Computing Lisa's coBuchi Threshold

Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



Determinacy [Aghajohari et al'21]



Computing Bart's Buchi Threshold



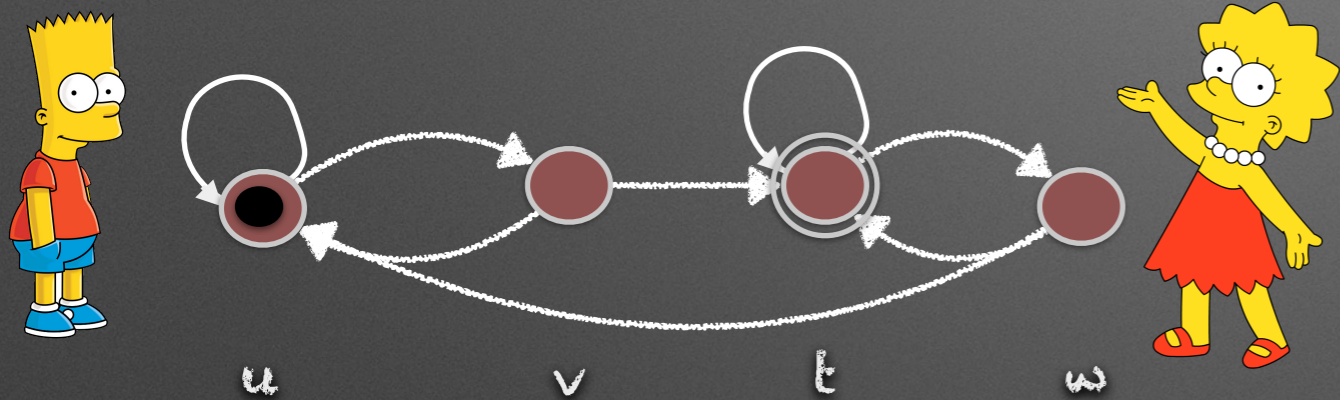
Computing Lisa's coBuchi Threshold

visit t finitely often

Fixed-point Algorithm for co-Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



Determinacy [Aghajohari et al'21]



Computing Bart's Buchi Threshold



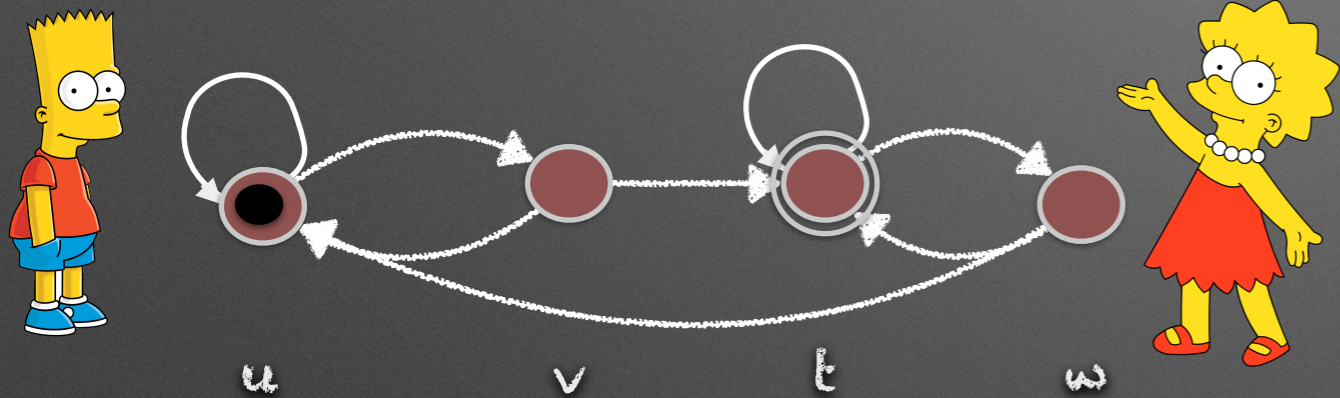
Computing Lisa's coBuchi Threshold

visit t finitely often

Fixed-point Algorithm for co-Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



Determinacy [Aghajohari et al'21]



Computing Bart's Buchi Threshold



Computing Lisa's coBuchi Threshold

visit t finitely often

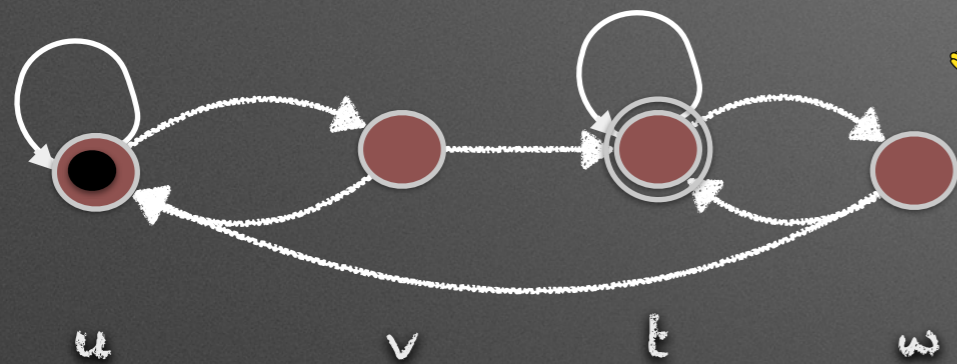
Fixed-point Algorithm for co-Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



t



Determinacy [Aghajohari et al'21]



Computing Bart's Buchi Threshold



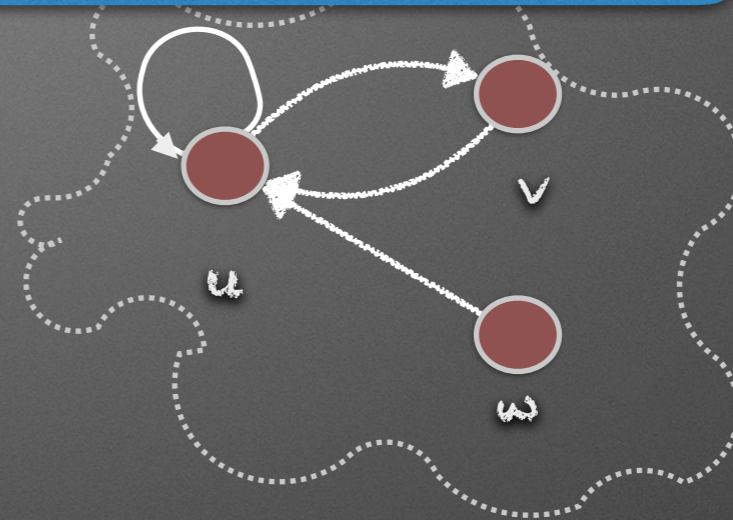
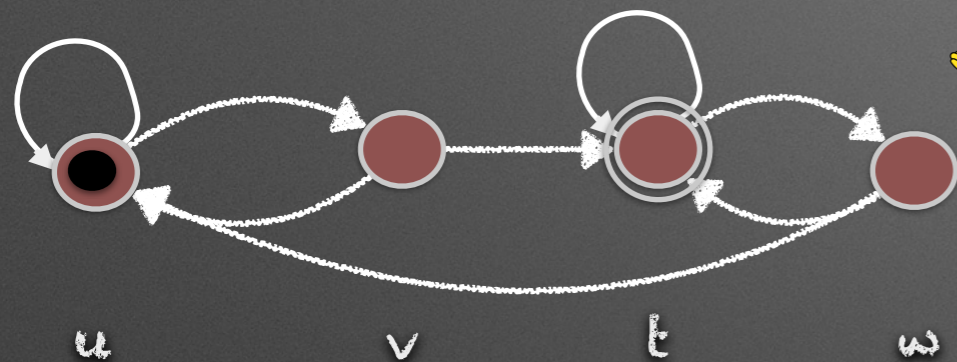
Computing Lisa's coBuchi Threshold

visit t finitely often

Fixed-point Algorithm for co-Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



Determinacy [Aghajohari et al'21]



Computing Bart's Buchi Threshold



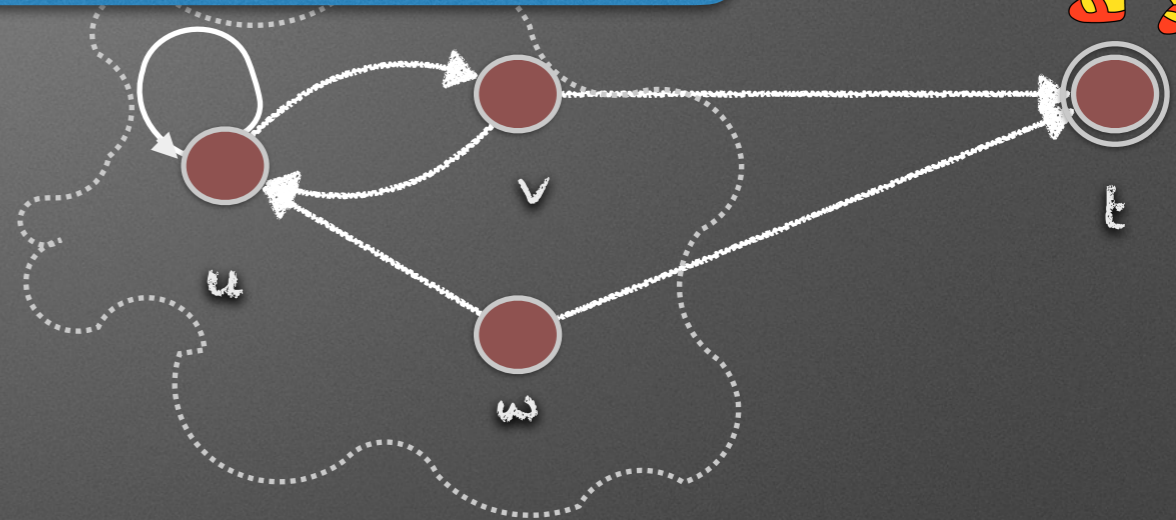
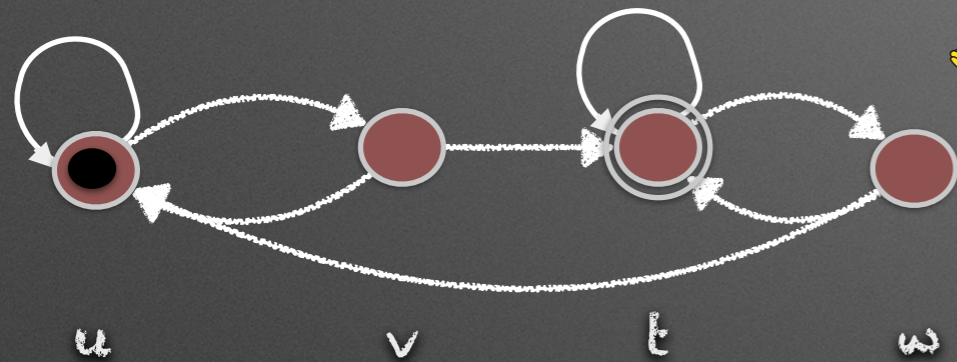
Computing Lisa's coBuchi Threshold

visit t finitely often

Fixed-point Algorithm for co-Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



Determinacy [Aghajohari et al'21]



Computing Bart's Buchi Threshold



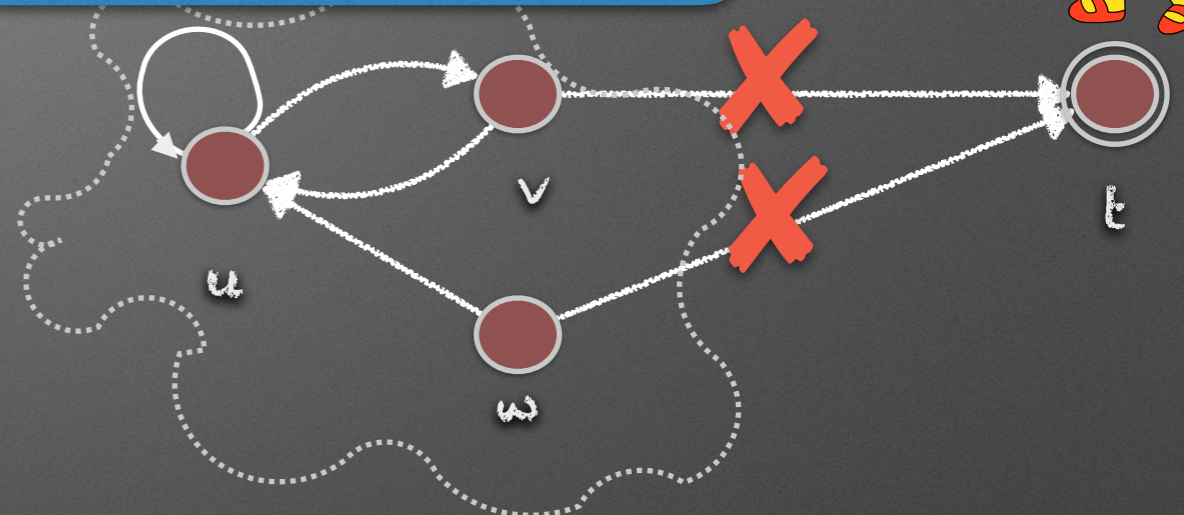
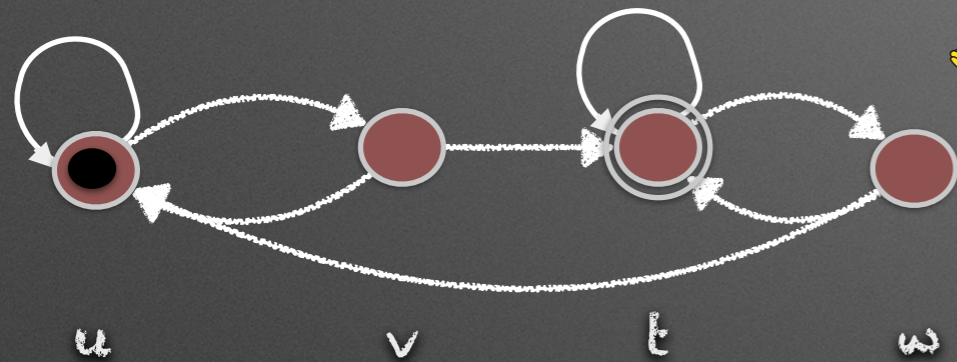
Computing Lisa's coBuchi Threshold

visit t finitely often

Fixed-point Algorithm for co-Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



Determinacy [Aghajohari et al'21]



Computing Bart's Buchi Threshold



Computing Lisa's coBuchi Threshold

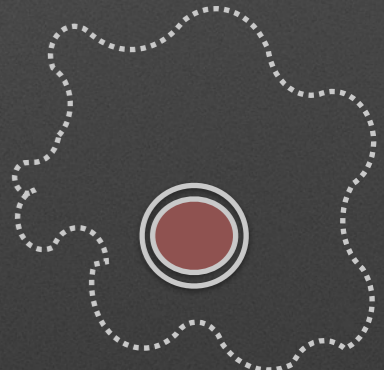
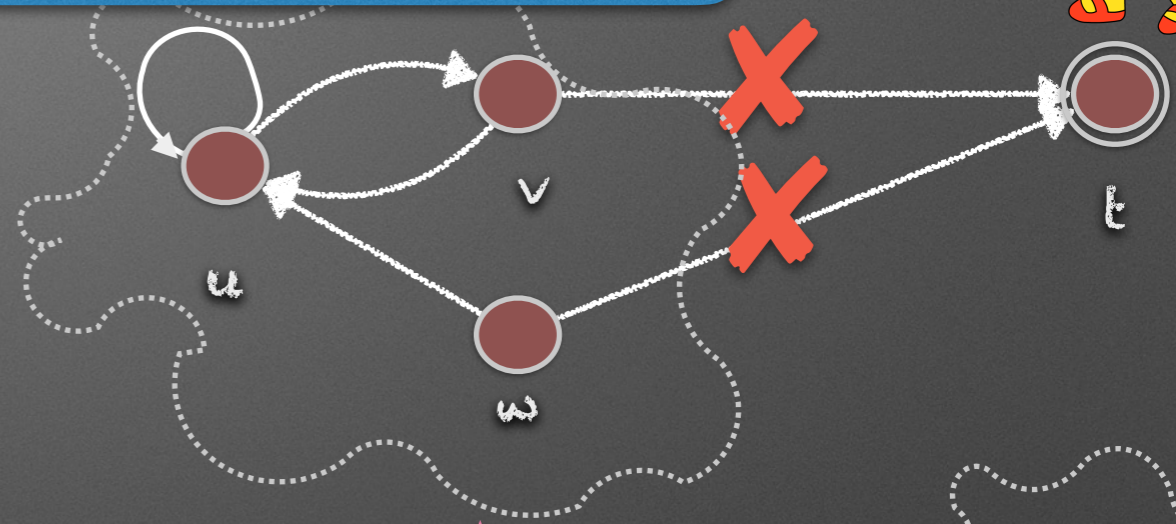
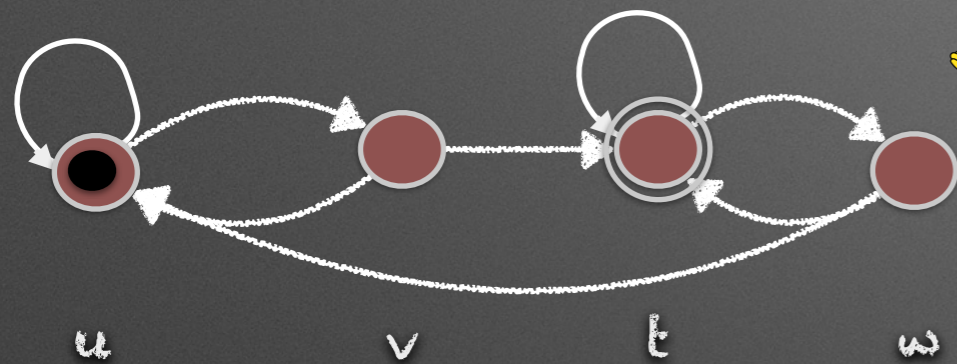
visit t finitely often

visit t never (safety)

Fixed-point Algorithm for co-Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



Determinacy [Aghajohari et al'21]



Computing Bart's Buchi Threshold



Computing Lisa's coBuchi Threshold

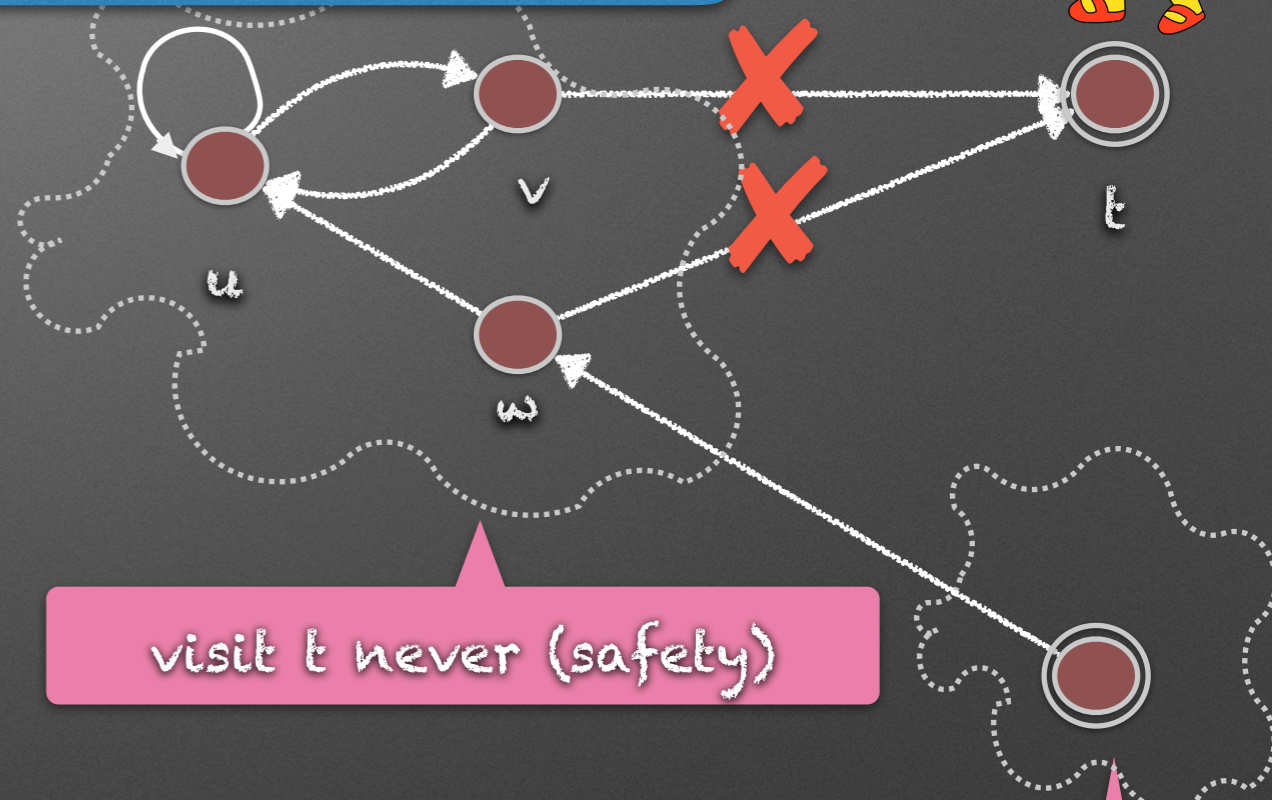
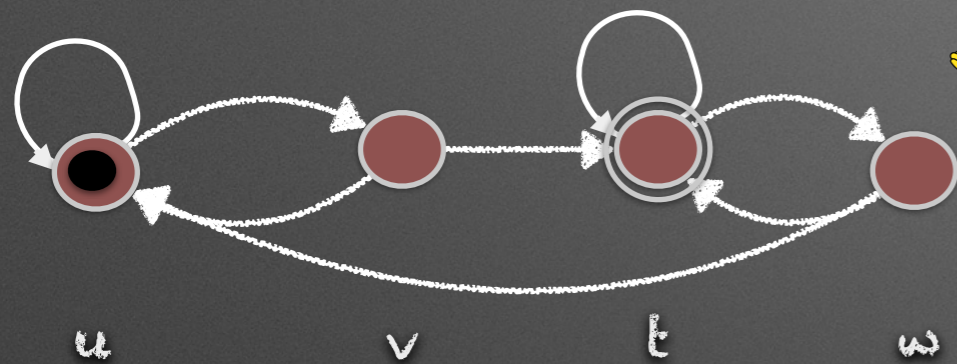
visit t finitely often

visit t never (safety)

Fixed-point Algorithm for co-Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



Determinacy [Aghajohari et al'21]



Computing Bart's Buchi Threshold



Computing Lisa's coBuchi Threshold

visit t finitely often

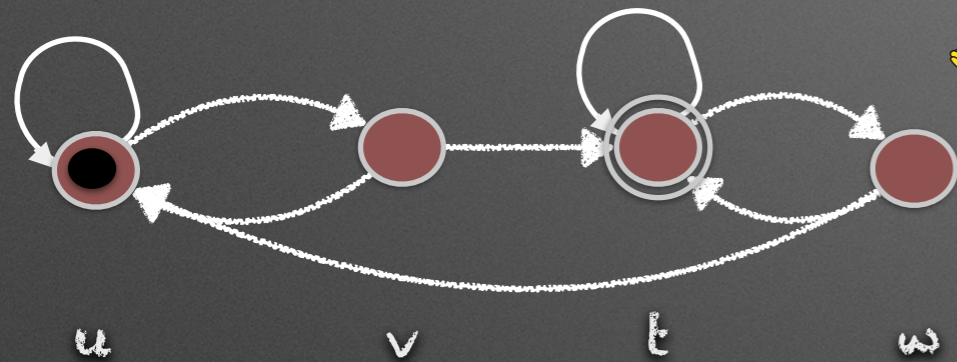
visit t never (safety)

visit $V \setminus \{t\}$ with a target budget (frugal-reachability)

Fixed-point Algorithm for co-Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



Determinacy [Aghajohari et al'21]

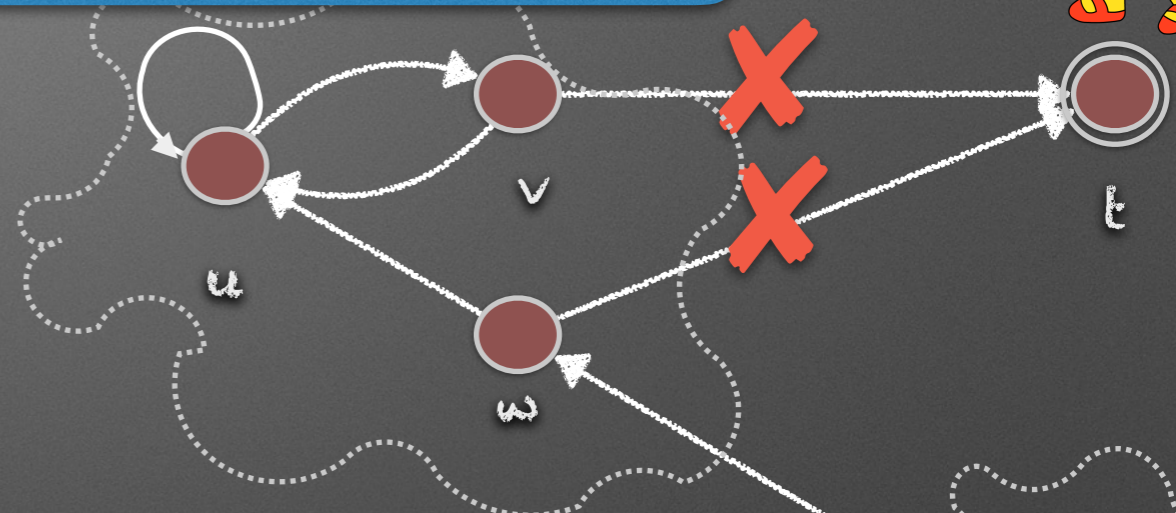


Computing Bart's Buchi Threshold

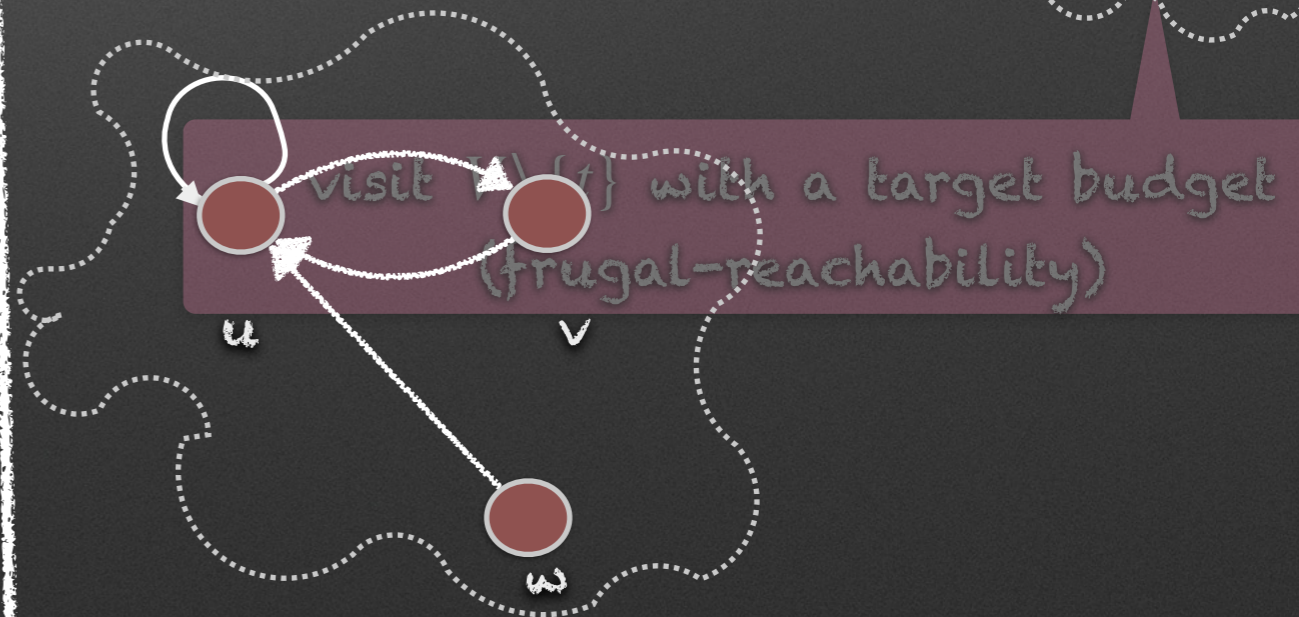


Computing Lisa's coBuchi Threshold

visit t finitely often



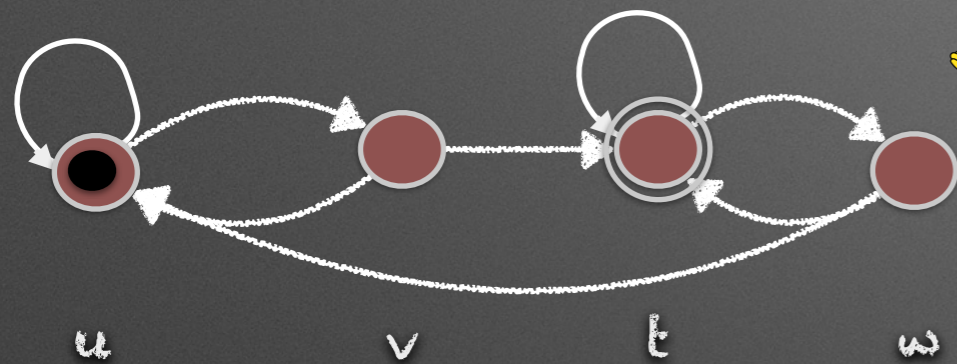
visit t never (safety)



Fixed-point Algorithm for co-Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



Determinacy [Aghajohari et al'21]

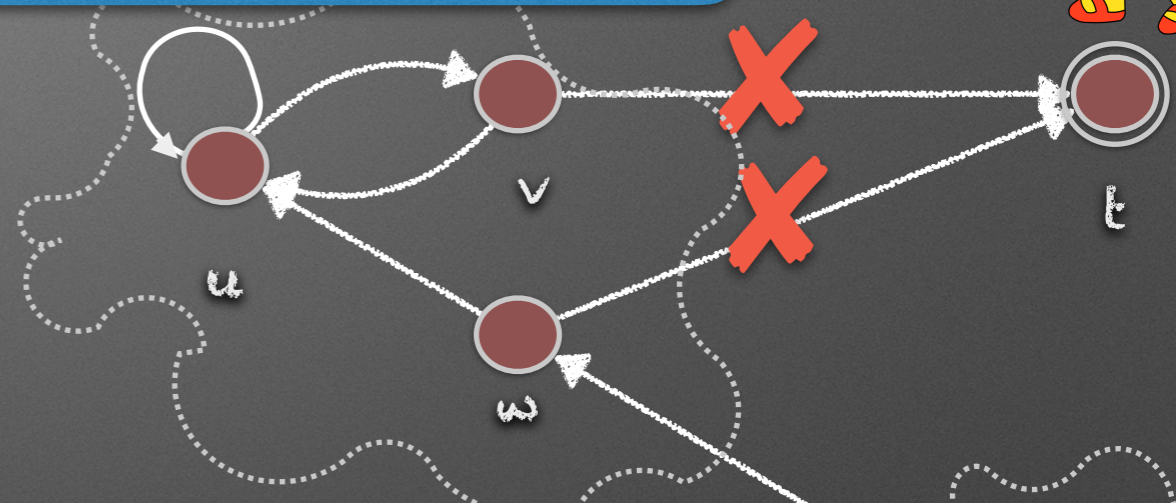


Computing Bart's Buchi Threshold

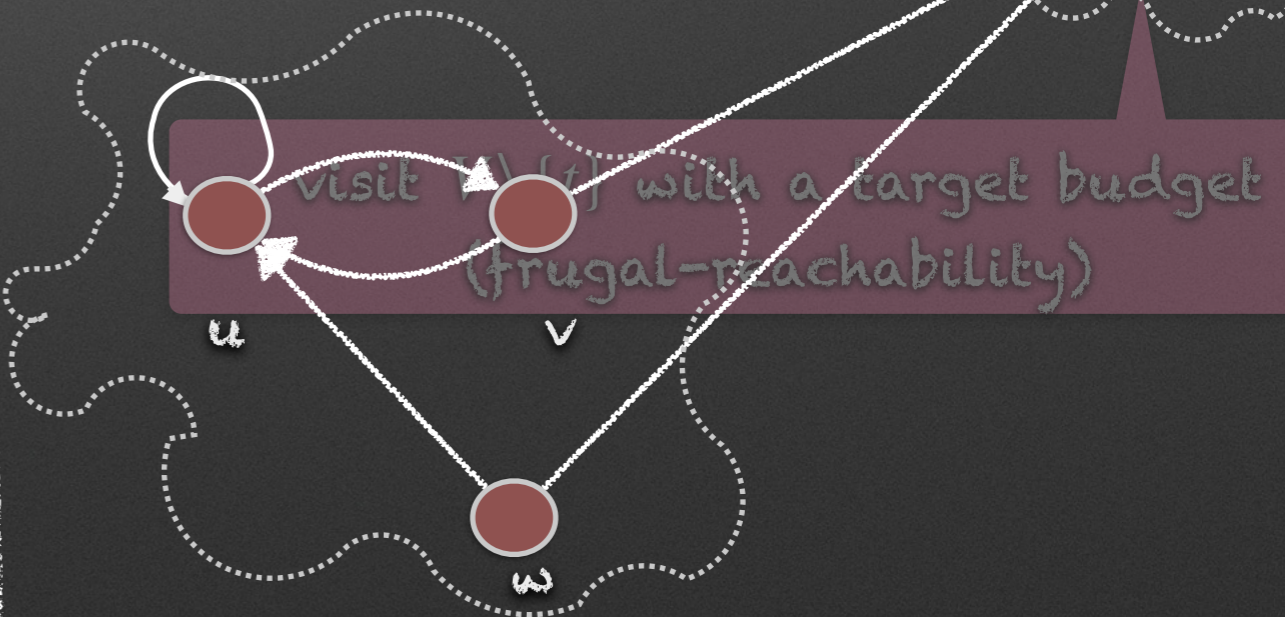


Computing Lisa's coBuchi Threshold

visit t finitely often



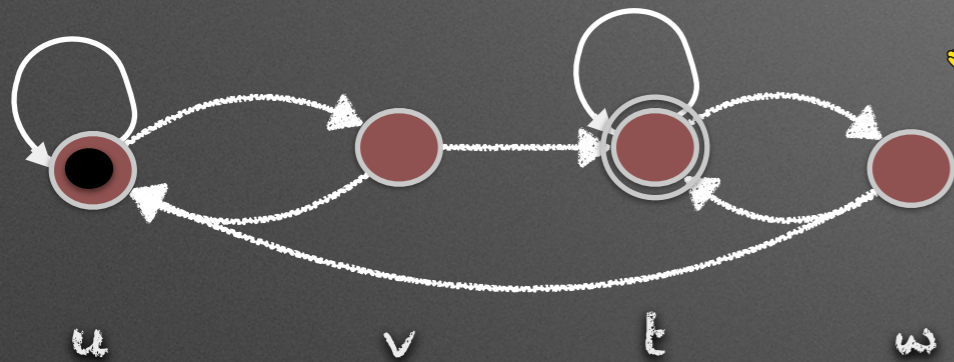
visit t never (safety)



Fixed-point Algorithm for co-Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



Determinacy [Aghajohari et al'21]

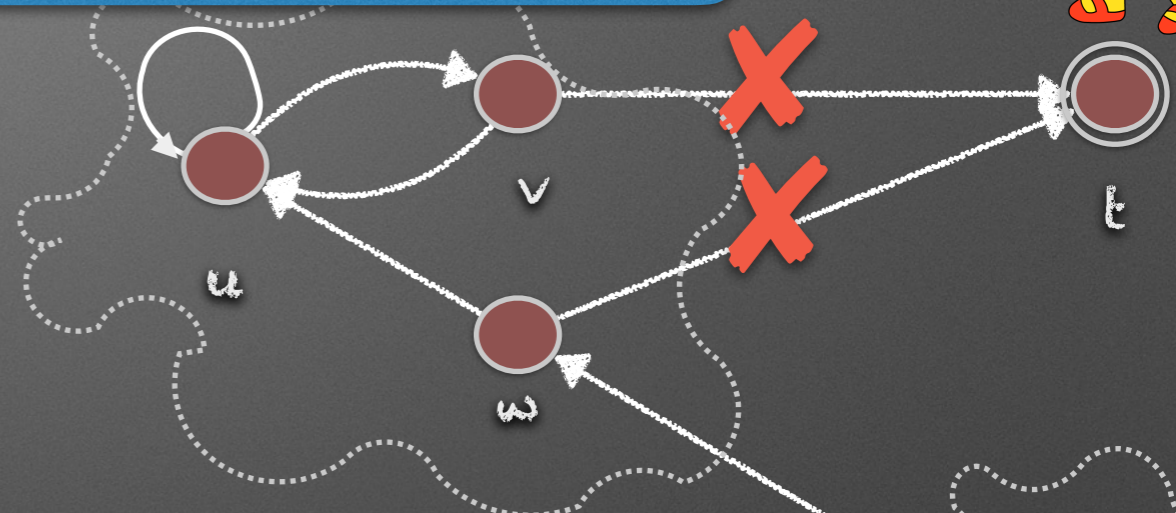


Computing Bart's Buchi Threshold

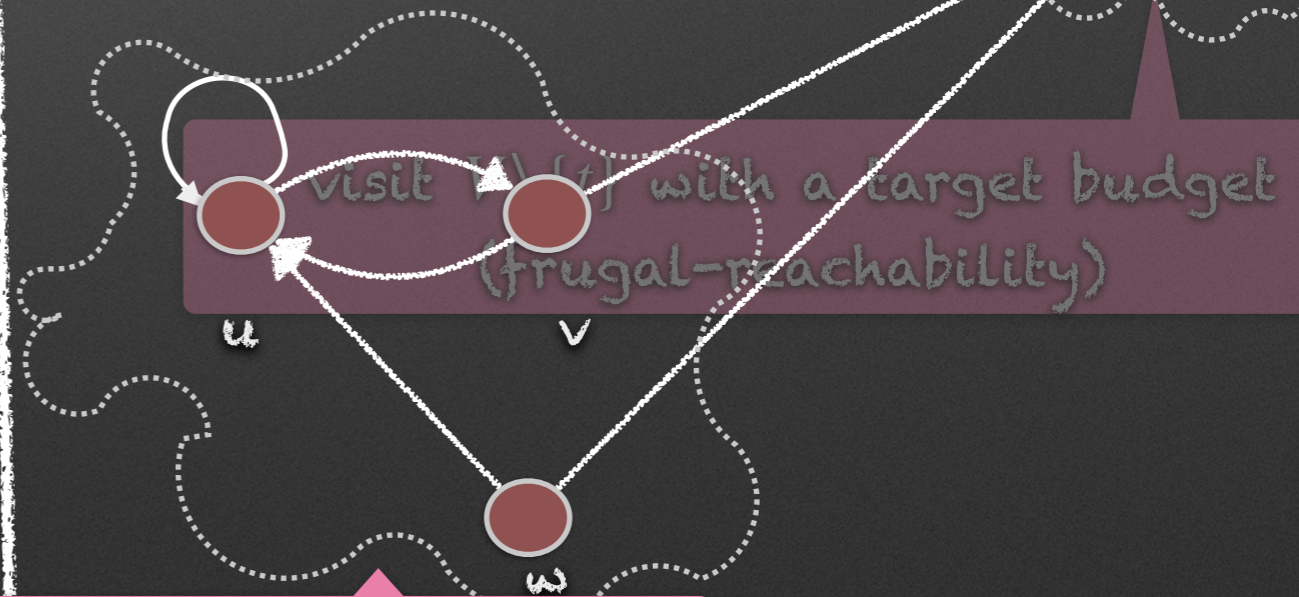


Computing Lisa's coBuchi Threshold

visit t finitely often



visit t never (safety)

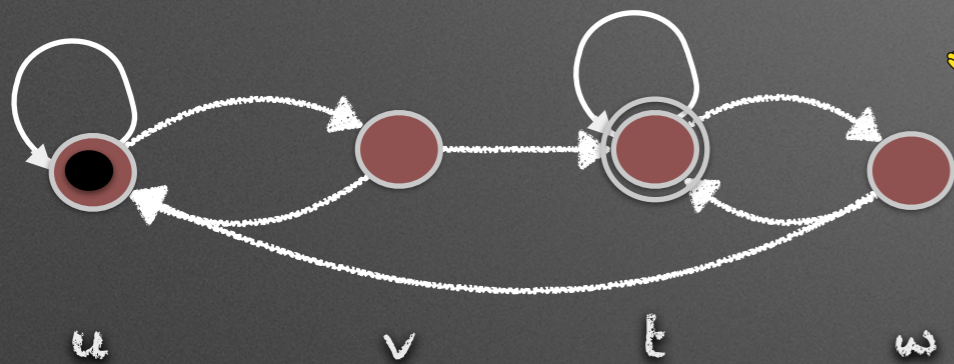


visit t with a target budget

Fixed-point Algorithm for co-Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



Determinacy [Aghajohari et al'21]

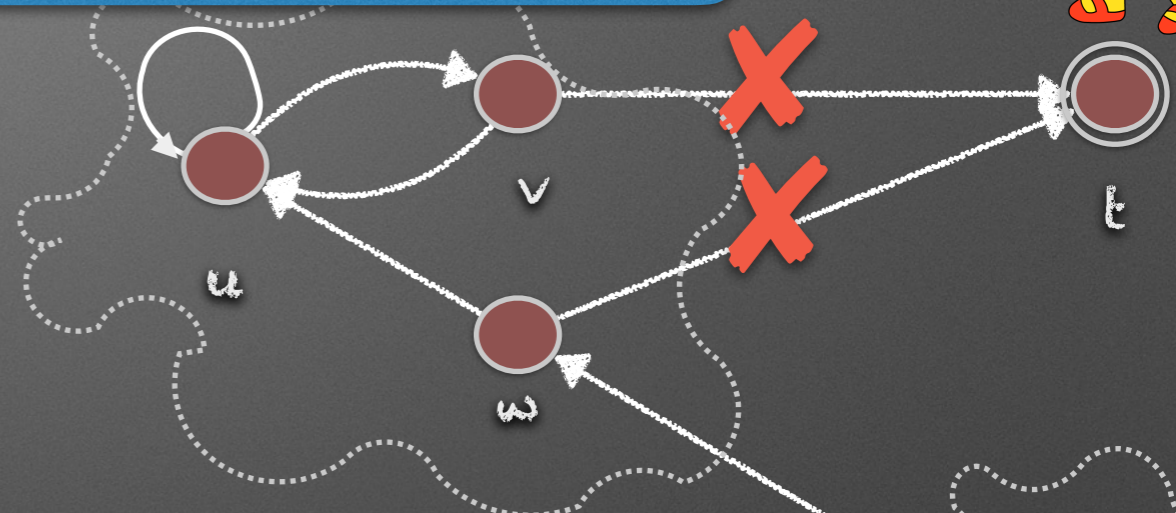


Computing Bart's Buchi Threshold

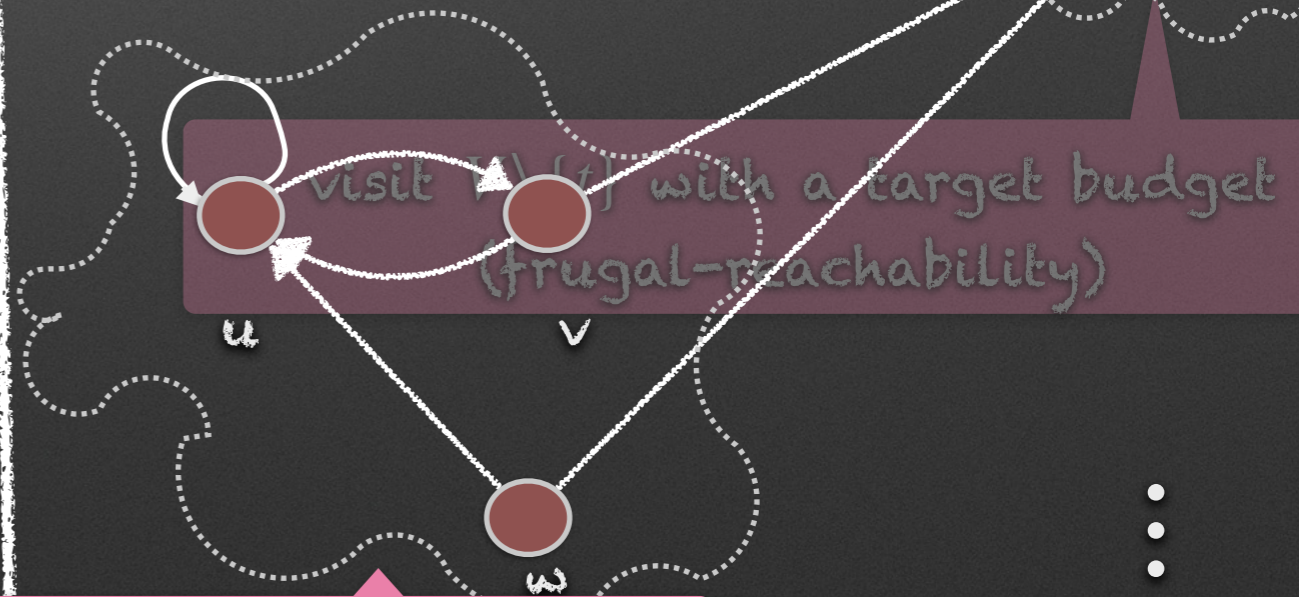


Computing Lisa's coBuchi Threshold

visit t finitely often



visit t never (safety)

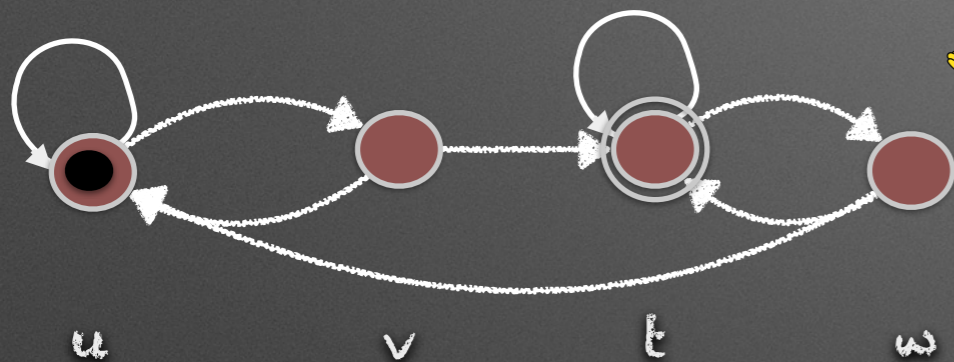


visit t with a target budget

Fixed-point Algorithm for co-Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



Determinacy [Aghajohari et al'21]

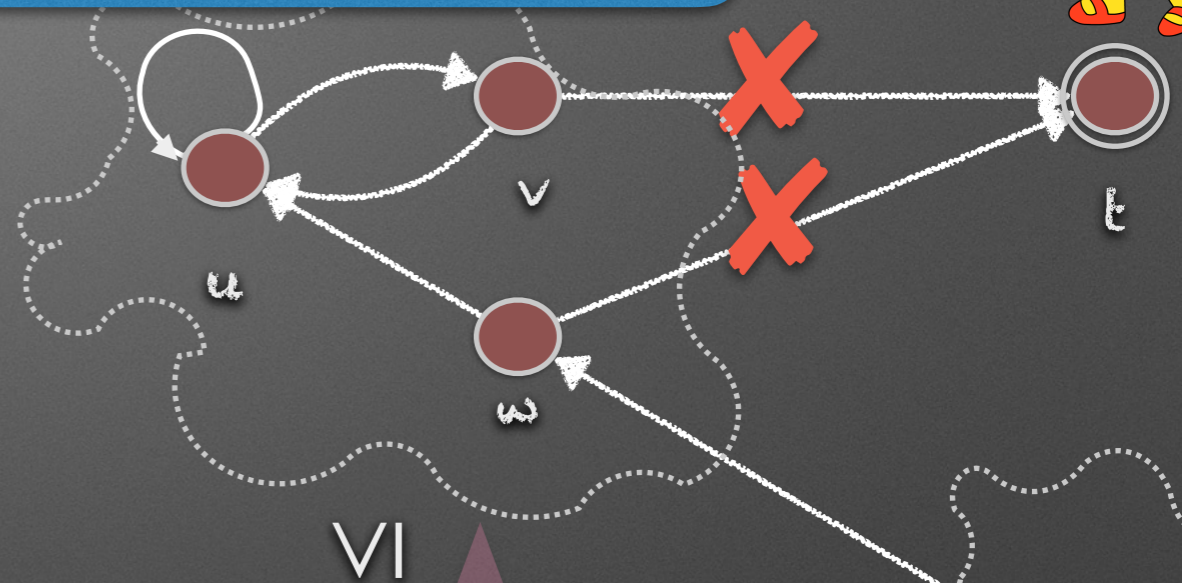


Computing Bart's Buchi Threshold

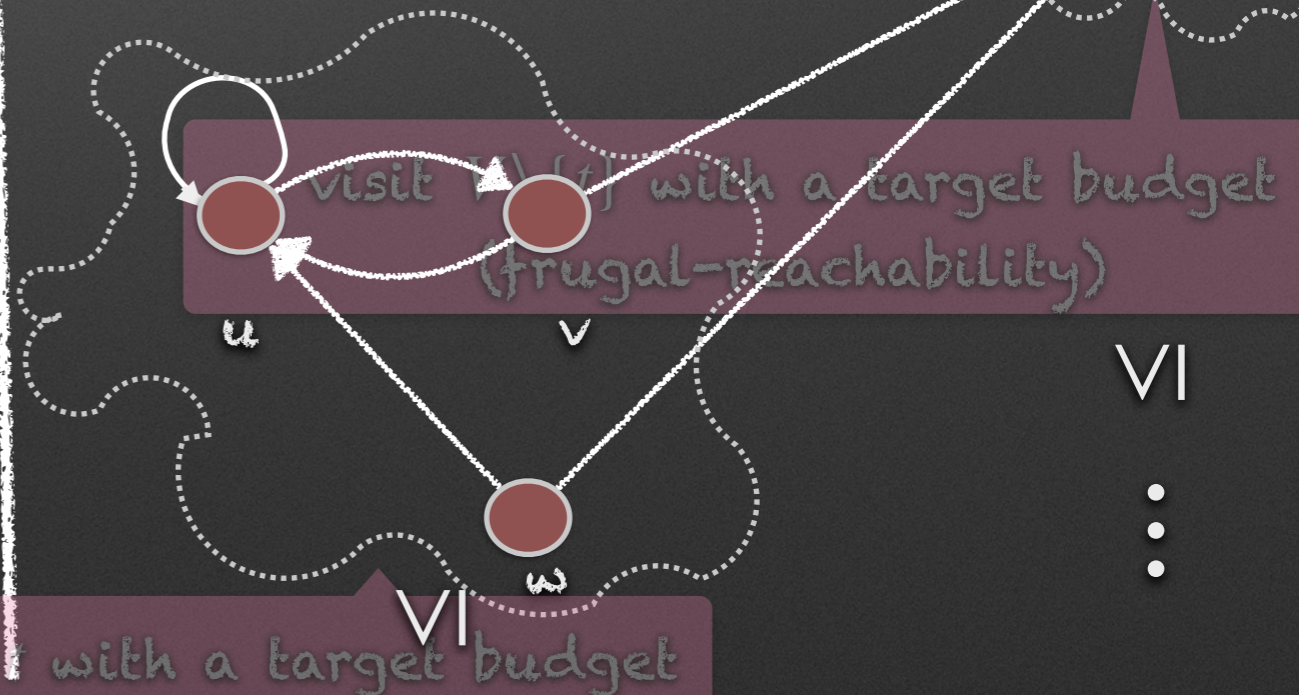


Computing Lisa's coBuchi Threshold

visit t finitely often



visit t never (safety)



visit t with a target budget (frugal-reachability)

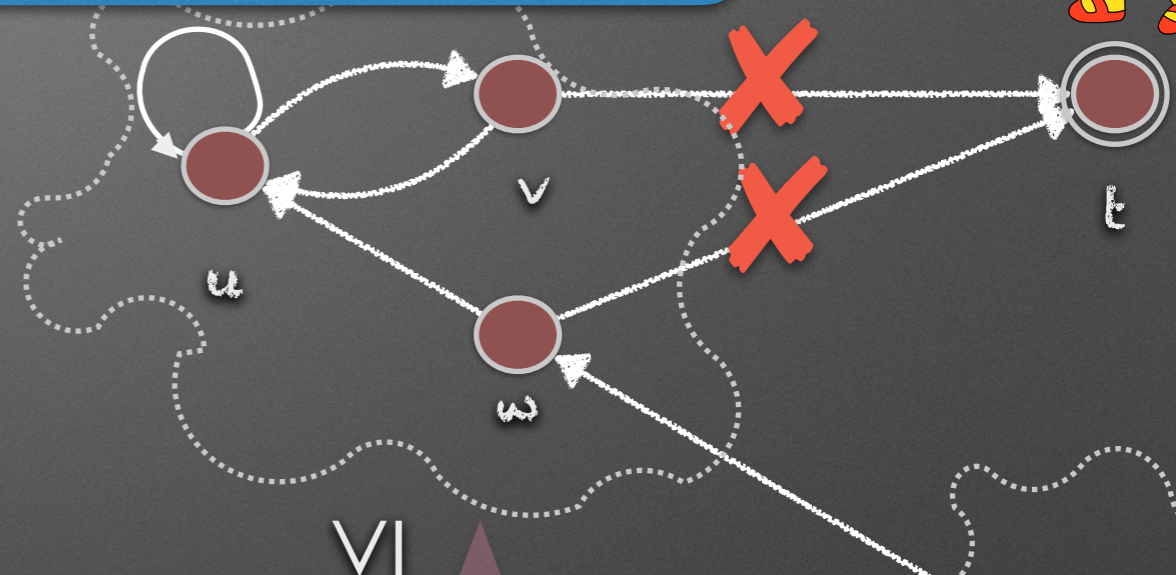
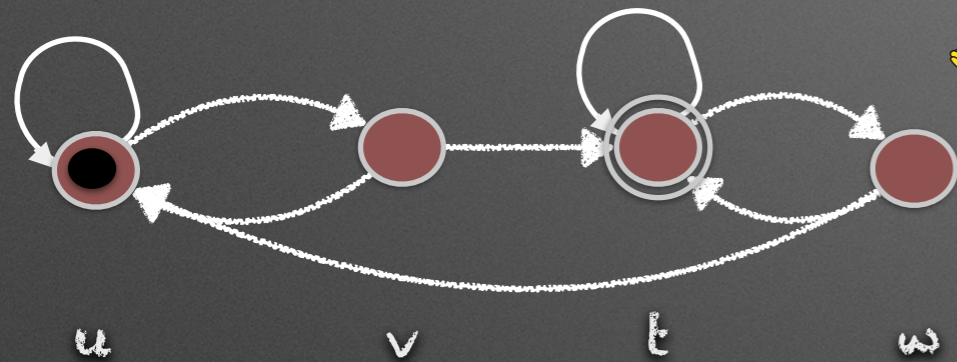
visit t with a target budget

VI
⋮

Fixed-point Algorithm for co-Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



visit t never (safety)

Determinacy [Aghajohari et al'21]

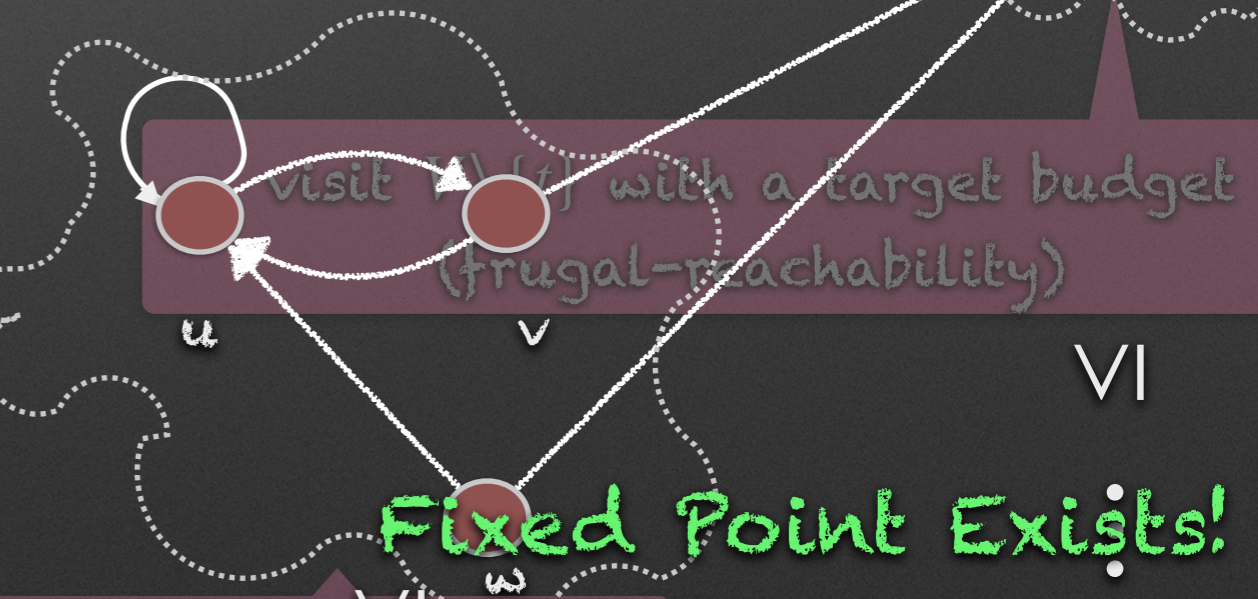


Computing Bart's Buchi Threshold



Computing Lisa's coBuchi Threshold

visit t finitely often



visit T with a target budget (frugal-reachability)

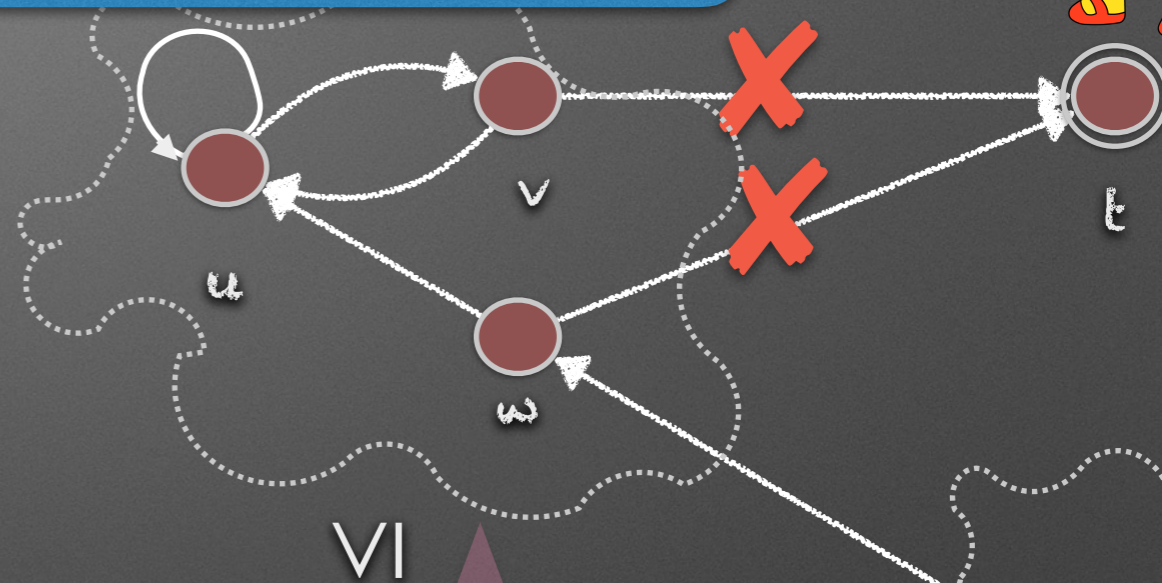
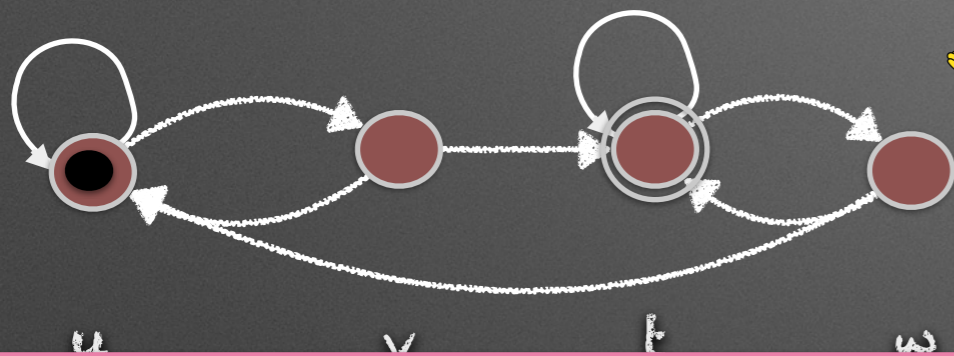
Fixed Point Exists!

visit t with a target budget

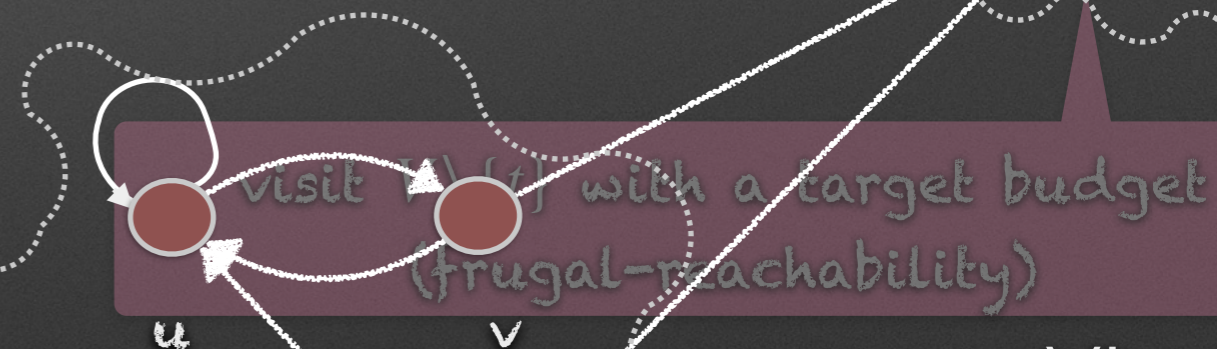
Fixed-point Algorithm for co-Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



visit t never (safety)



visit $T \setminus \{t\}$ with a target budget (frugal-reachability)

Fixed Point Exists!

visit t with a target budget

No known structure on the threshold budgets

- ✓ Do Threshold budgets satisfy the average property?
- ✓ Do threshold budgets give rise to bids?
- 🔍 Best algorithm to compute them is exponential

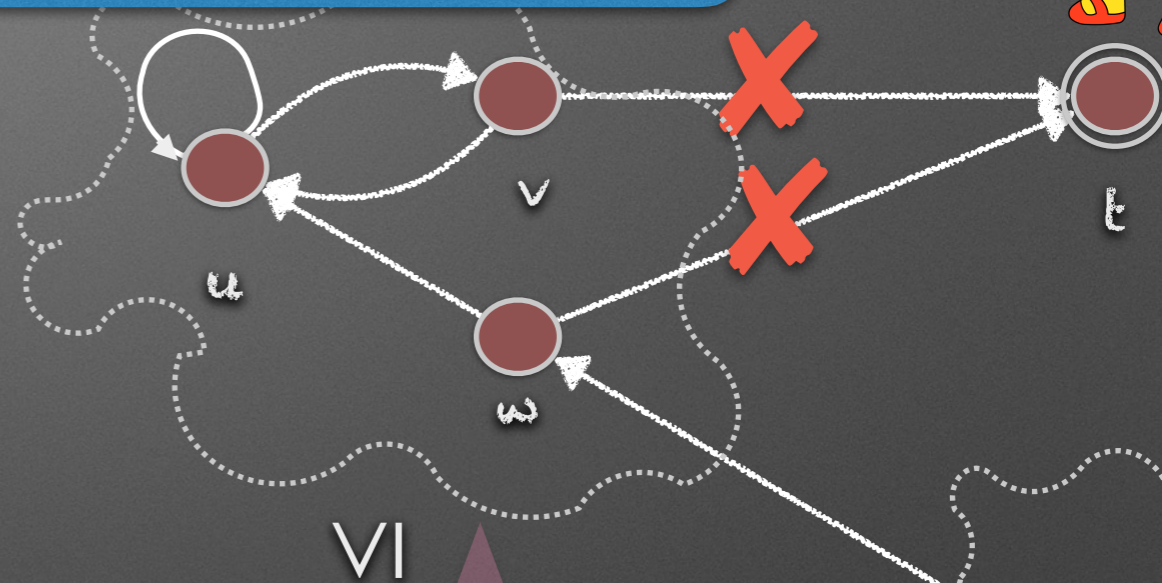
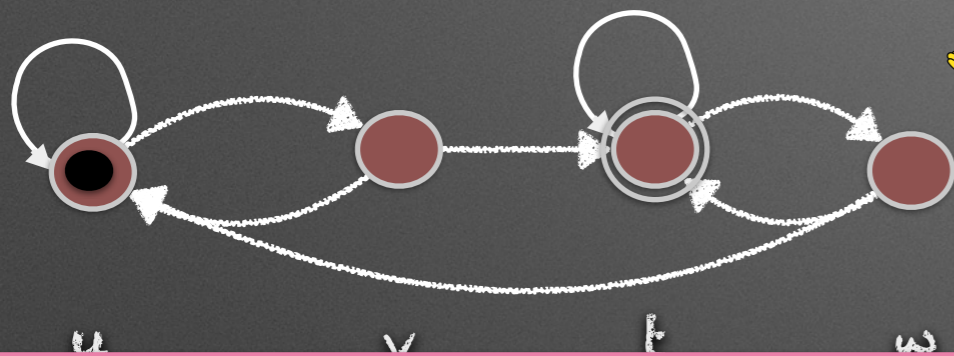
Computing Lisa's coBuchi Threshold

visit t finitely often

Fixed-point Algorithm for co-Buchi Games

Buchi winning condition:

Bart wins iff the set of target vertices T is visited infinitely often



visit t never (safety)

No known structure on the threshold budgets

- ✓ Do Threshold budgets satisfy the average property?
- ✓ Do threshold budgets give rise to bids?
- 🔍 Best algorithm to compute them is exponential

Computing Lis

Corollaries: [Avni & S.]

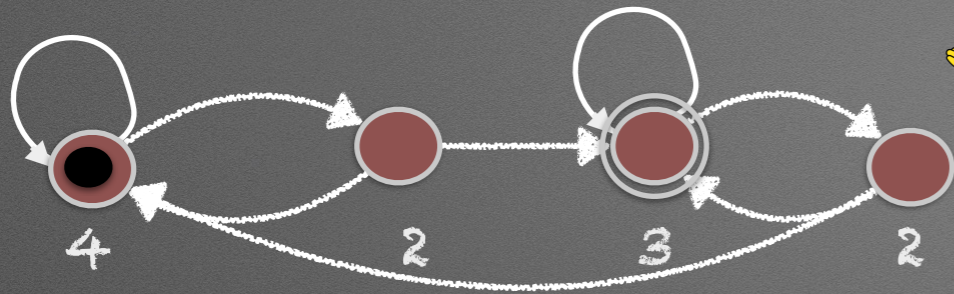
- (1) Threshold budgets satisfy a discrete average property
- (2) Optimal bids arise from the thresholds

visi



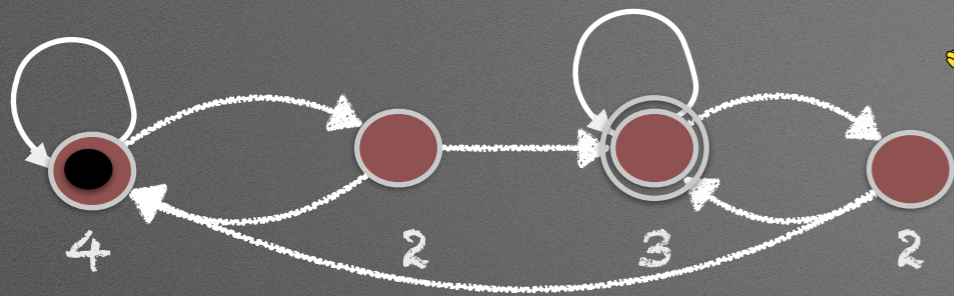
point ts!

Fixed-point algorithm for Parity Games



Parity Winning Condition:
Bart (Player 1) wins iff infinitely
occurring max priority is **odd**.

Fixed-point algorithm for Parity Games



Parity Winning Condition:
 Bart (Player 1) wins iff infinitely occurring max priority is **odd**.

Parity $\leq d-1$



Parity = d

$$T_1 = \text{fr-parity}(t, k+1)$$

$$R_1 = \text{fr-Reach}(v, T_1)$$

$$T_2 = \text{fr-parity}(t, R_1)$$

⋮

$$T_n = \text{fr-parity}(t, R_{n-1})$$

$$R_n = \text{fr-Reach}(v, T_n)$$

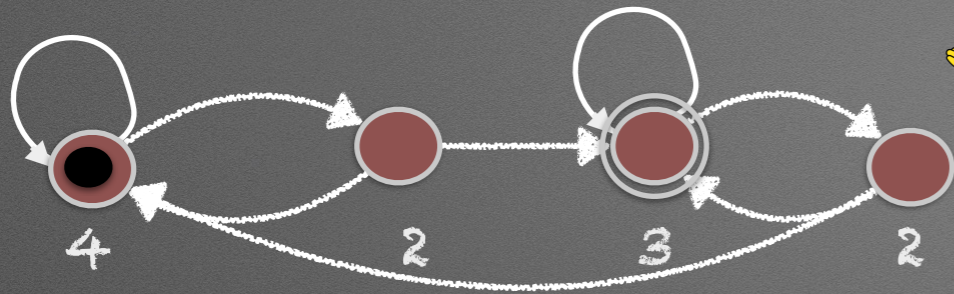
Theorem:
 $Th_{\text{Parity}}(v) = T_n$

||

$$T_{n+1} = \text{fr-Parity}(t, R_n)$$

Additionally: Induction on parities

Fixed-point algorithm for Parity Games



Parity Winning Condition:
Bart (Player 1) wins iff infinitely occurring max priority is **odd**.

No known structure on the threshold budgets

✓ Do Threshold budgets satisfy the average property?

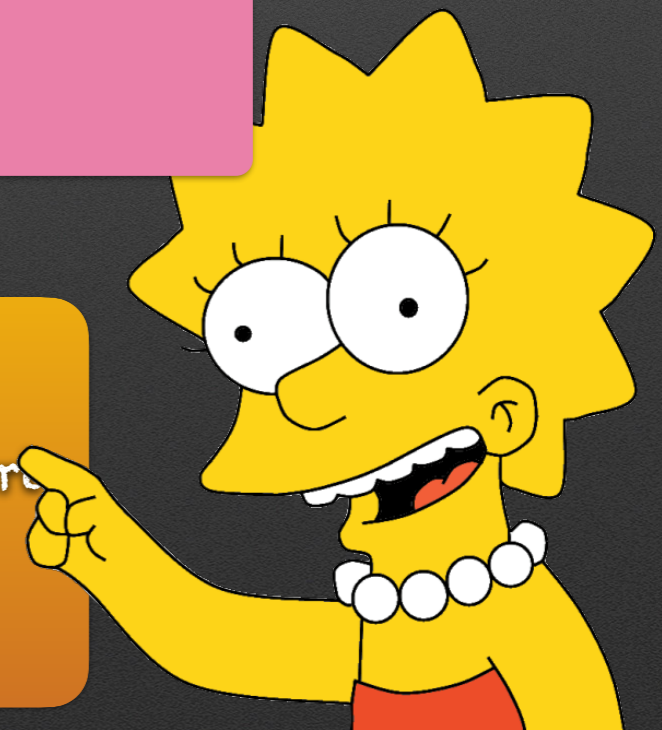
✓ Do threshold budgets give rise to bids?

🔍 Best algorithm to compute them is exponential

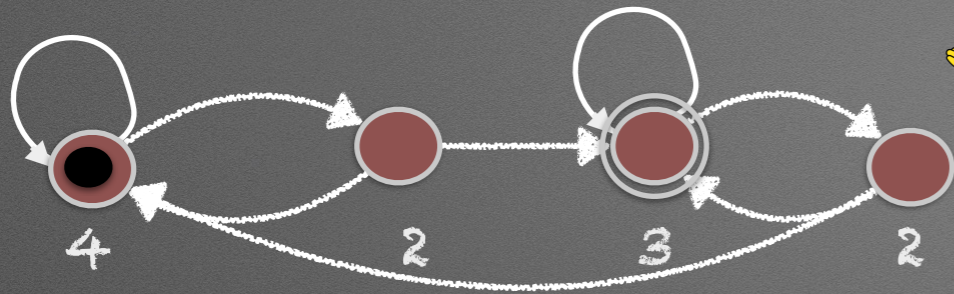
Corollaries: [Avni & S.]

(1) Threshold budgets satisfy a discrete average property

(2) Optimal bids arise from the thresholds



Fixed-point algorithm for Parity Games



Parity Winning Condition:
 Bart (Player 1) wins iff infinitely occurring max priority is **odd**.

Parity $\leq d-1$



Parity = d

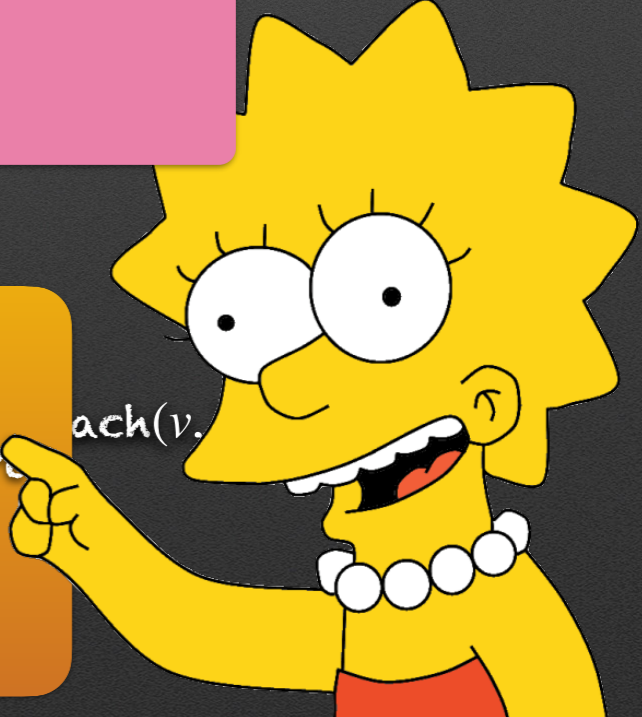
$$T_1 = \text{fr-parity}(t, k+1)$$

Auction on t

- No known structure on the threshold budgets
- ✓ Do Threshold budgets satisfy the average property?
- ✓ Do threshold budgets give rise to bids?
- 🔍 Best algorithm to compute them is exponential

The
 Th_{Parity}

Corollaries: [Avni & S.]
 (1) Threshold budgets satisfy a discrete average property
 (2) Optimal bids arise from the thresholds



$\text{ach}(v, \dots)$

Computing Threshold budgets for Parity Games

Computing Threshold budgets for Parity Games

Guess a $T : V \rightarrow [k + 1]$,
and check if it satisfies the discrete average property.

Computing Threshold budgets for Parity Games

Guess a $T : V \rightarrow [k + 1]$,
and check if it satisfies the discrete average property.

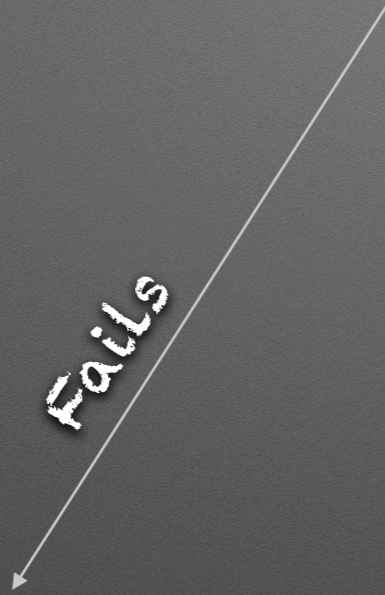
$$T(v) = \lfloor \frac{|T(v^+)| + |T(v^-)|}{2} \rfloor + \varepsilon$$

such that $\varepsilon = 0, 1$, or $*$,
($*$ denotes that the tie-breaking advantage is needed)

Computing Threshold budgets for Parity Games

Guess a $T : V \rightarrow [k + 1]$,
and check if it satisfies the discrete average property.

Fails

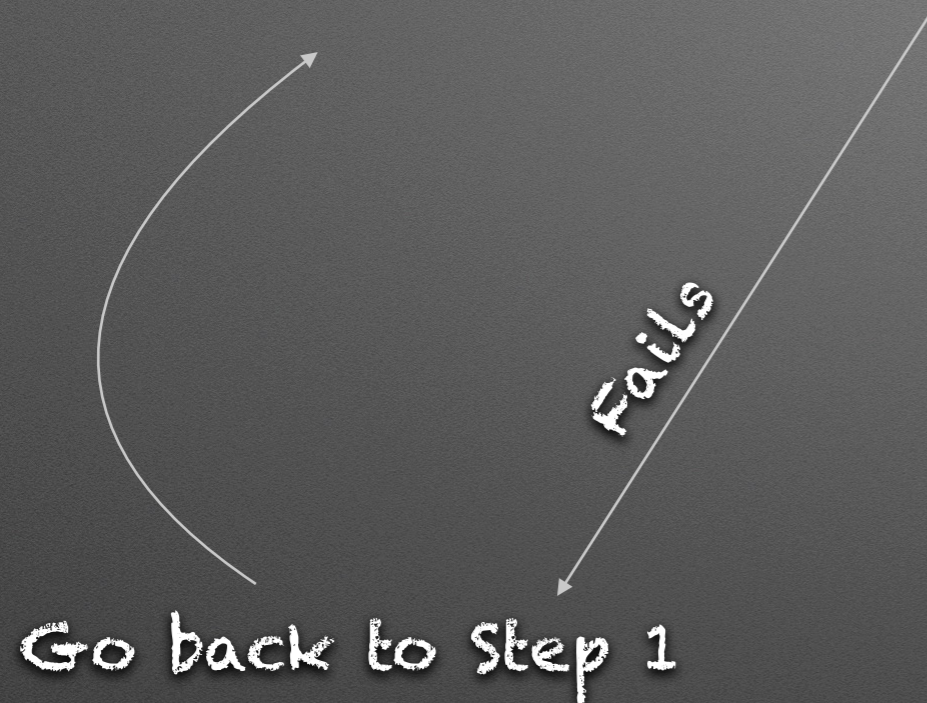


$$T(v) = \lfloor \frac{|T(v^+)| + |T(v^-)|}{2} \rfloor + \varepsilon$$

such that $\varepsilon = 0, 1$, or $*$,
($*$ denotes that the tie-breaking advantage is needed)

Computing Threshold budgets for Parity Games

Guess a $T : V \rightarrow [k + 1]$,
and check if it satisfies the discrete average property.



$$T(v) = \lfloor \frac{|T(v^+)| + |T(v^-)|}{2} \rfloor + \varepsilon$$

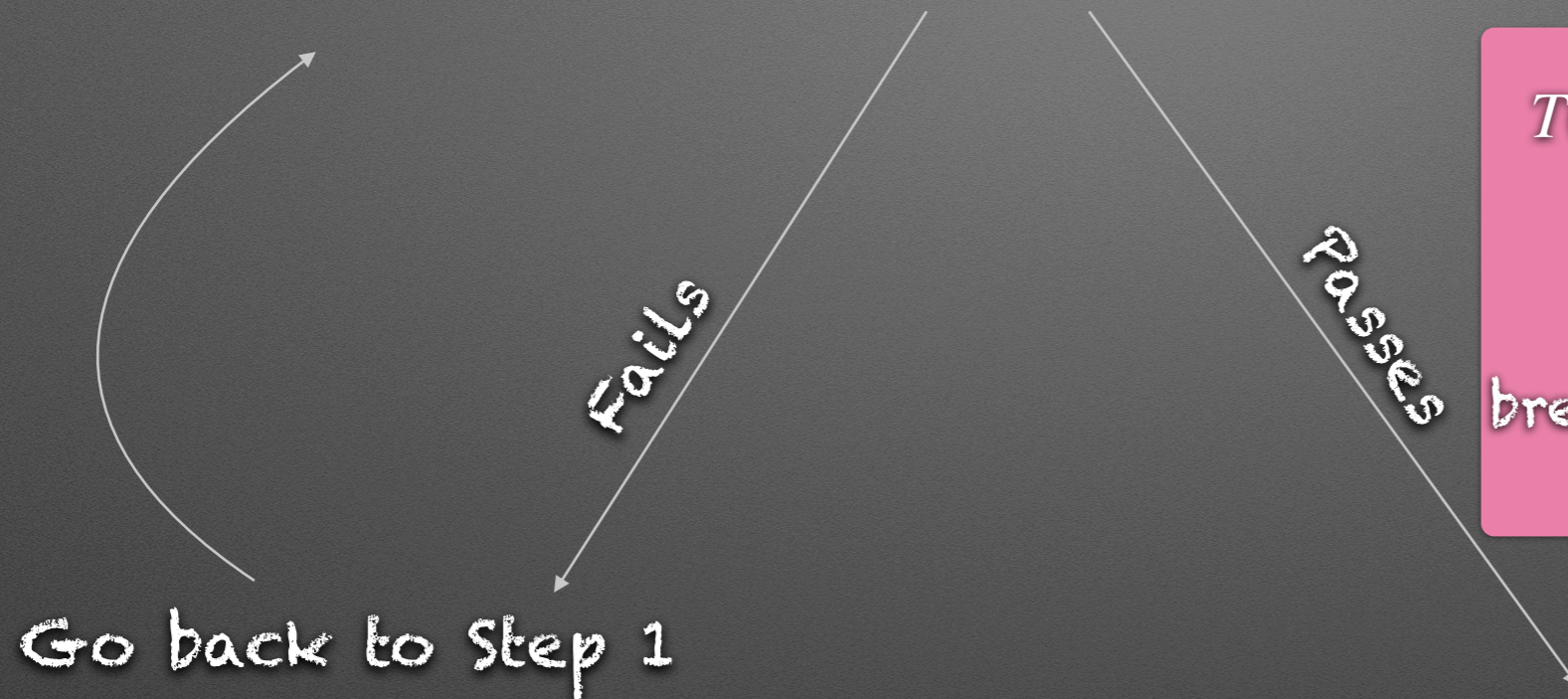
such that $\varepsilon = 0, 1$, or $*$,
($*$ denotes that the tie-breaking advantage is needed)

Computing Threshold budgets for Parity Games

Guess a $T : V \rightarrow [k + 1]$,
and check if it satisfies the discrete average property.

$$T(v) = \lfloor \frac{|T(v^+)| + |T(v^-)|}{2} \rfloor + \varepsilon$$

such that $\varepsilon = 0, 1$, or $*$,
($*$ denotes that the tie-breaking advantage is needed)

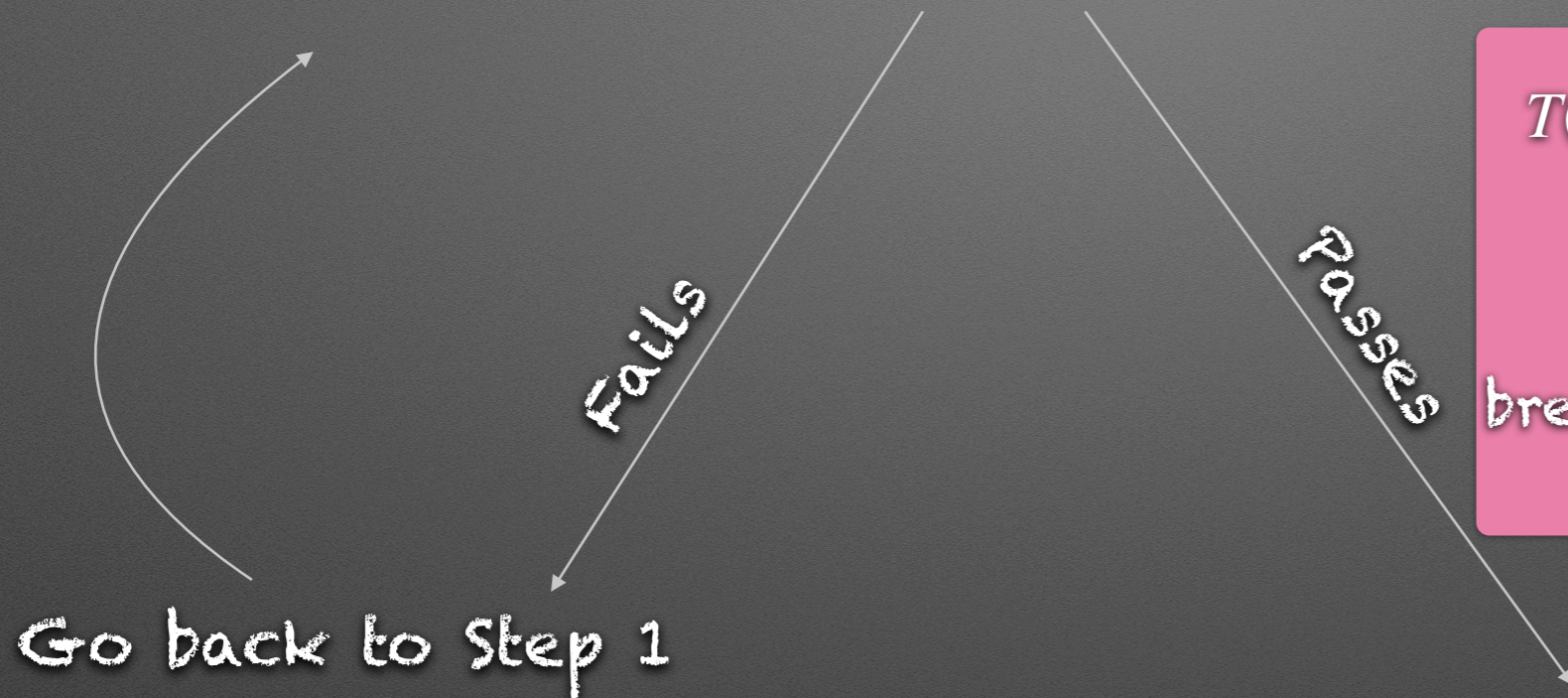


Computing Threshold budgets for Parity Games

Guess a $T : V \rightarrow [k + 1]$,
and check if it satisfies the discrete average property.

$$T(v) = \lfloor \frac{|T(v^+)| + |T(v^-)|}{2} \rfloor + \varepsilon$$

such that $\varepsilon = 0, 1$, or $*$,
(* denotes that the tie-breaking advantage is needed)



Go back to Step 1

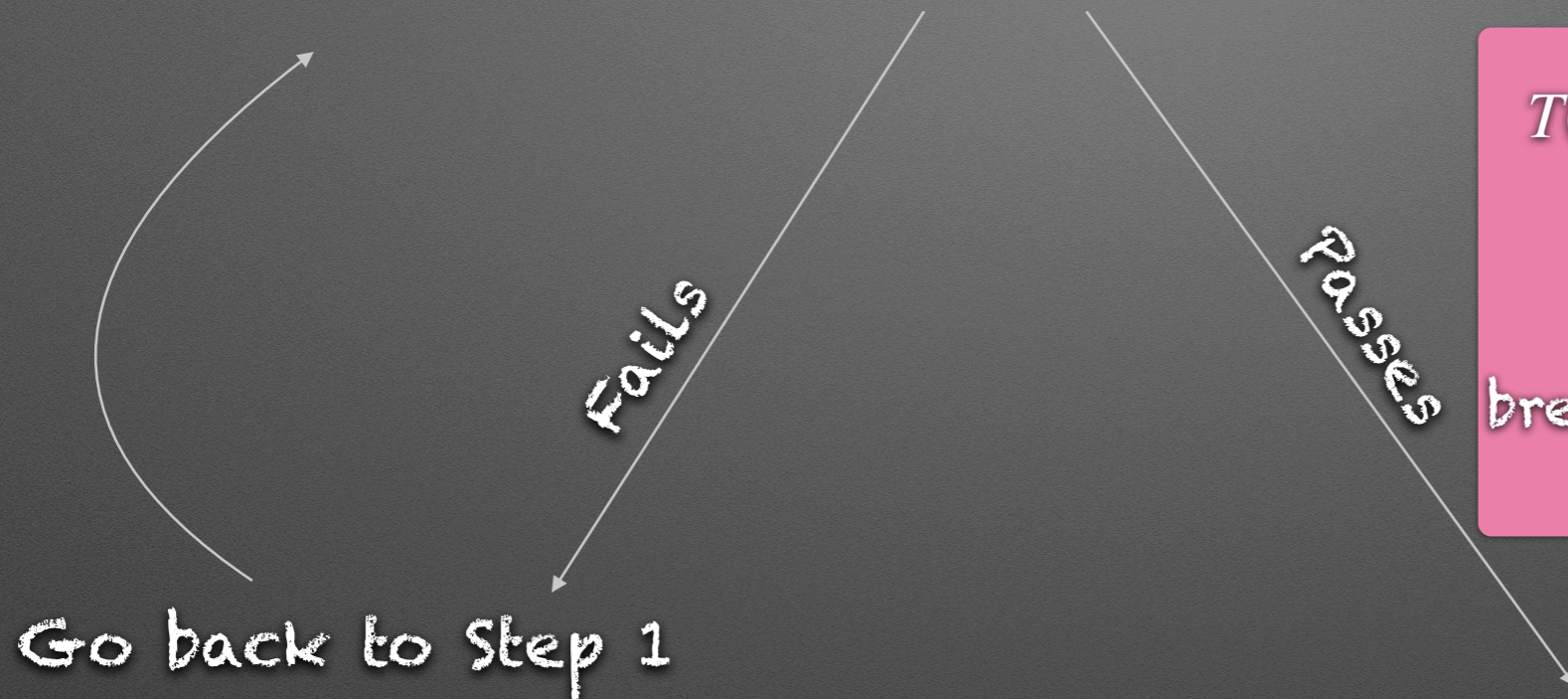
Construct a turn-based game G_T of size poly in G ,
verify if Player 1 wins from every vertex of G_T

Computing Threshold budgets for Parity Games

Guess a $T : V \rightarrow [k + 1]$,
and check if it satisfies the discrete average property.

$$T(v) = \lfloor \frac{|T(v^+)| + |T(v^-)|}{2} \rfloor + \varepsilon$$

such that $\varepsilon = 0, 1$, or $*$,
($*$ denotes that the tie-breaking advantage is needed)



Go back to Step 1

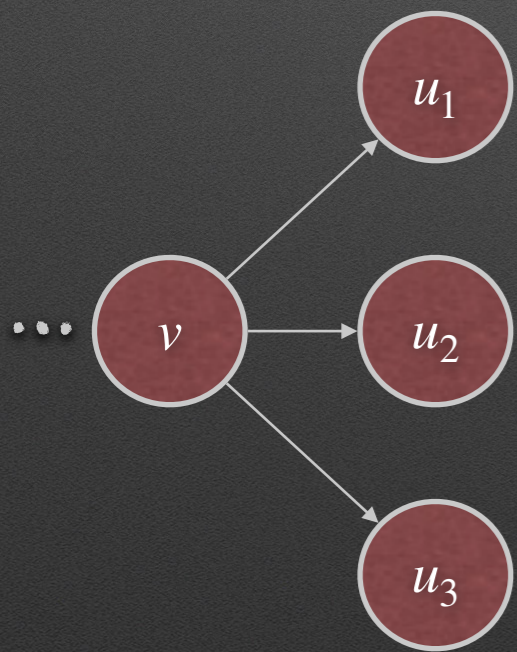
Construct a turn-based game G_T of size poly in G ,
verify if Player 1 wins from every vertex of G_T

We establish:

$T(v)$ is winning for Player 1 iff Player 1
wins from every vertex of G_T

From bidding to turn-based games

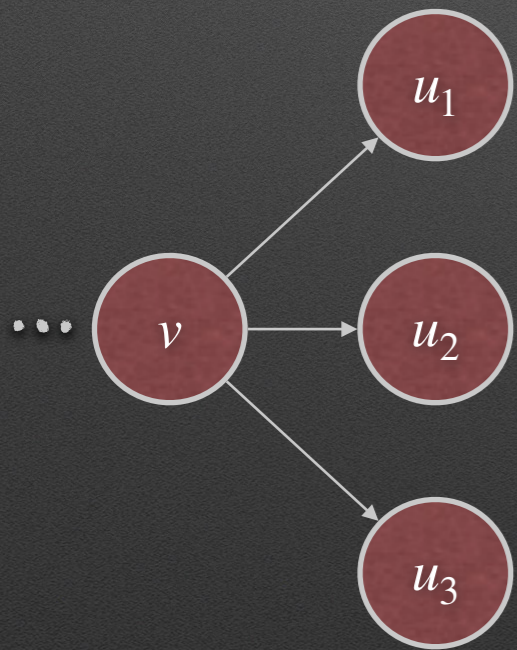
From bidding to turn-based games



G

From bidding to turn-based games

Vertices: $\langle v, T(v) \rangle$, $\langle v, T(v) \oplus 1 \rangle$, $\langle v, T \rangle$, $\langle v, T(v) \rangle$

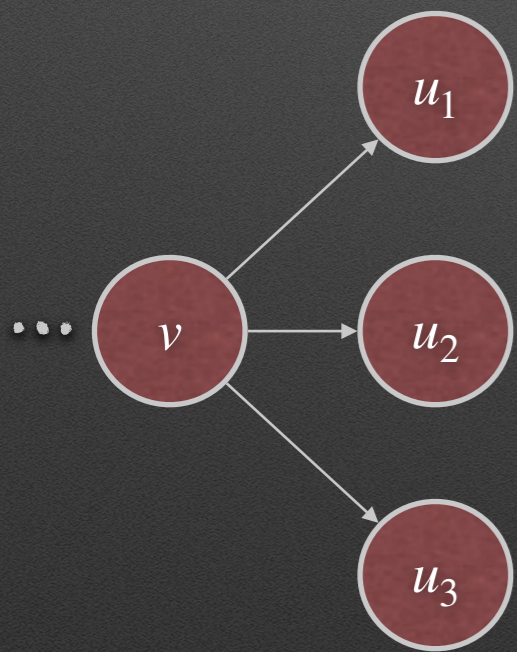


G

From bidding to turn-based games

Vertices: $\langle v, T(v) \rangle$, $\langle v, T(v) \oplus 1 \rangle$, $\langle v, T \rangle$, $\langle v, T(v) \rangle$

T gives rise to Player 1's bid: $b_T(v) \approx \frac{T(v^+) - T(v^-)}{2}$



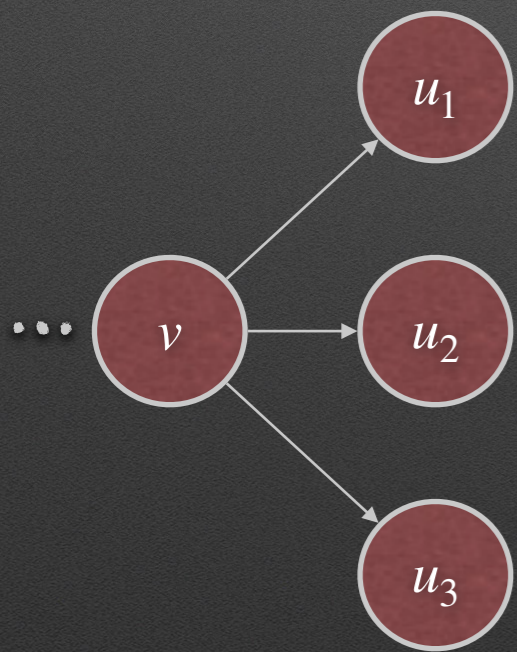
G

From bidding to turn-based games

Vertices: $\langle v, T(v) \rangle$, $\langle v, T(v) \oplus 1 \rangle$, $\langle v, T \rangle$, $\langle v, T(v) \rangle$

T gives rise to Player 1's bid: $b_T(v) \approx \frac{T(v^+) - T(v^-)}{2}$

Player 2's two optimal responses: 0 or $b_T(v) \oplus 1$



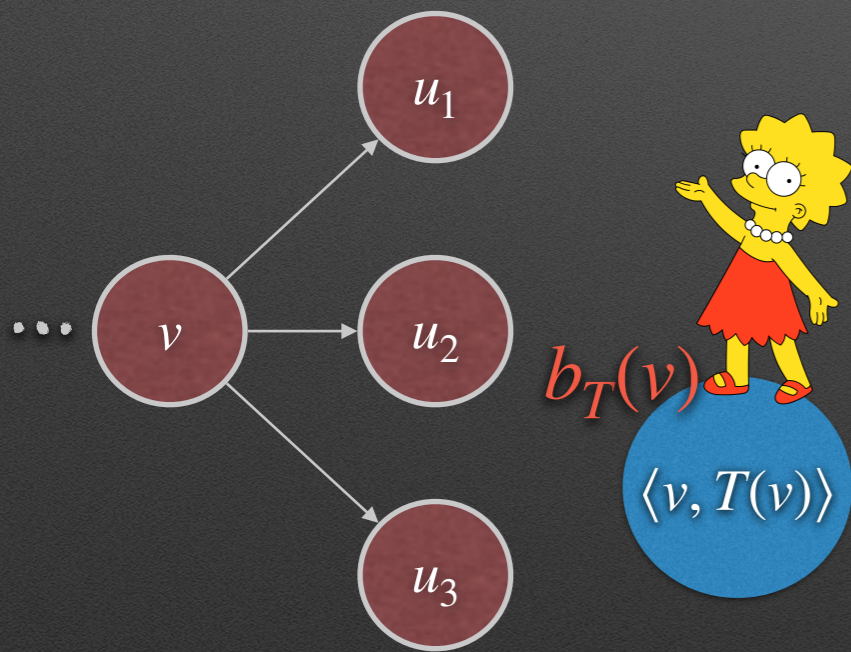
G

From bidding to turn-based games

Vertices: $\langle v, T(v) \rangle$, $\langle v, T(v) \oplus 1 \rangle$, $\langle v, T \rangle$, $\langle v, T(v) \rangle$

T gives rise to Player 1's bid: $b_T(v) \approx \frac{T(v^+) - T(v^-)}{2}$

Player 2's two optimal responses: 0 or $b_T(v) \oplus 1$



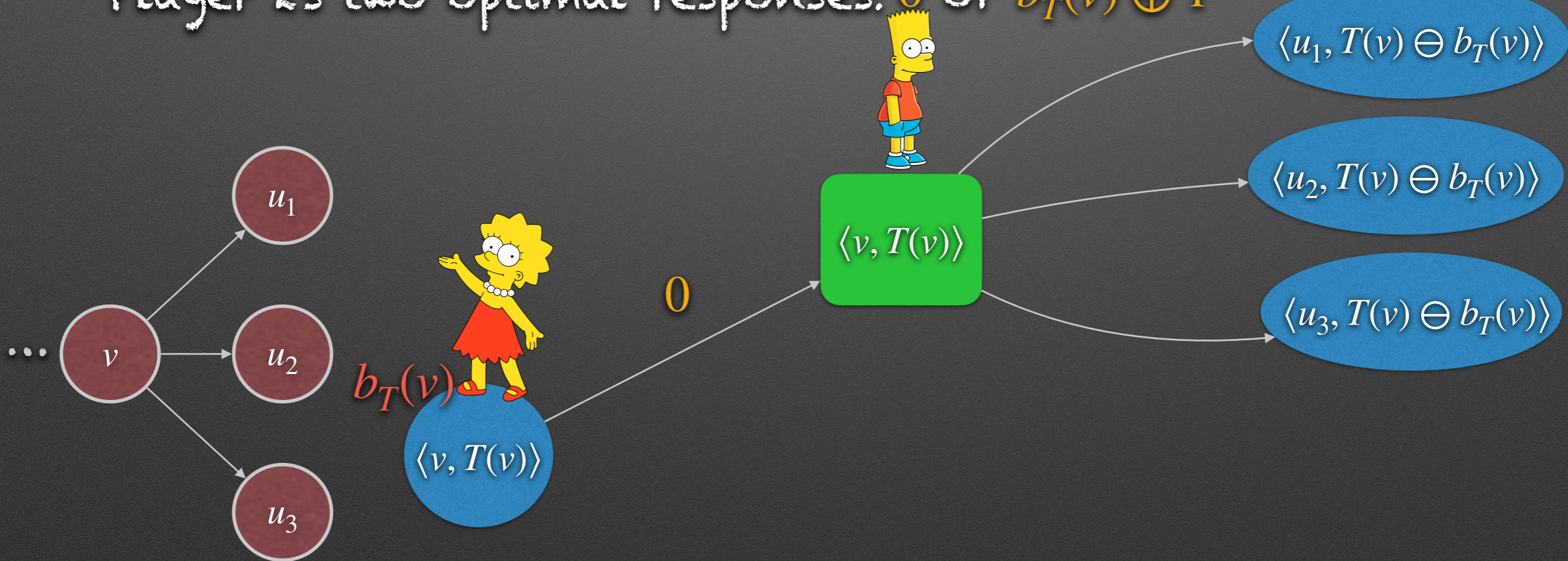
G

From bidding to turn-based games

Vertices: $\langle v, T(v) \rangle$, $\langle v, T(v) \oplus 1 \rangle$, $\langle v, T \rangle$, $\langle v, T(v) \rangle$

T gives rise to Player 1's bid: $b_T(v) \approx \frac{T(v^+) - T(v^-)}{2}$

Player 2's two optimal responses: 0 or $b_T(v) \oplus 1$



G

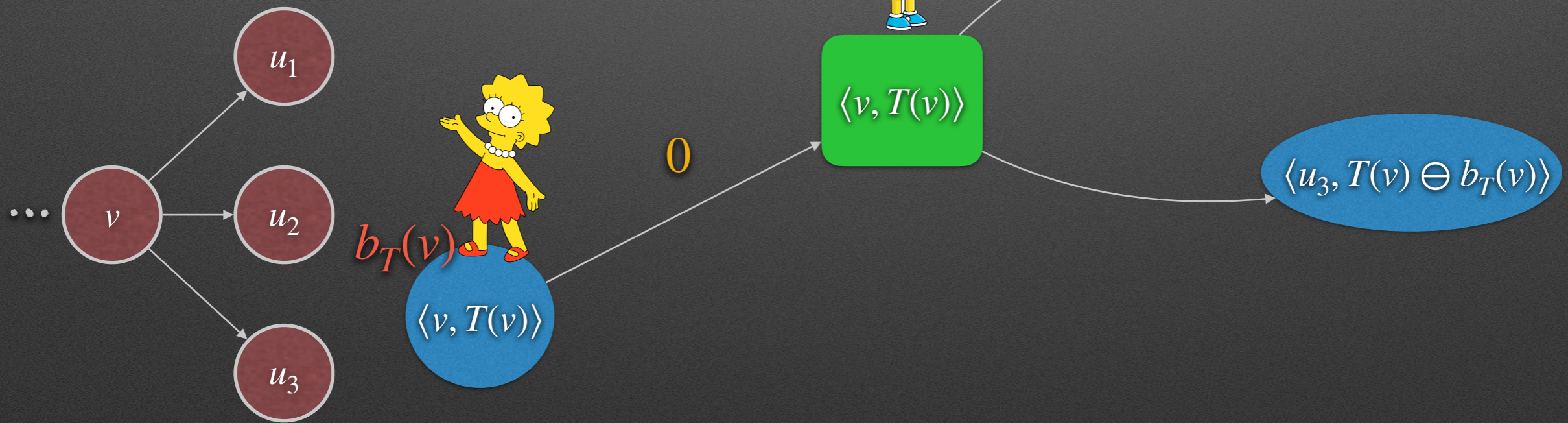
From bidding to turn-based games

Vertices: $\langle v, T(v) \rangle$, $\langle v, T(v) \oplus 1 \rangle$, $\langle v, T \rangle$, $\langle v, T(v) \rangle$

T gives rise to Player 1's bid: $b_T(v) \approx \frac{T(v^+) - T(v^-)}{2}$

Player 2's two optimal responses: 0 or $b_T(v) \oplus 1$

Keep only u_i 's such that these budgets are in $\{T(u_i), T(u_i) \oplus 1\}$



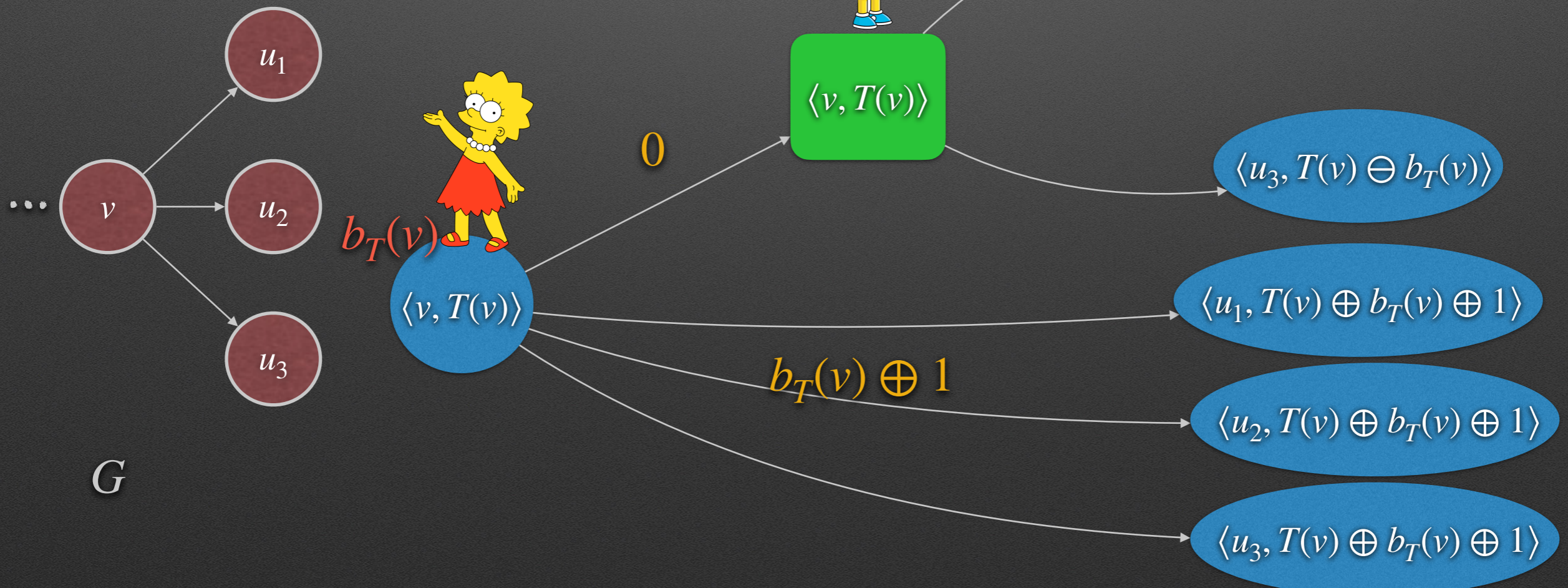
From bidding to turn-based games

Vertices: $\langle v, T(v) \rangle$, $\langle v, T(v) \oplus 1 \rangle$, $\langle v, T \rangle$, $\langle v, T(v) \rangle$

T gives rise to Player 1's bid: $b_T(v) \approx \frac{T(v^+) - T(v^-)}{2}$

Player 2's two optimal responses: 0 or $b_T(v) \oplus 1$

Keep only u_i 's such that these budgets are in $\{T(u_i), T(u_i) \oplus 1\}$



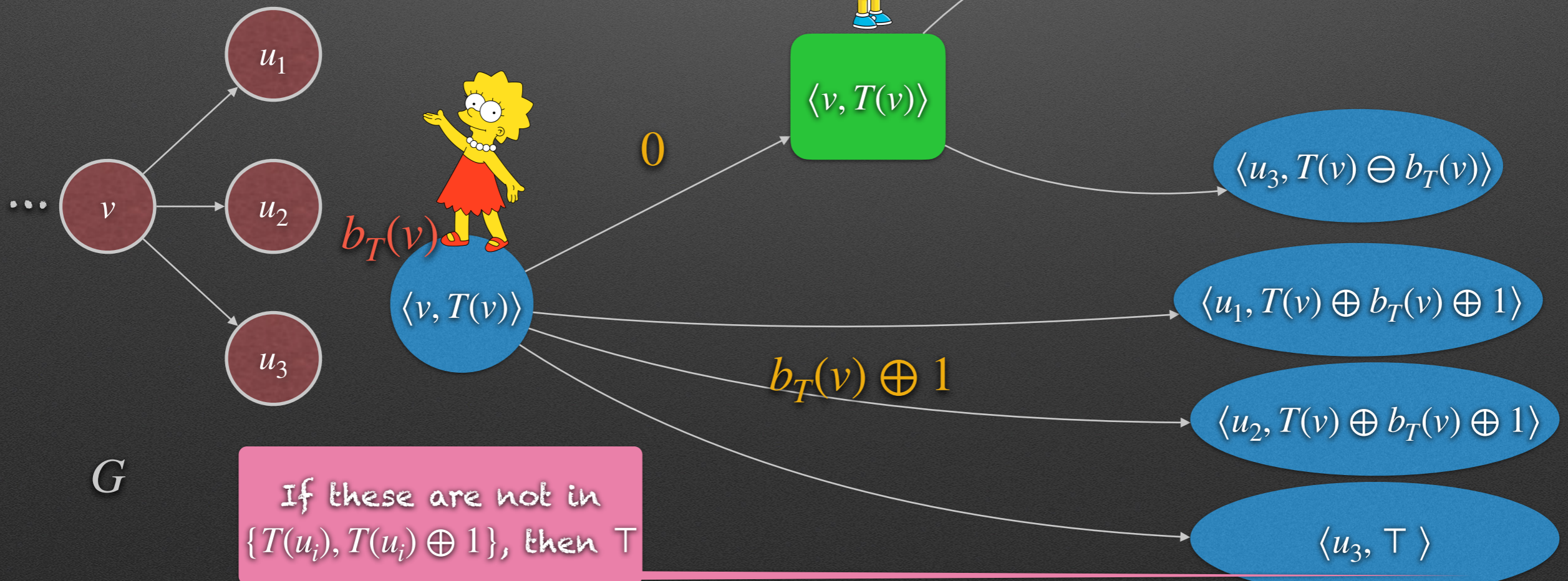
From bidding to turn-based games

Vertices: $\langle v, T(v) \rangle$, $\langle v, T(v) \oplus 1 \rangle$, $\langle v, T \rangle$, $\langle v, T(v) \rangle$

T gives rise to Player 1's bid: $b_T(v) \approx \frac{T(v^+) - T(v^-)}{2}$

Player 2's two optimal responses: 0 or $b_T(v) \oplus 1$

Keep only u_i 's such that these budgets are in $\{T(u_i), T(u_i) \oplus 1\}$

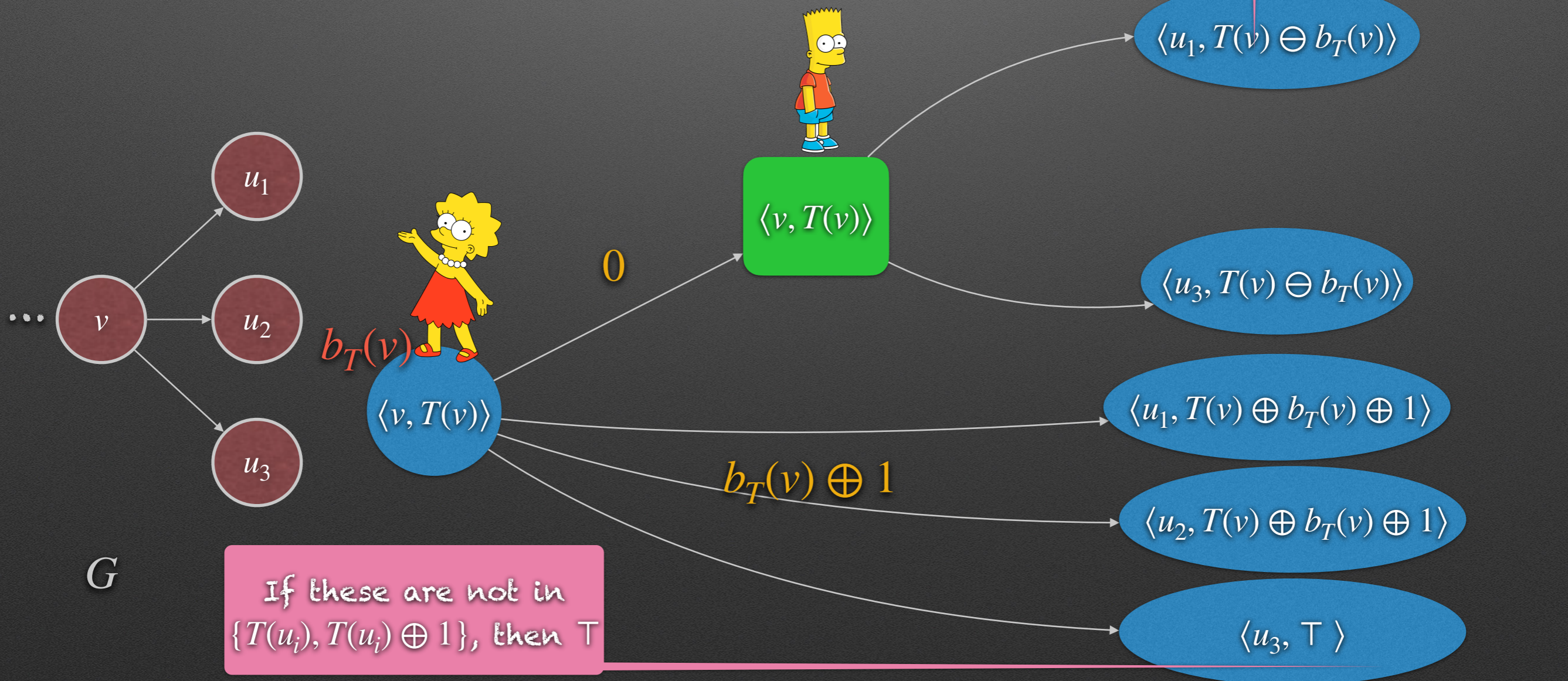


G

From bidding to turn-based games

Theorem: [Avni & S.]

1. If Player 1 wins from every vertex, then $T \geq Th_G$
2. If $T = Th_G$, then Player 1 wins from each vertex of G_T

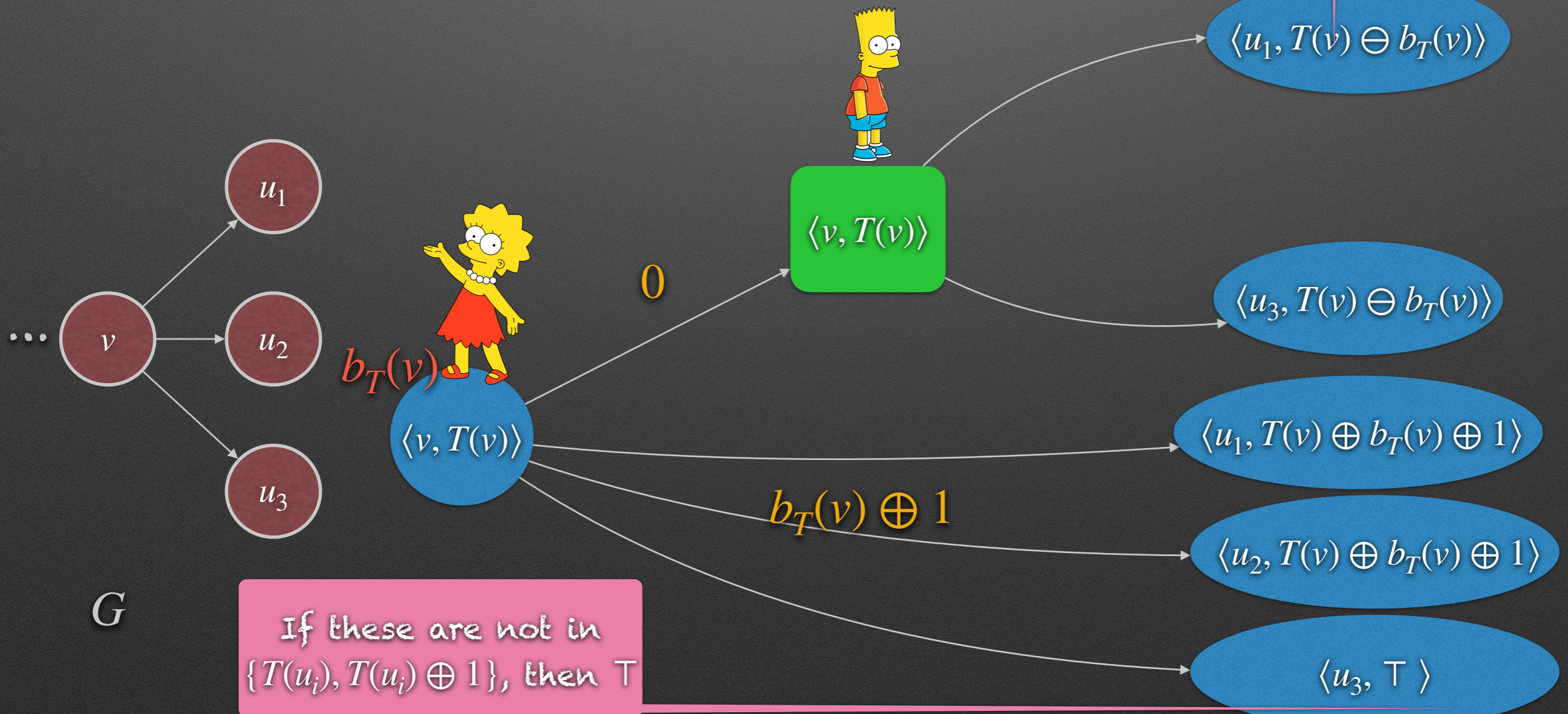


From bidding to turn-based games

Theorem: [Avni & S.]

1. If Player 1 wins from every vertex, then $T \geq Th_G$
2. If $T = Th_G$, then Player 1 wins from each vertex of G_T

Repeat the same such that
with respect to ts are in
Player 2 (Lisa) $\oplus 1$



From bidding to turn-based games

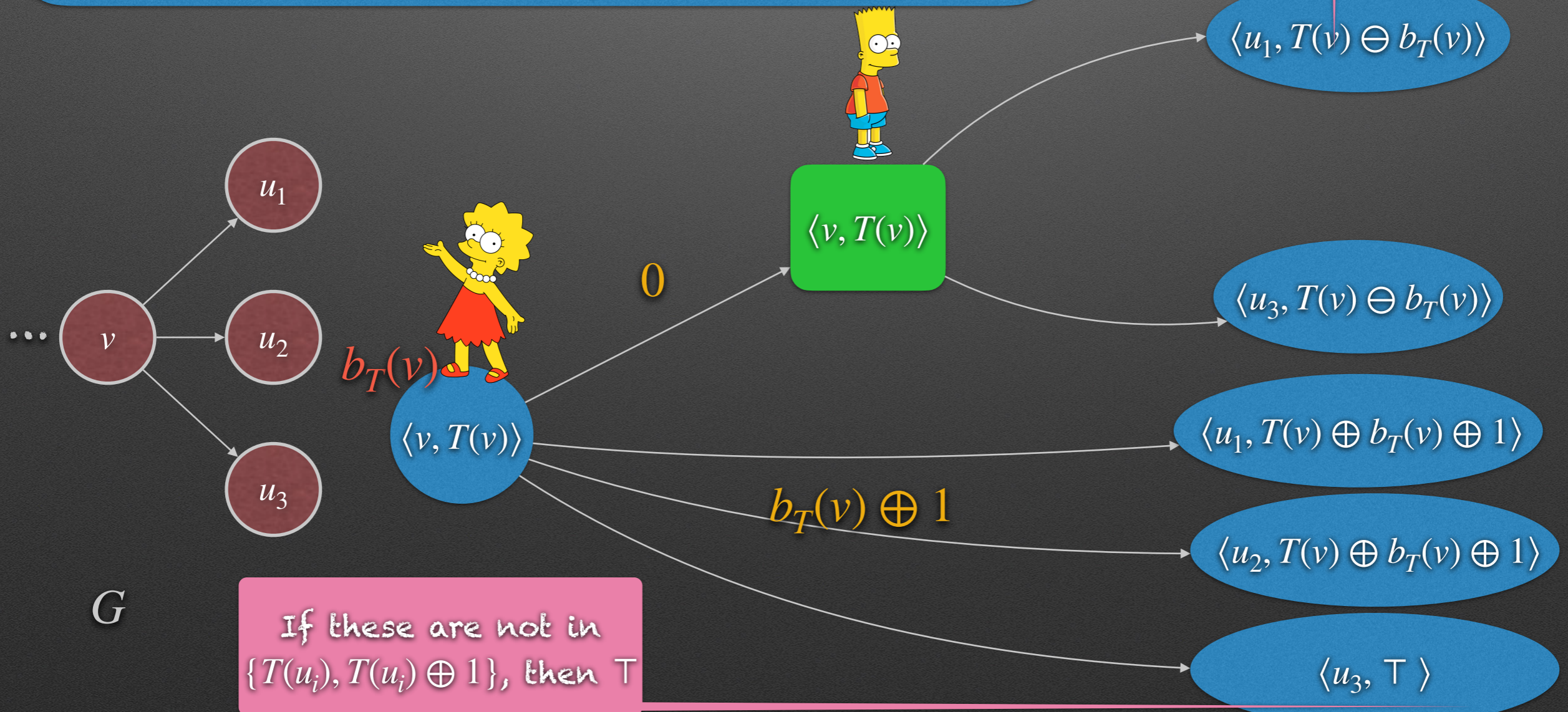
Theorem: [Avni & S.]

1. If Player 1 wins from every vertex, then $T \geq Th_G$
2. If $T = Th_G$, then Player 1 wins from each vertex of G_T

Remark:

Both $T : V \rightarrow [k + 1]$ and the winning strategy of G_T are the certificates.

Repeat the same such that
with respect to
Player 2 (Lisa) $\oplus 1$



From bidding to turn-based games

Theorem: [Avni & S.]

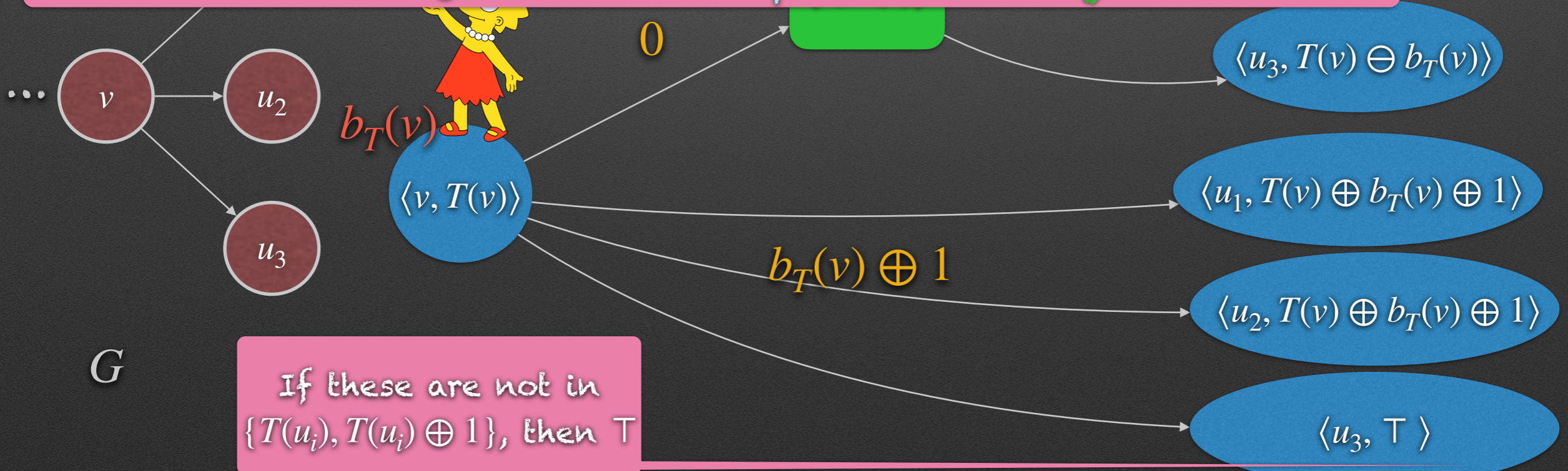
1. If Player 1 wins from every vertex, then $T \geq Th_G$
2. If $T = Th_G$, then Player 1 wins from each vertex of G_T

Remark:

Both $T : V \rightarrow [k + 1]$ and the winning strategy of G_T are the certificates.

Repeat the same such that
with respect to
Player 2 (Lisa) $\oplus 1$

- No known structure on the threshold budgets
- Do Threshold budgets satisfy the average property? ✓
- Do threshold budgets give rise to bids? ✓
- Algorithm: membership in $NP \cap co-NP$ ✓



From bidding to turn-based games

Theorem: [Avni & S.]

1. If Player 1 wins from every vertex, then $T \geq Th_G$
2. If $T = Th_G$, then Player 1 wins from each vertex of G_T

Remark:

Both $T : V \rightarrow [k + 1]$ and the winning strategy of G_T are the certificates.

Repeat the same such that
with respect to ts are in
Player 2 (Lisa) $\oplus 1$

No known structure on the threshold budgets
Do Threshold budgets satisfy the average property? ✓
Do threshold budgets give rise to bids? ✓

membership in $NP \cap co-NP$ ✓

Computing Threshold Budgets in Discrete-Bidding Games

Guy Avni ✉
University of Haifa, Israel

Suman Sadhukhan ✉
University of Haifa, Israel

Abstract

In a two-player zero-sum graph game, the players move a token throughout a graph to produce an infinite play, which determines the winner of the game. *Bidding games* are graph games in which in each turn, an auction (bidding) determines which player moves the token: the players have budgets, and in each turn, both players simultaneously submit bids that do not exceed their available budgets, and the higher bidder moves the token, and pays the bid to the lower bidder (called *Richman bidding*). The focus on *discrete-bidding games*, in which, motivated by practical applications, the granularity of players' bids is restricted, e.g., bids must be given in cents. Previously, thresholds were shown to exist in parity games, and the central quantity in bidding games is *threshold budgets*: a necessary and sufficient initial budget for winning the game. More recently, thresholds were shown to exist in parity games, and the first case was only understood for reachability games. Moreover, the previously mentioned results used exponential running time for both reachability and parity games. We describe two algorithms that use exponential memory. The first is a first-order algorithm for reachability and parity games, and the second algorithm is a first-order algorithm for reachability and parity games.

$$\langle u, T(v) \ominus b_T(v) \rangle$$

$$\langle u_3, T(v) \ominus b_T(v) \rangle$$

$$\langle u_1, T(v) \oplus b_T(v) \oplus 1 \rangle$$

$$\langle u_2, T(v) \oplus b_T(v) \oplus 1 \rangle$$

$$\langle u_3, T \rangle$$

$$b_T(v) \oplus 1$$

Take Away - Part I

Theorem:

Finding Threshold budgets in parity discrete bidding games is $NP \cap co-NP$.

Take Away - Part I

Theorem:

Finding Threshold budgets in parity discrete bidding games is $NP \cap co-NP$.

Improvement: Earlier only EXPTIME algorithm was known for discrete bidding (including Reachability)

Take Away - Part I

Theorem:

Finding Threshold budgets in parity discrete bidding games is $NP \cap co-NP$.

Corollary:

Polynomial size winning strategies exist.

Improvement: Earlier only EXPTIME algorithm was known for discrete bidding (including Reachability)

Take Away - Part I

Theorem:

Finding Threshold budgets in parity discrete bidding games is $NP \cap co-NP$.

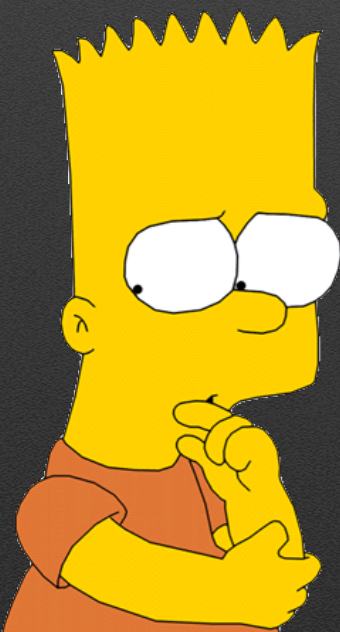
Corollary:

Polynomial size winning strategies exist.

Improvement: Earlier only EXPTIME algorithm was known for discrete bidding (including Reachability)

Food for thought?

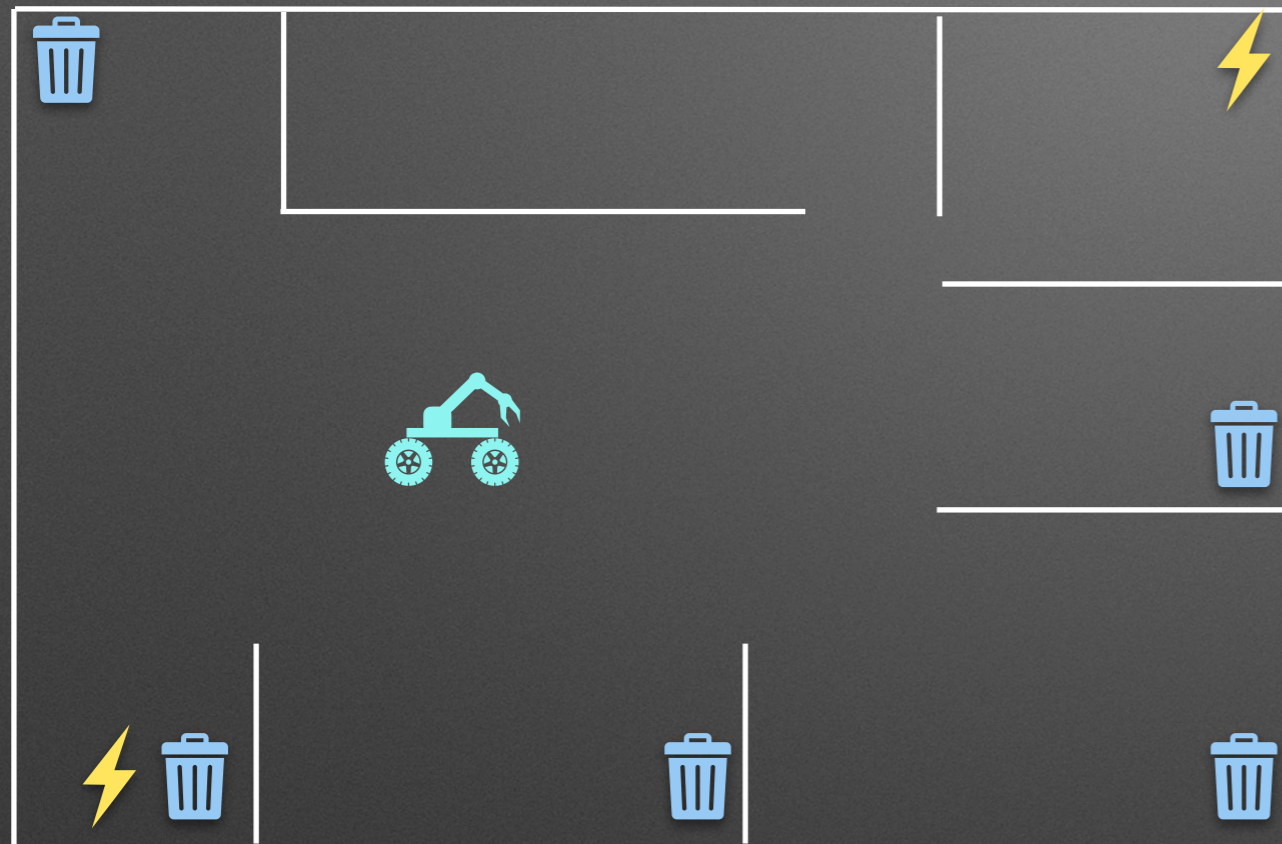
- Turn-based parity games are in $NP \cap co-NP$, but not known to be in P .
- Turn-based parity games \rightarrow discrete bidding games with fixed budgets
- Discrete bidding parity games with budgets in binary \rightarrow membership in $NP \cap co-NP$



Part II (in Practice):

Continuous Bidding Games in Multi-
objective Decentralised Synthesis

Multi-objective Control Problem

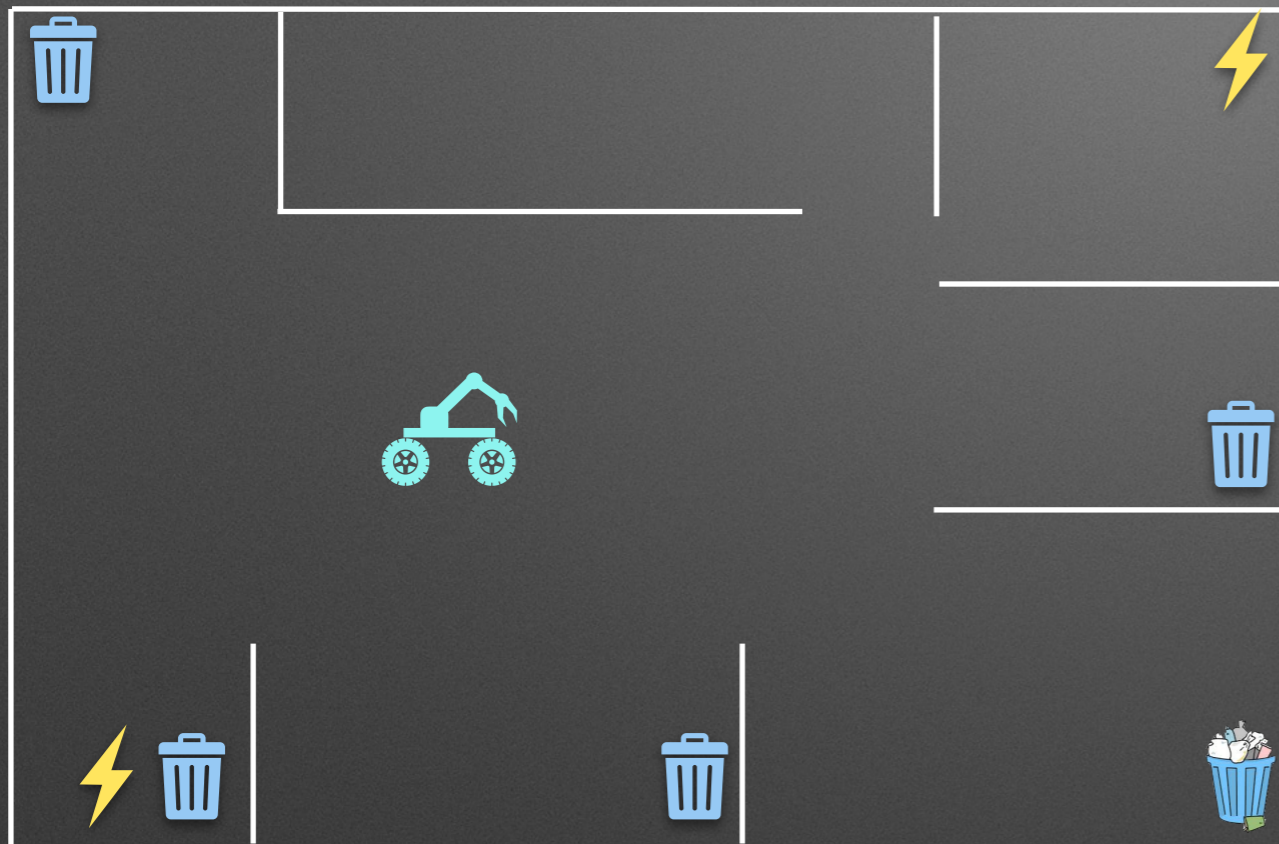


Objective 2 (ψ_2):
Recharge before battery runs out



Objective 1 (ψ_1):
Repeatedly empty all trash cans

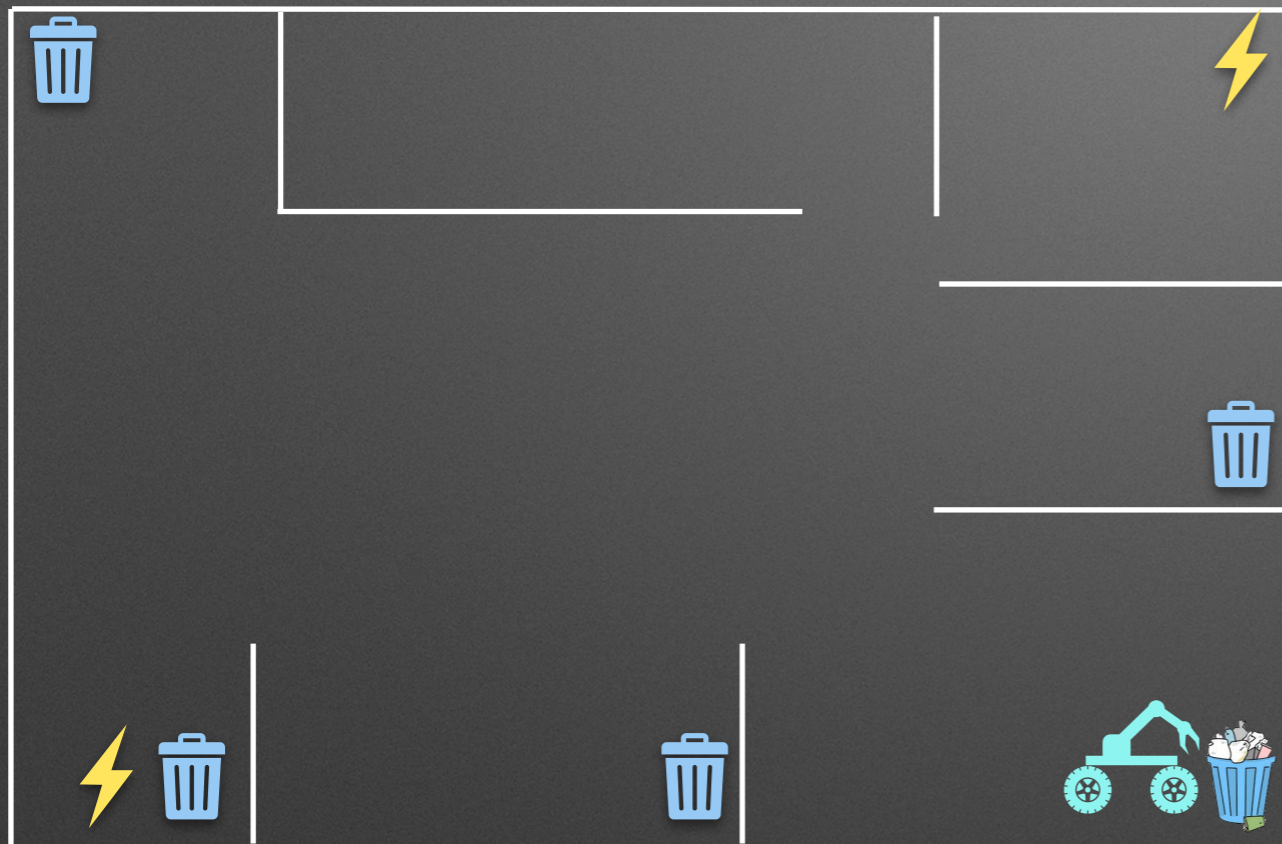
Multi-objective Control Problem



Objective 2 (ψ_2):
Recharge before battery runs out

Objective 1 (ψ_1):
Repeatedly empty all trash cans

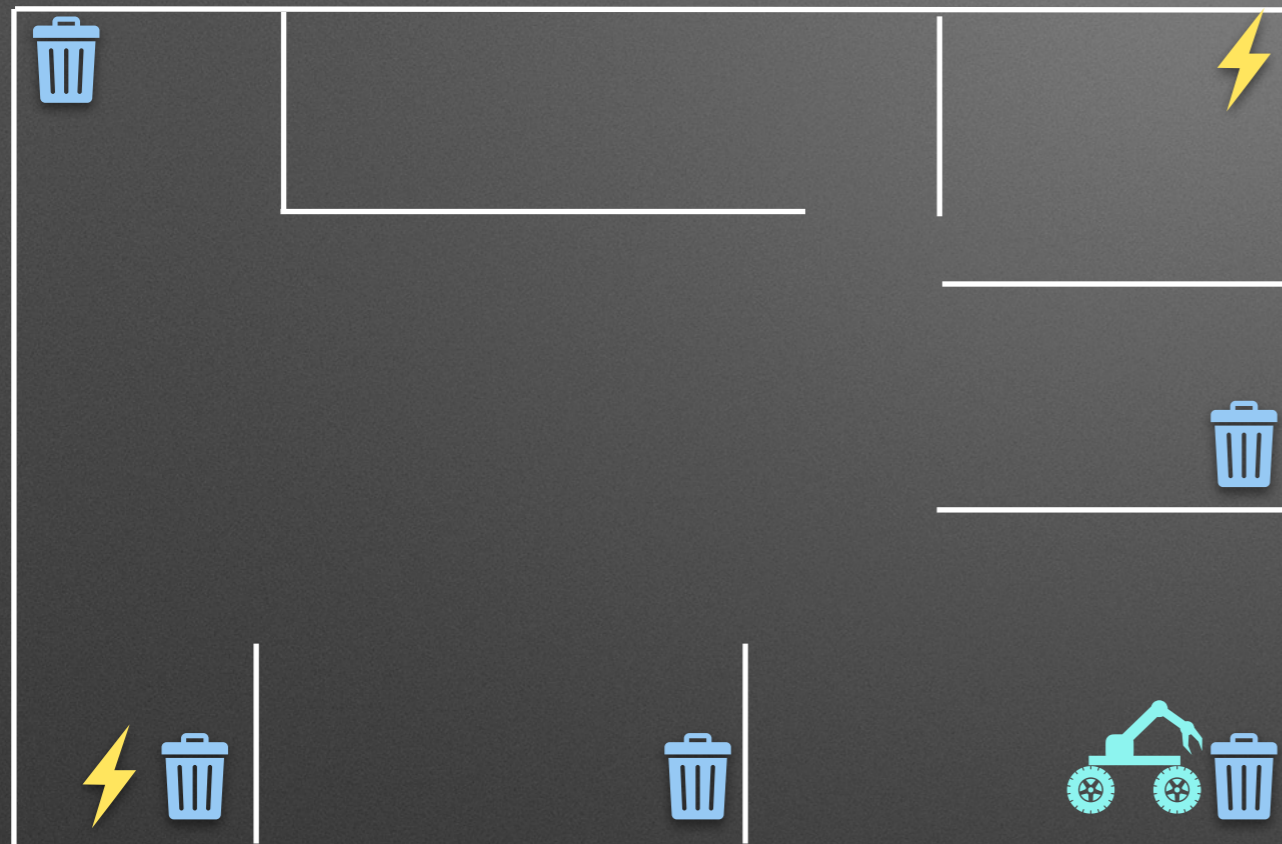
Multi-objective Control Problem



Objective 2 (ψ_2):
Recharge before battery runs out

Objective 1 (ψ_1):
Repeatedly empty all trash cans

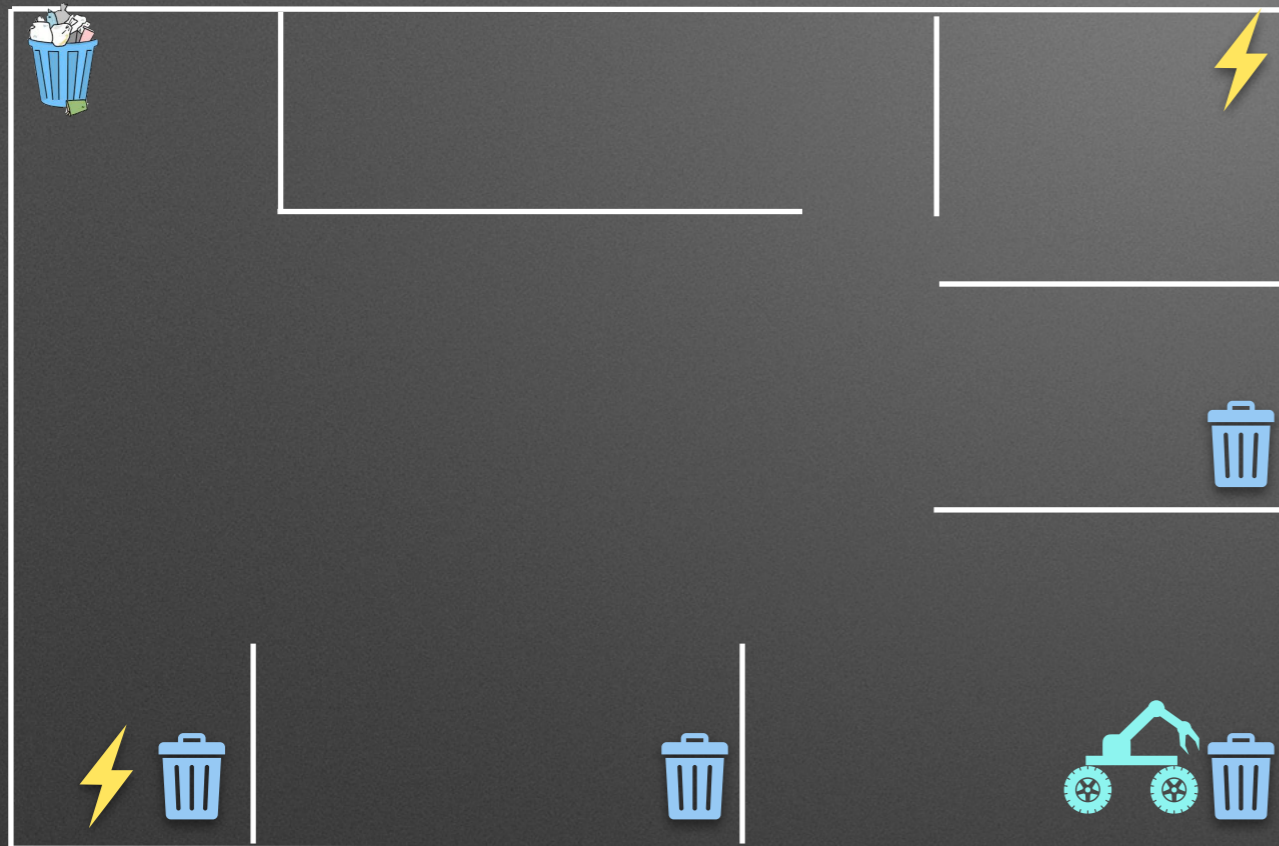
Multi-objective Control Problem



Objective 2 (ψ_2):
Recharge before battery runs out

Objective 1 (ψ_1):
Repeatedly empty all trash cans

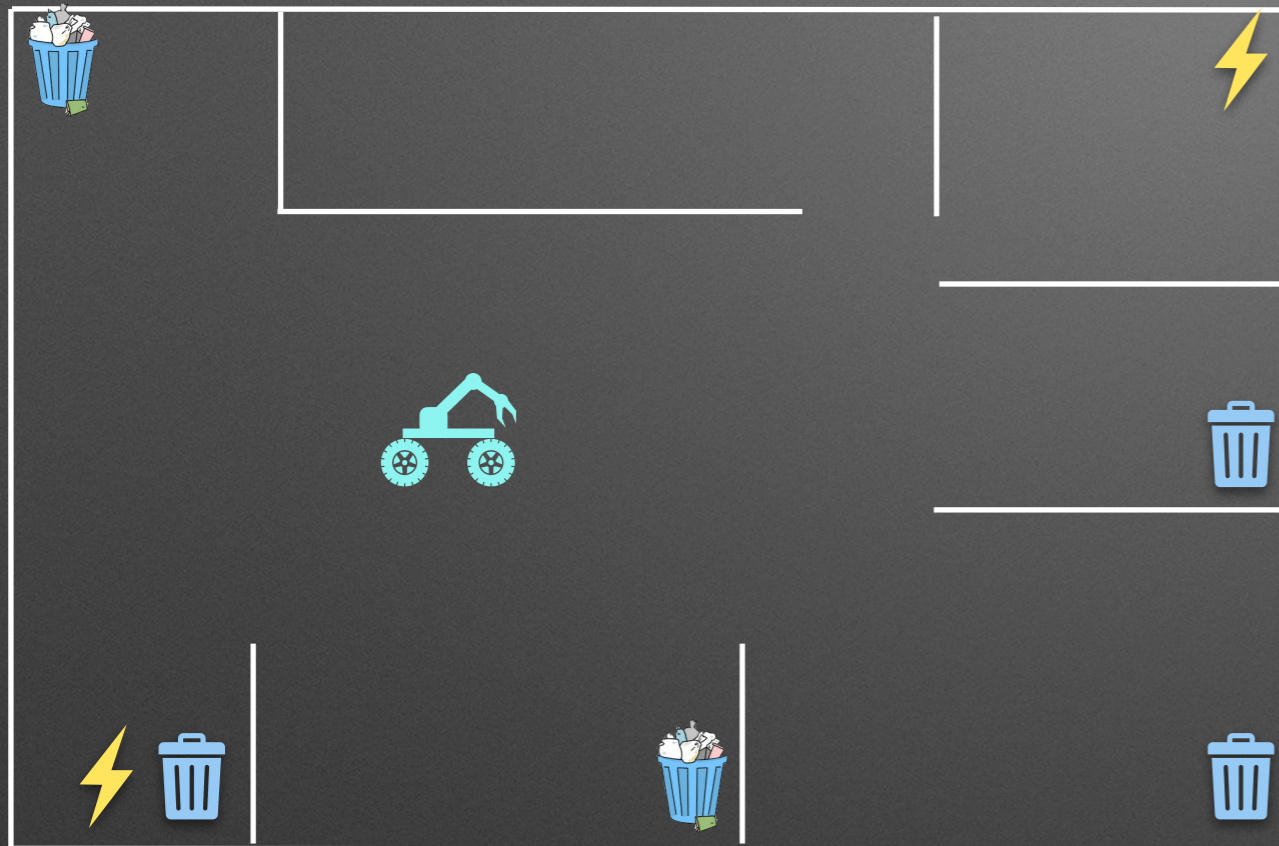
Multi-objective Control Problem



Objective 2 (ψ_2):
Recharge before battery runs out

Objective 1 (ψ_1):
Repeatedly empty all trash cans

Multi-objective Control Problem

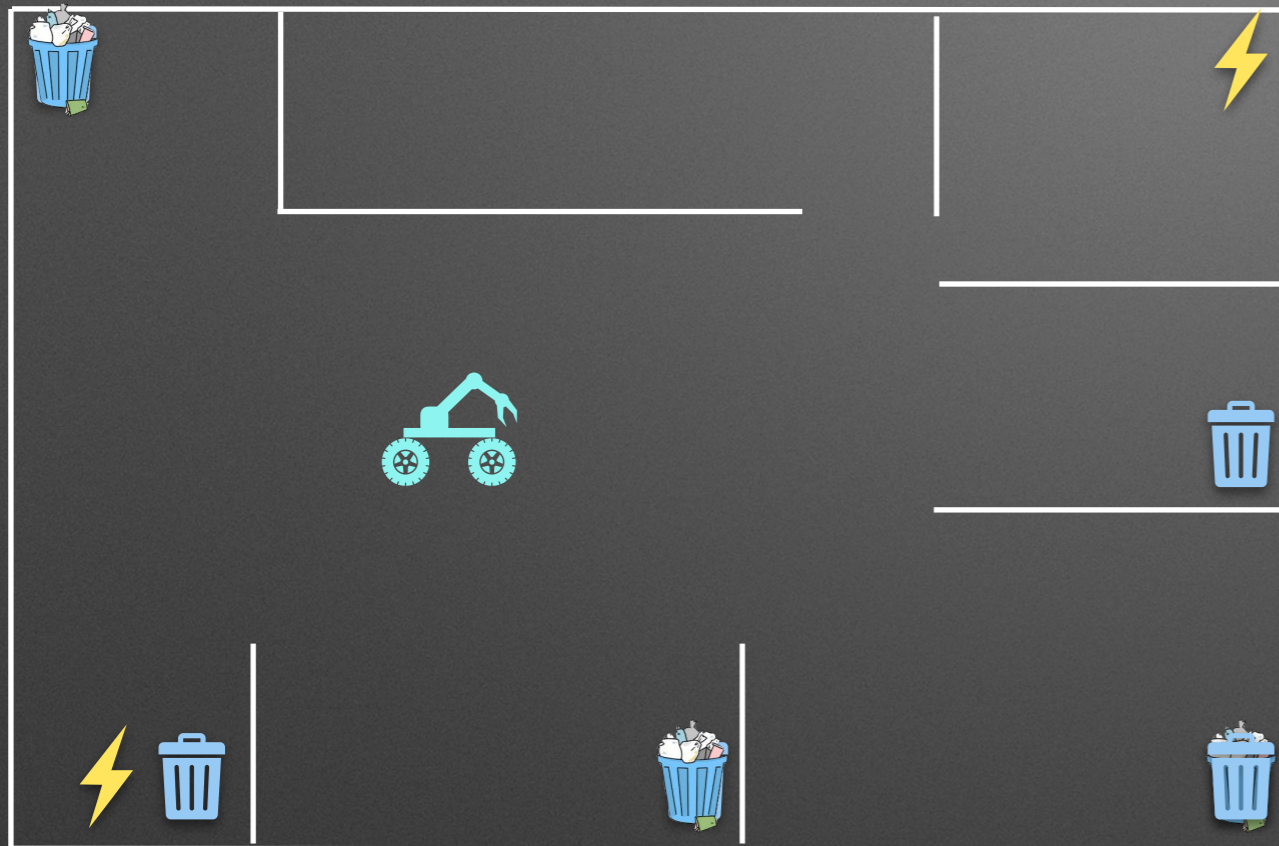


Objective 2 (ψ_2):
Recharge before battery runs out



Objective 1 (ψ_1):
Repeatedly empty all trash cans

Multi-objective Control Problem

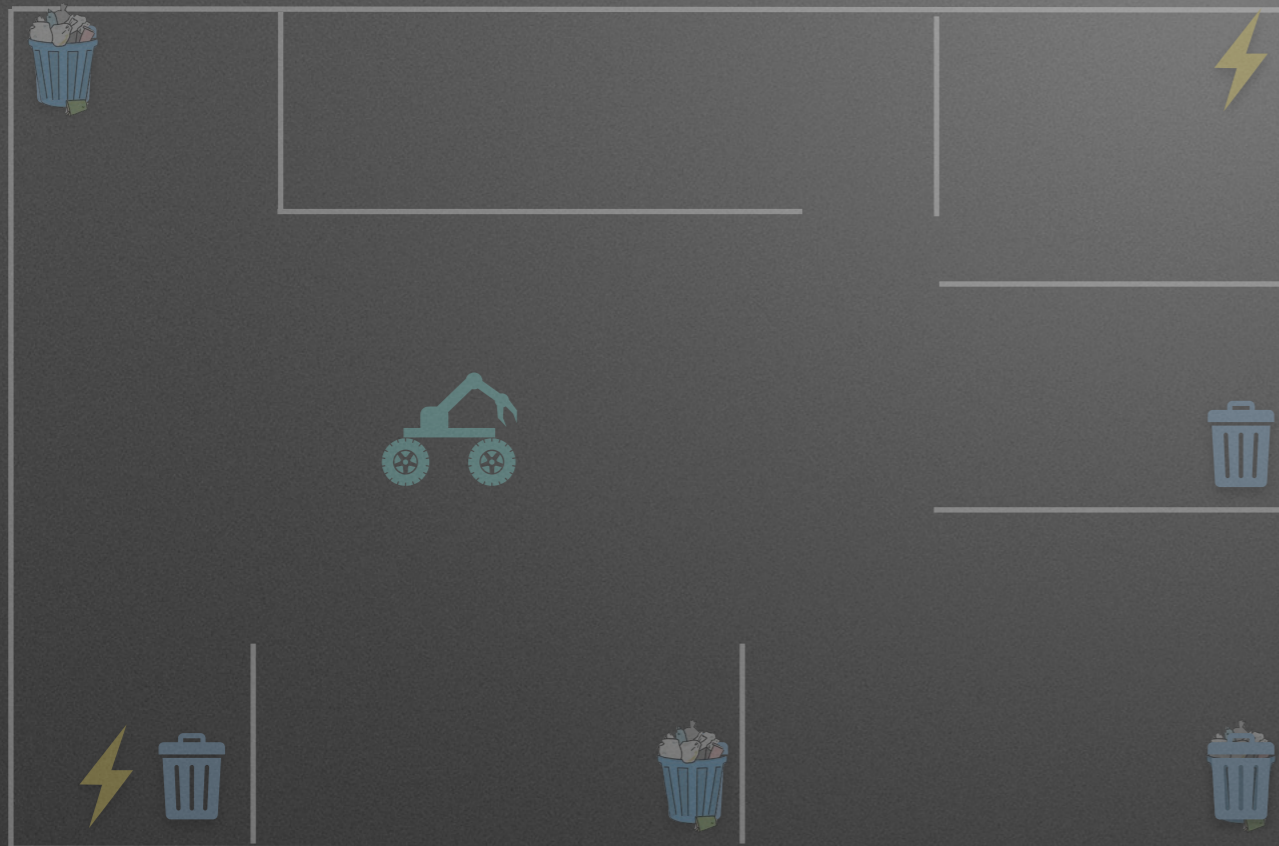


Objective 2 (ψ_2):
Recharge before battery runs out



Objective 1 (ψ_1):
Repeatedly empty all trash cans

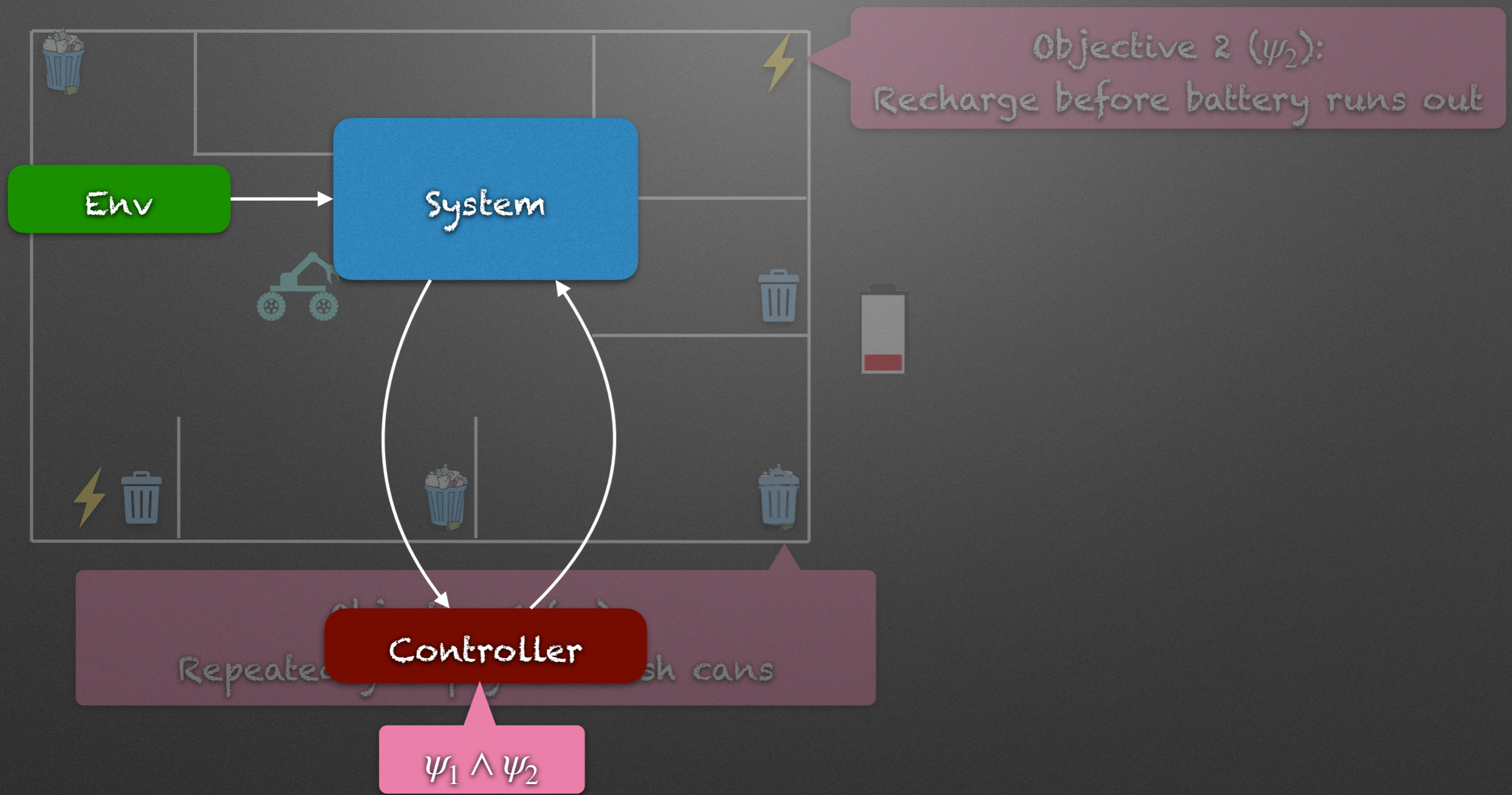
Multi-objective Control Problem



Objective 2 (ψ_2):
Recharge before battery runs out

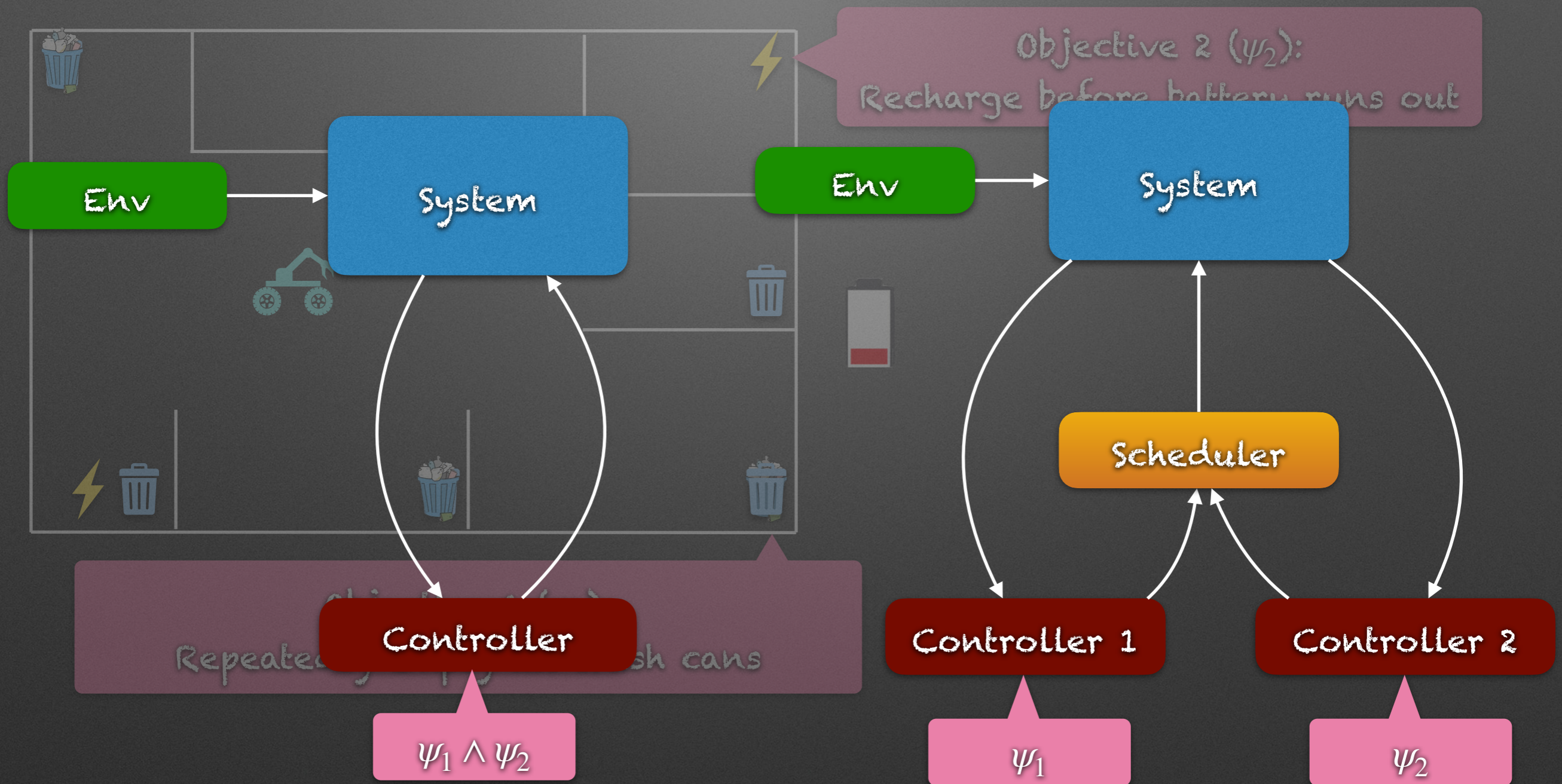
Objective 1 (ψ_1):
Repeatedly empty all trash cans

Multi-objective Control Problem



Centralised Controller Synthesis

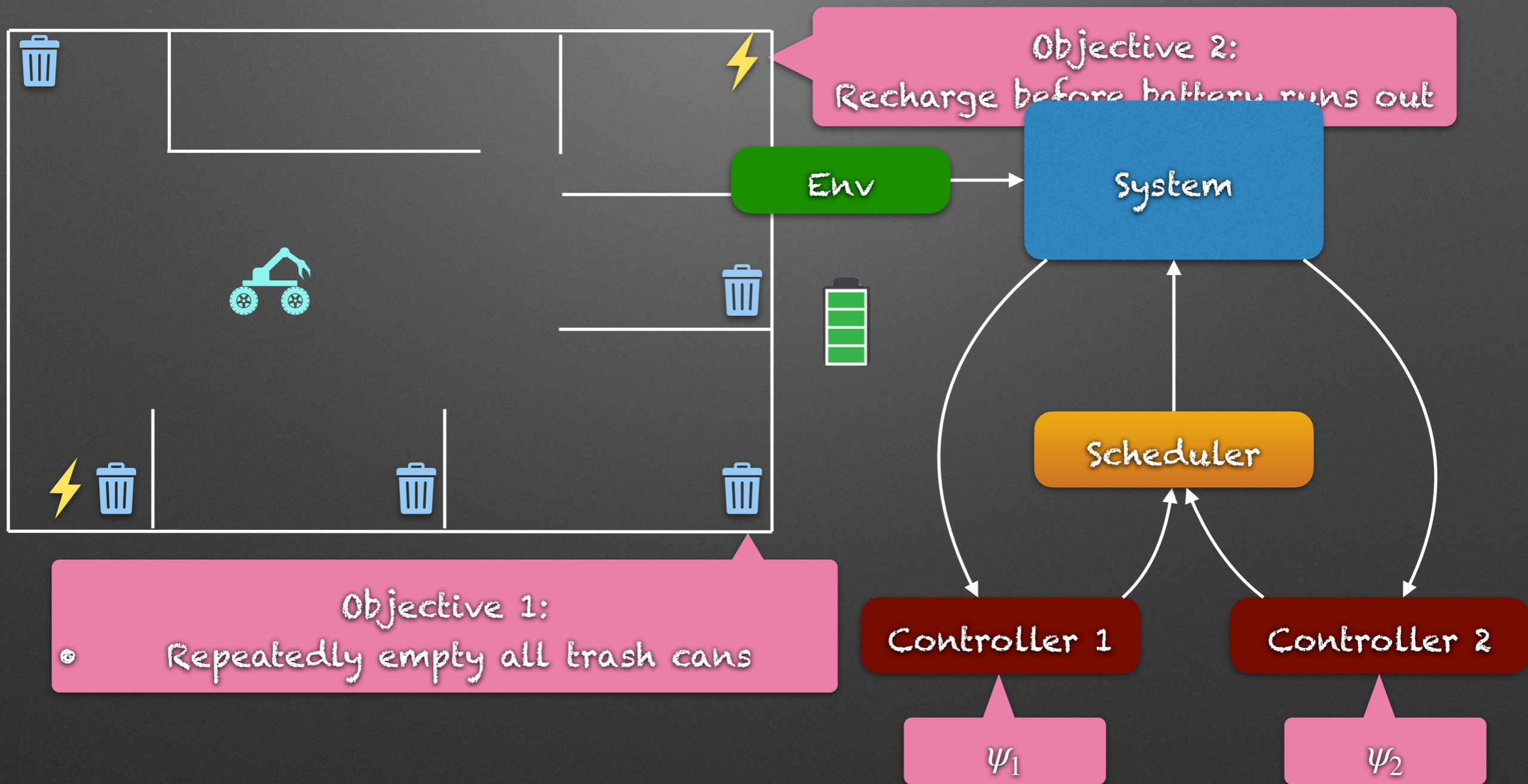
Multi-objective Control Problem



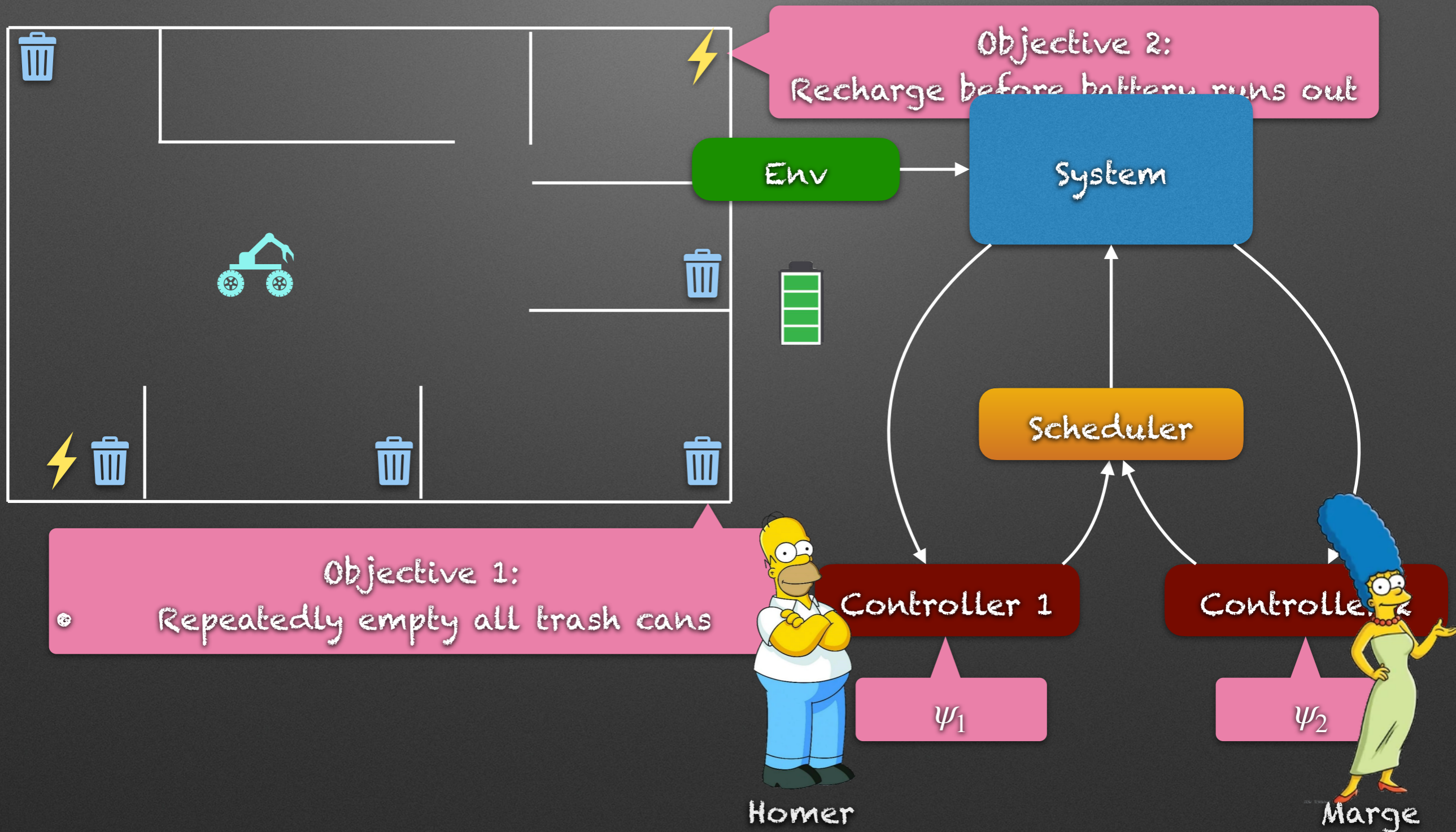
Centralised Controller Synthesis

De-centralised Controller Synthesis

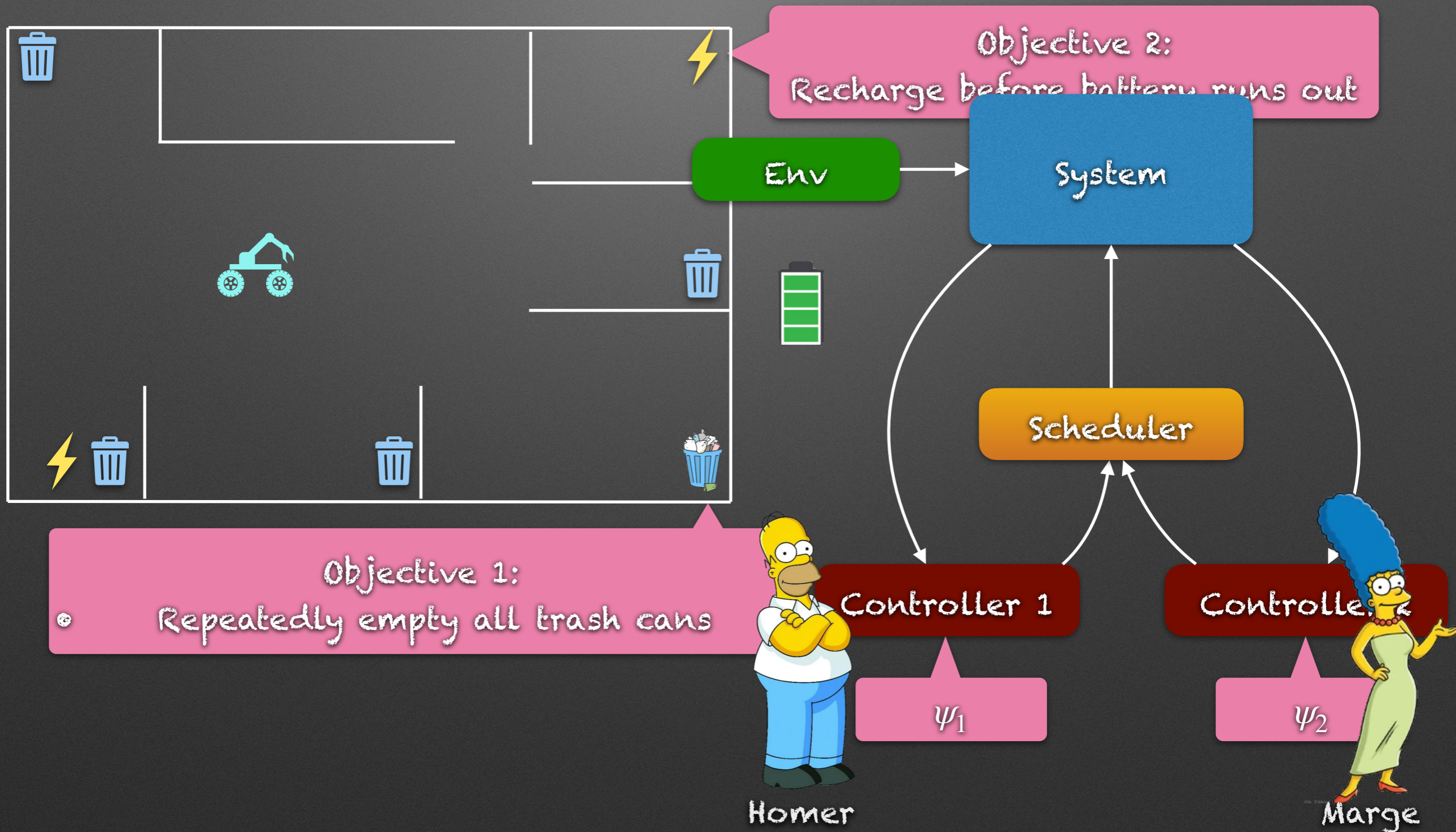
Multi-objective Decentralised Controller Synthesis



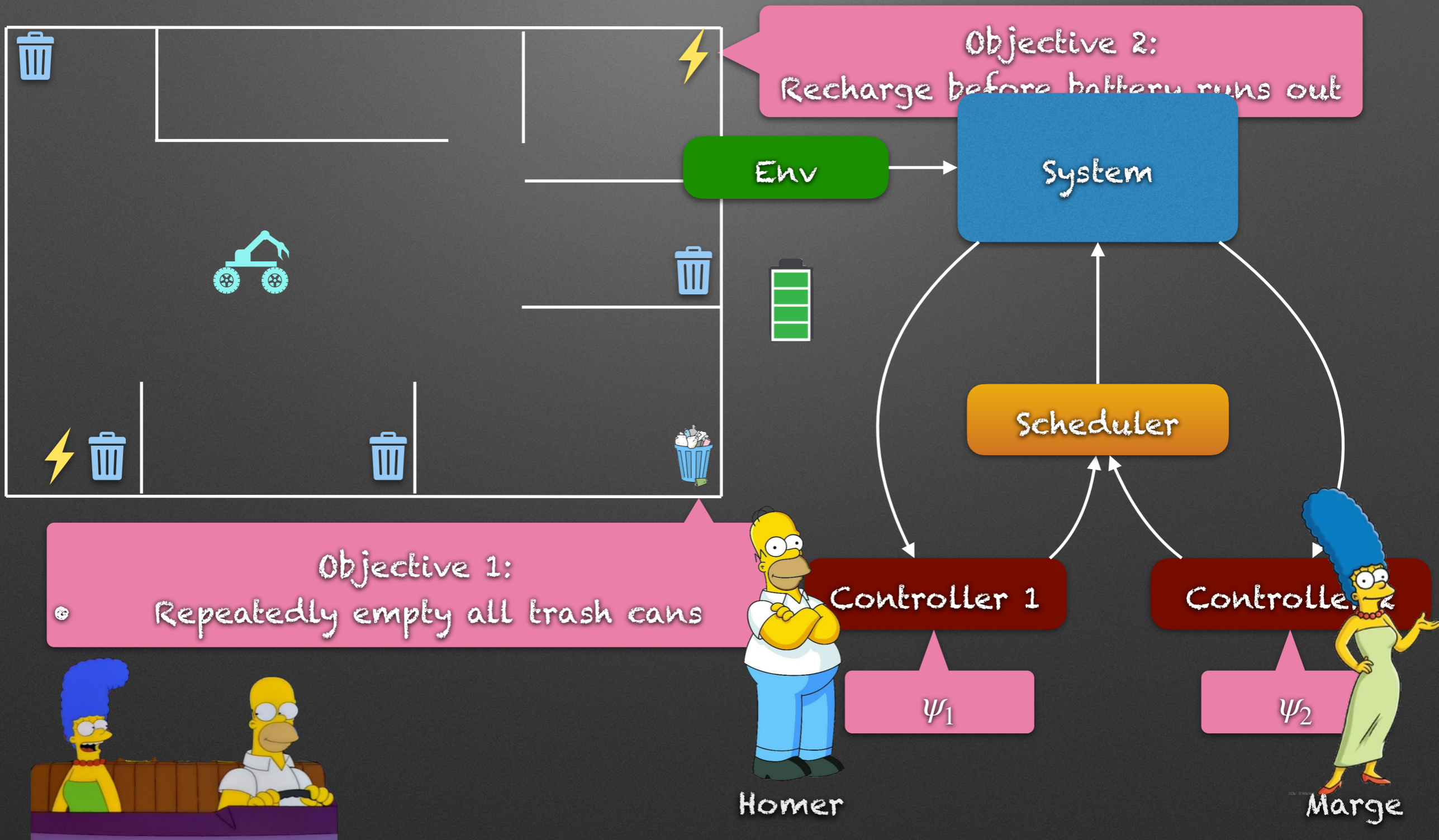
Multi-objective Decentralised Controller Synthesis



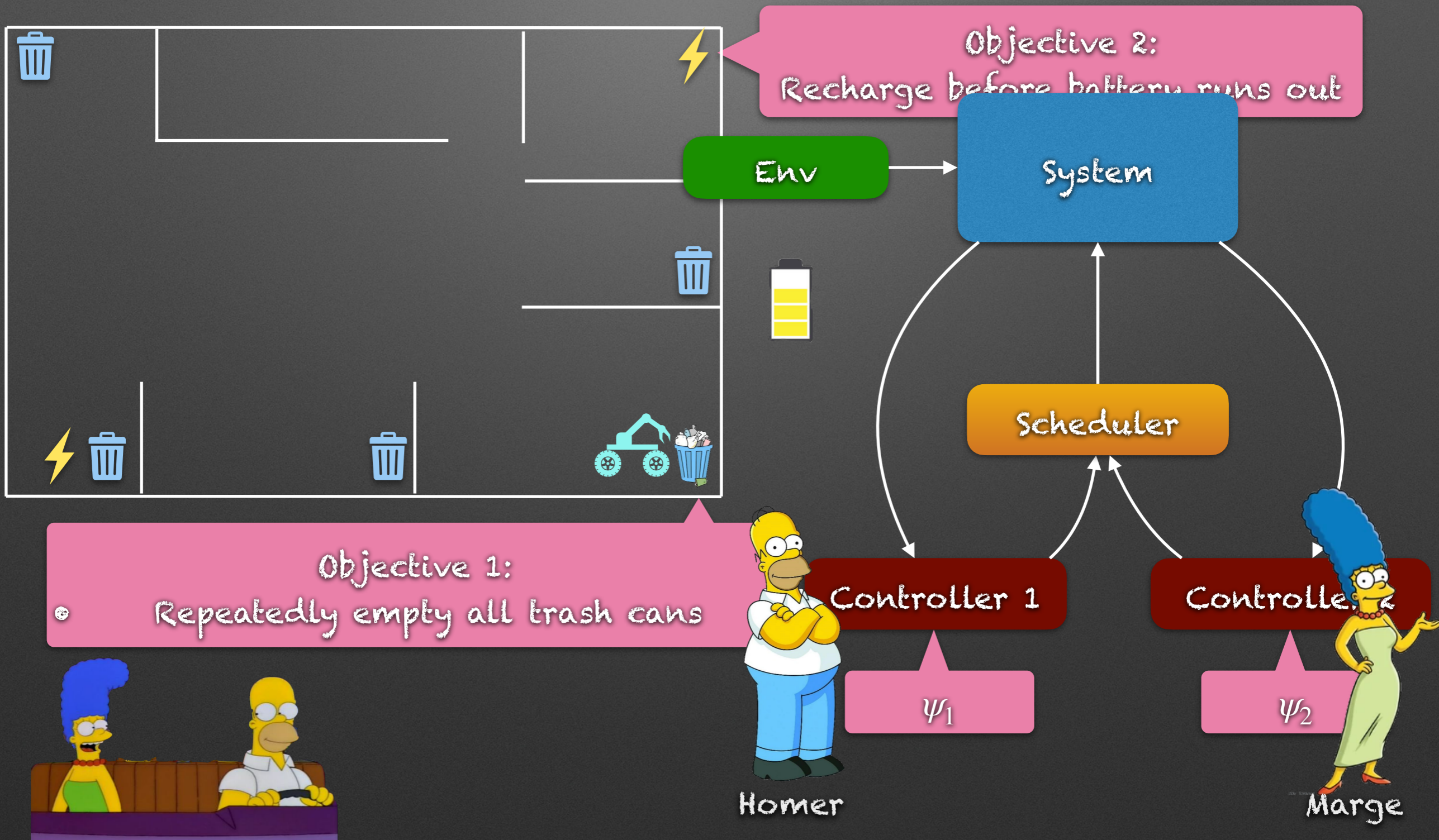
Multi-objective Decentralised Controller Synthesis



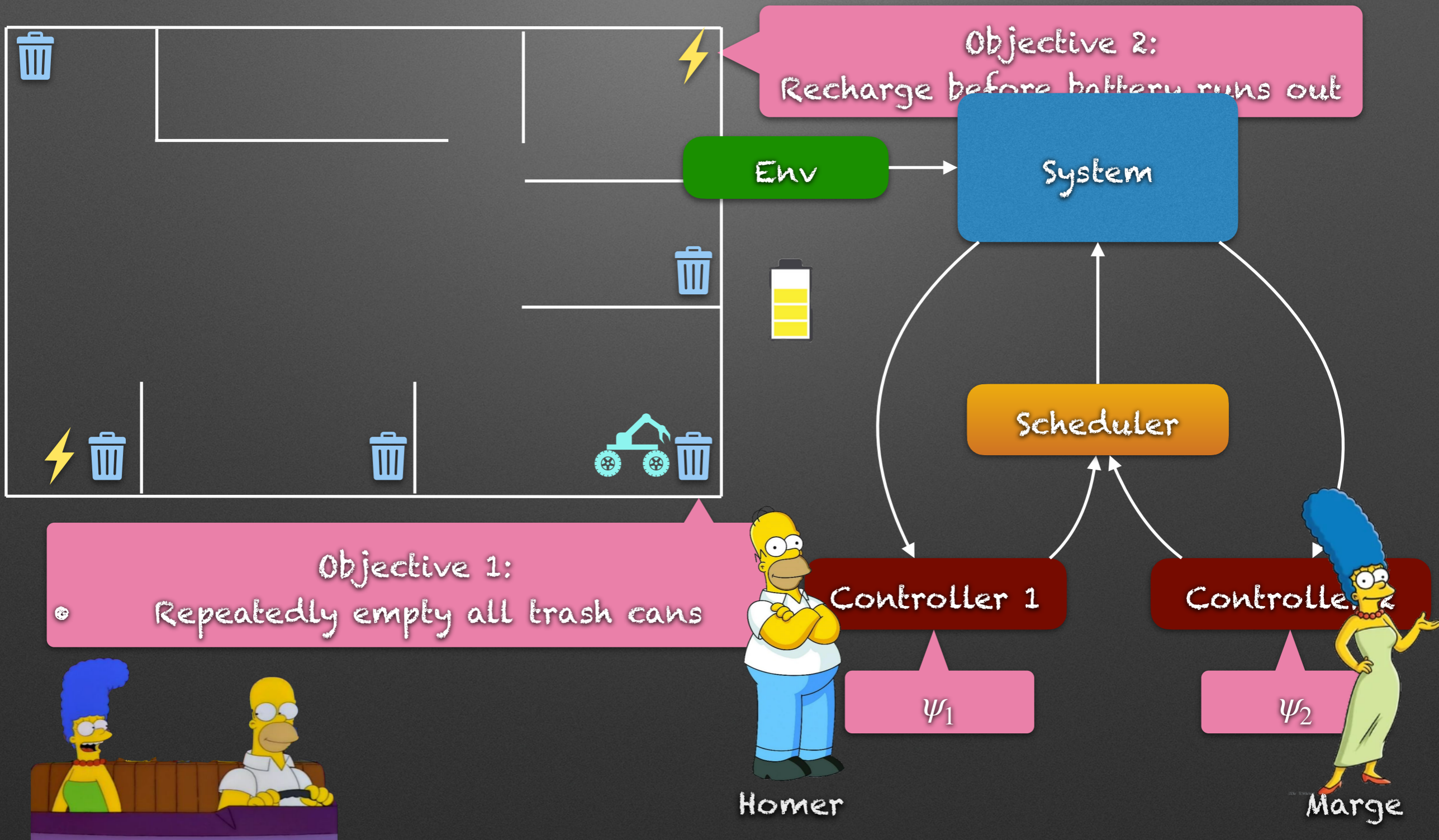
Multi-objective Decentralised Controller Synthesis



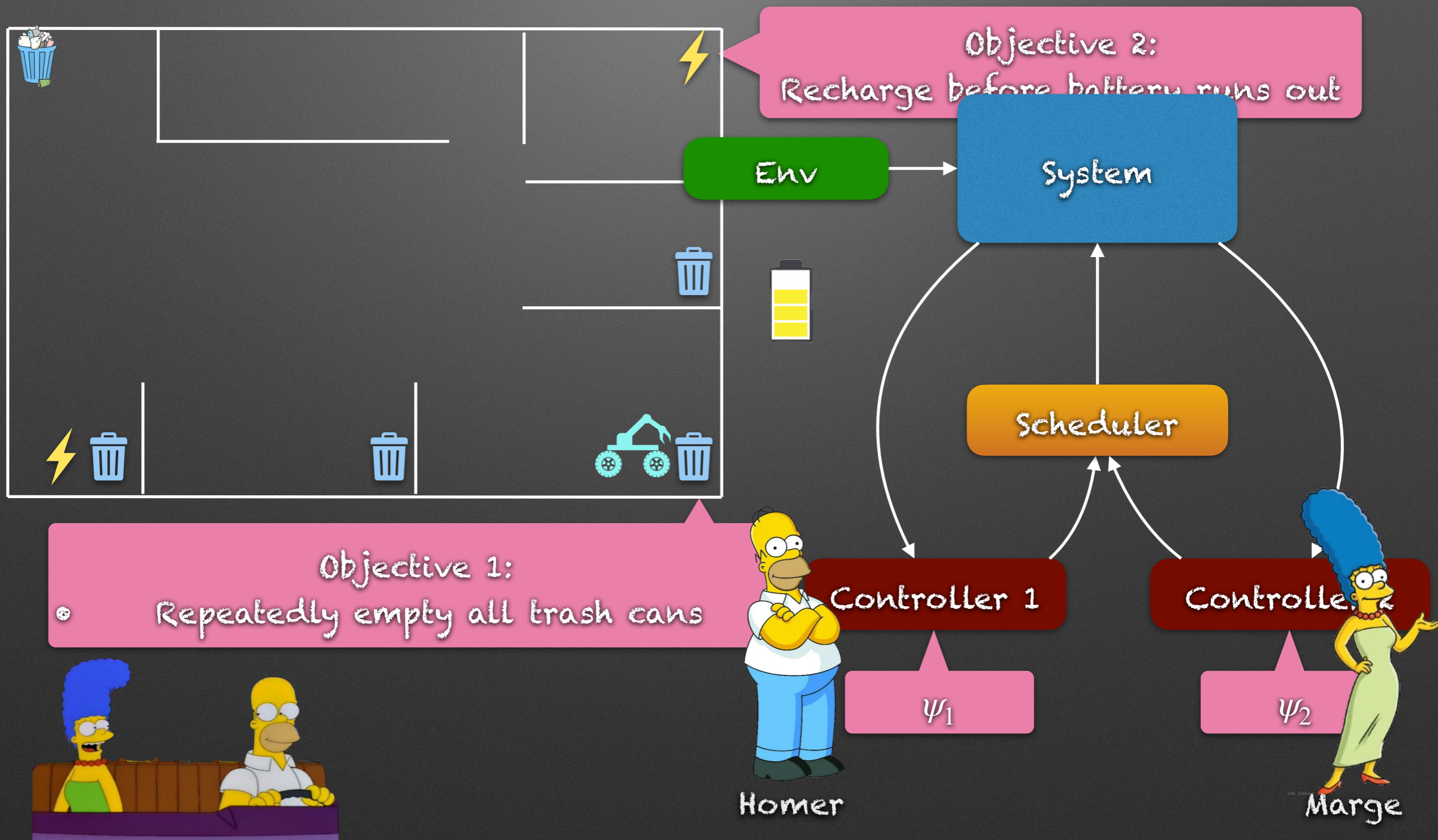
Multi-objective Decentralised Controller Synthesis



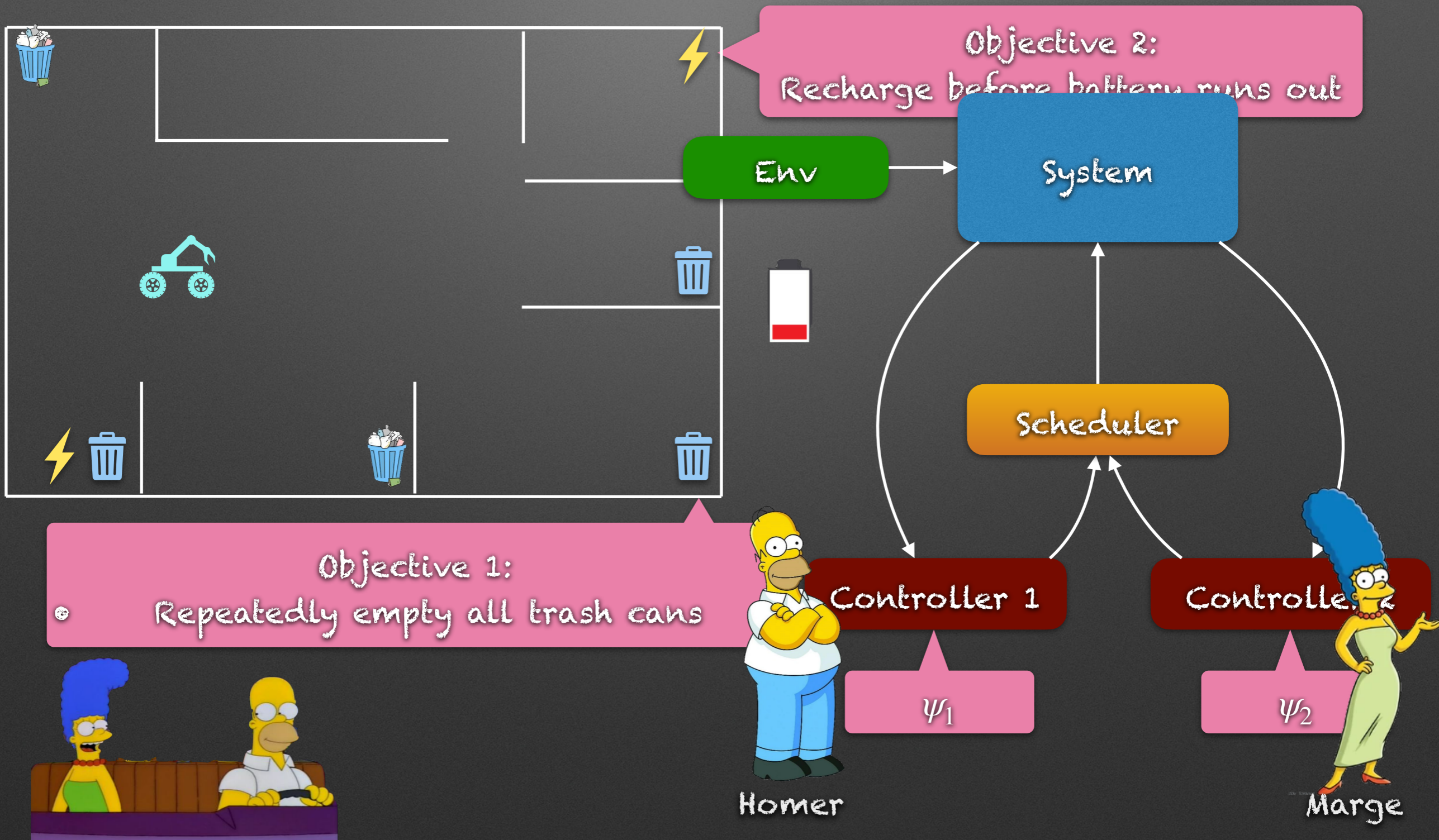
Multi-objective Decentralised Controller Synthesis



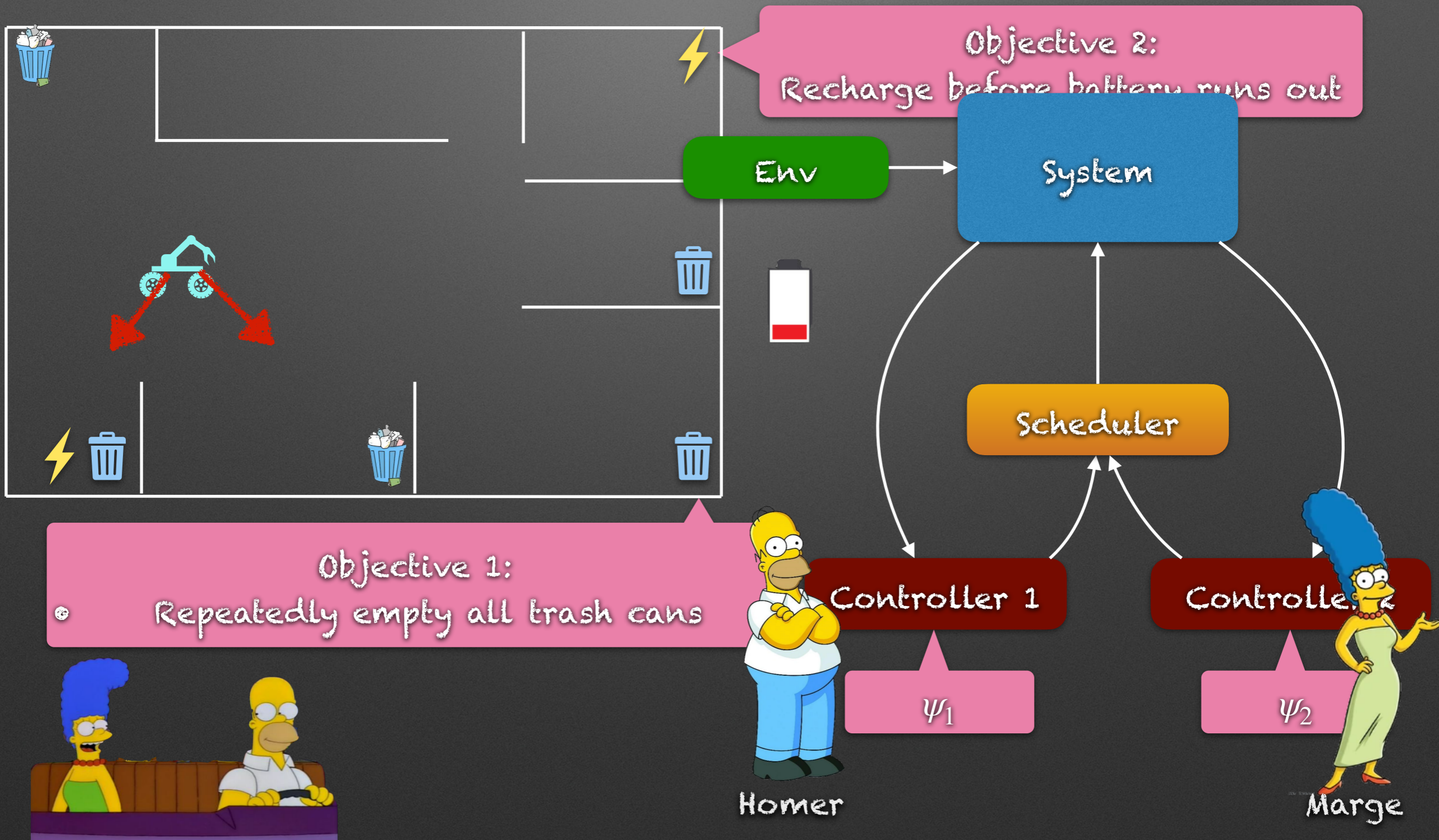
Multi-objective Decentralised Controller Synthesis



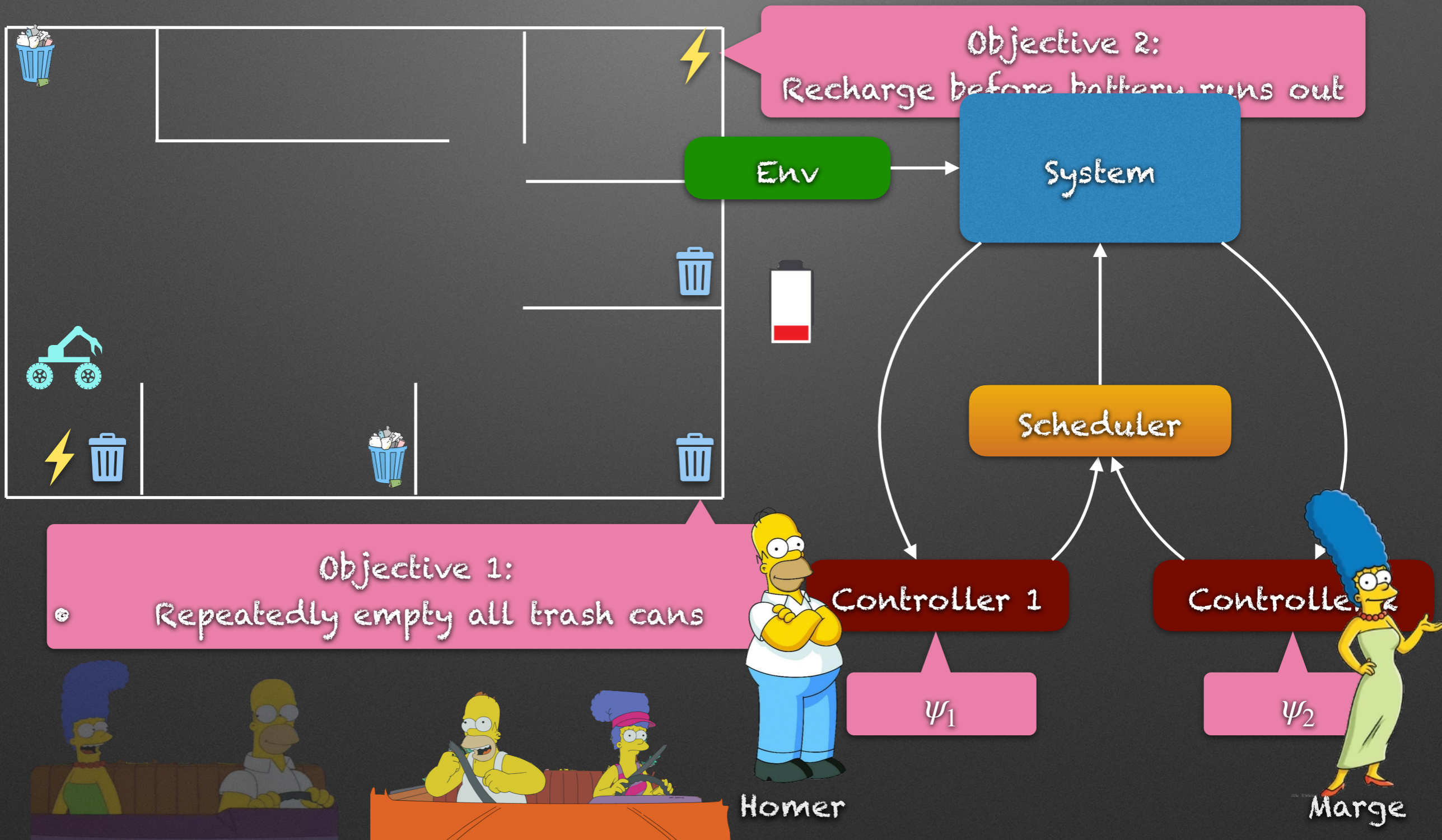
Multi-objective Decentralised Controller Synthesis



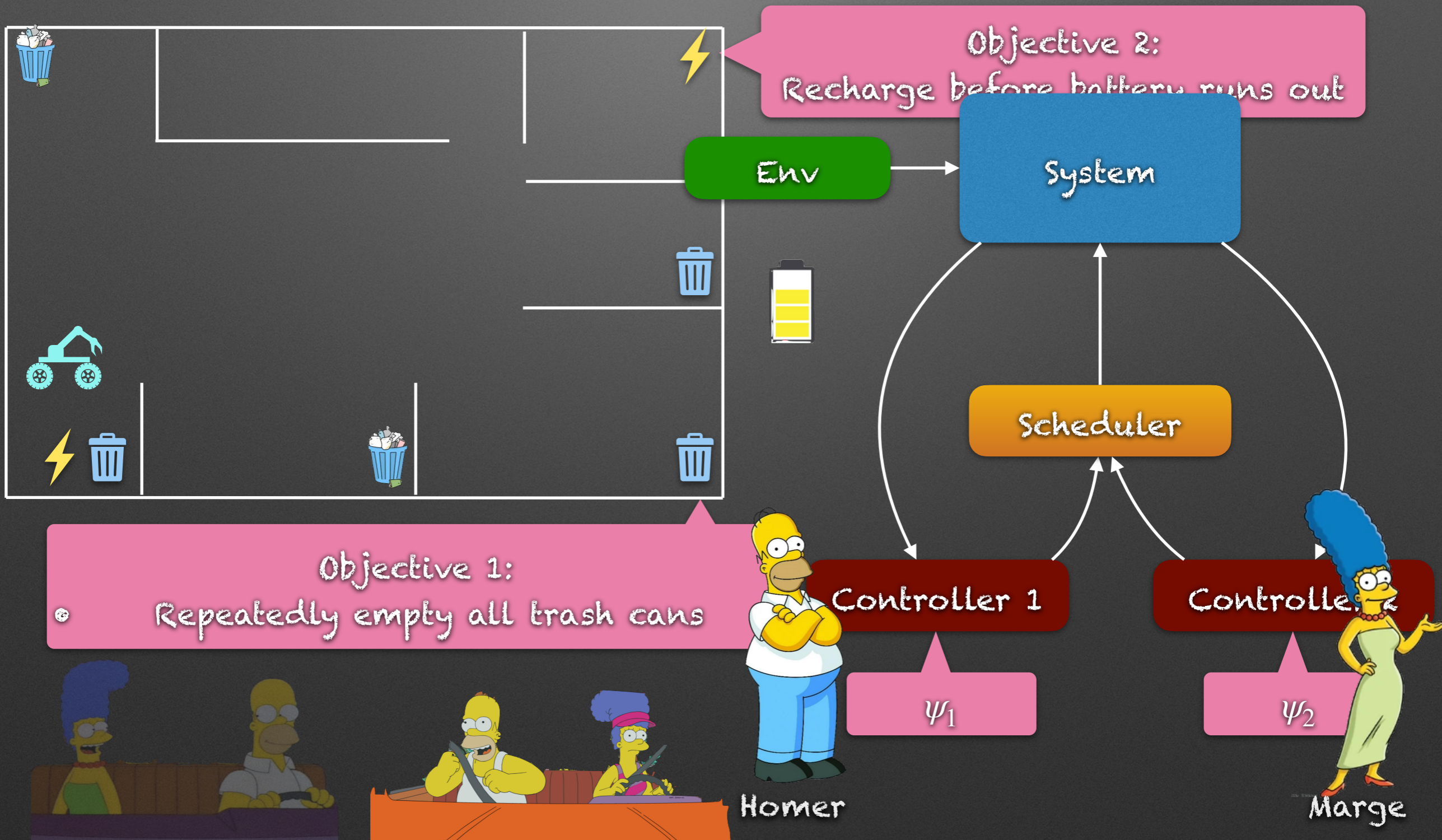
Multi-objective Decentralised Controller Synthesis



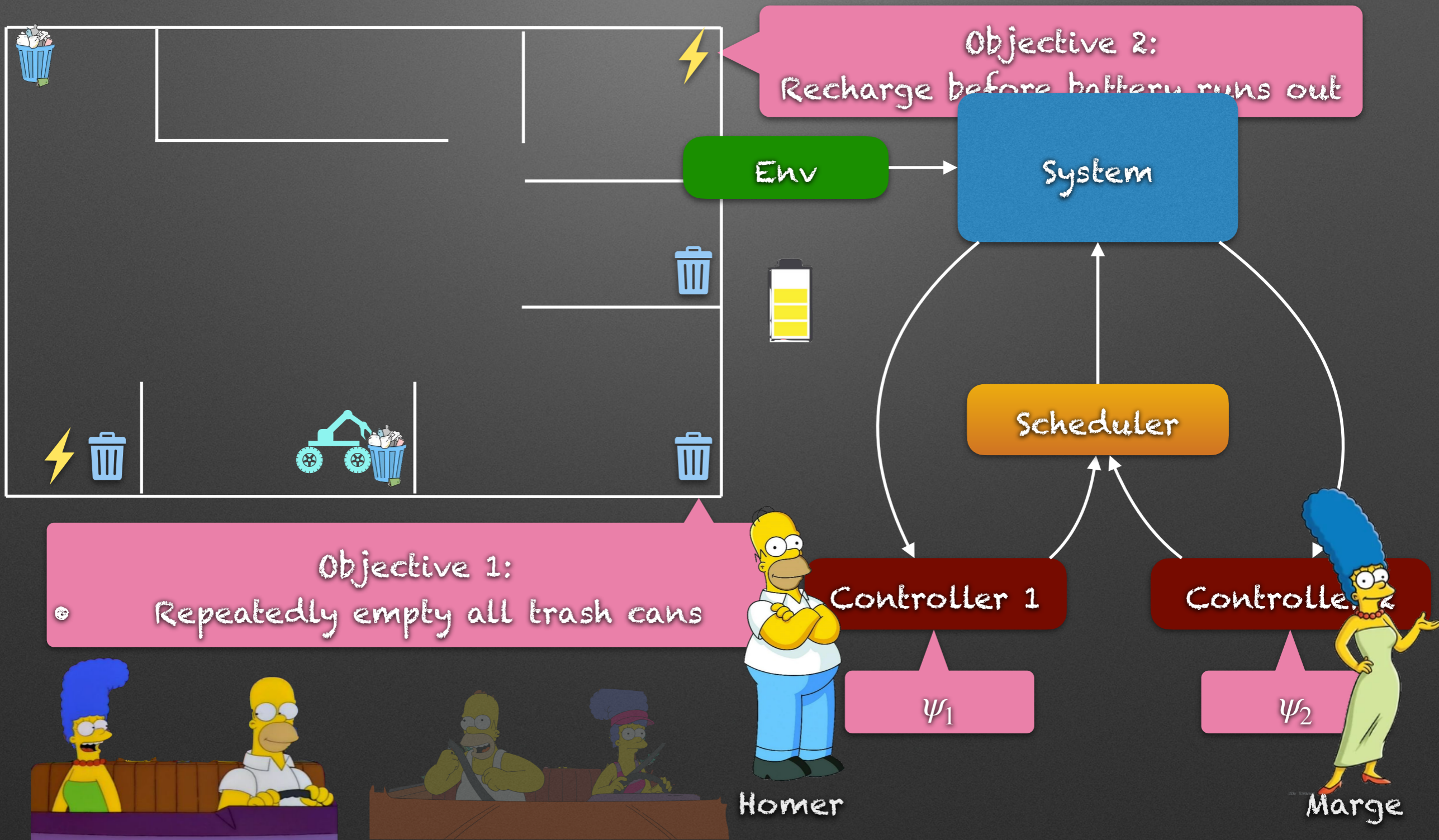
Multi-objective Decentralised Controller Synthesis



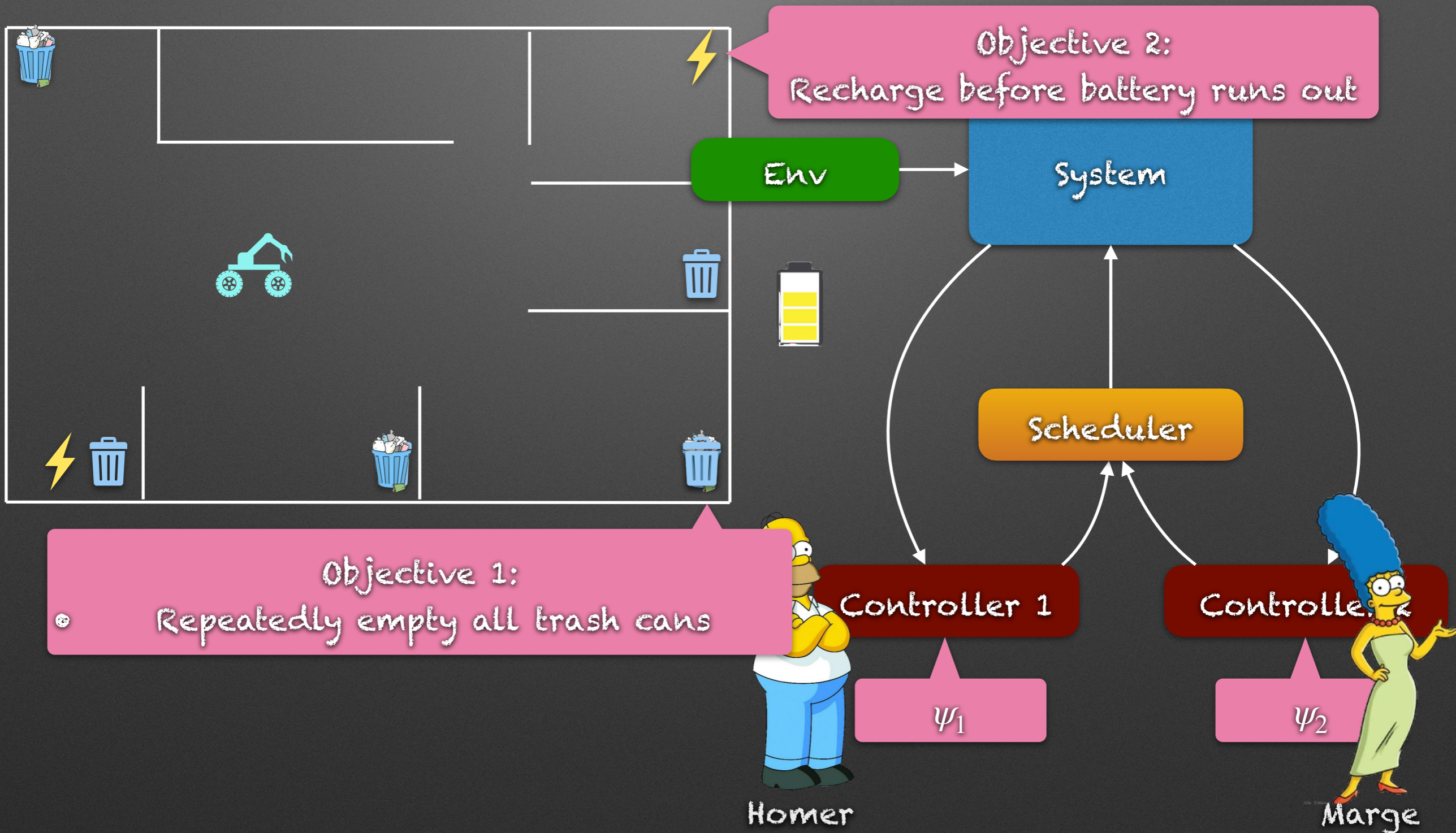
Multi-objective Decentralised Controller Synthesis



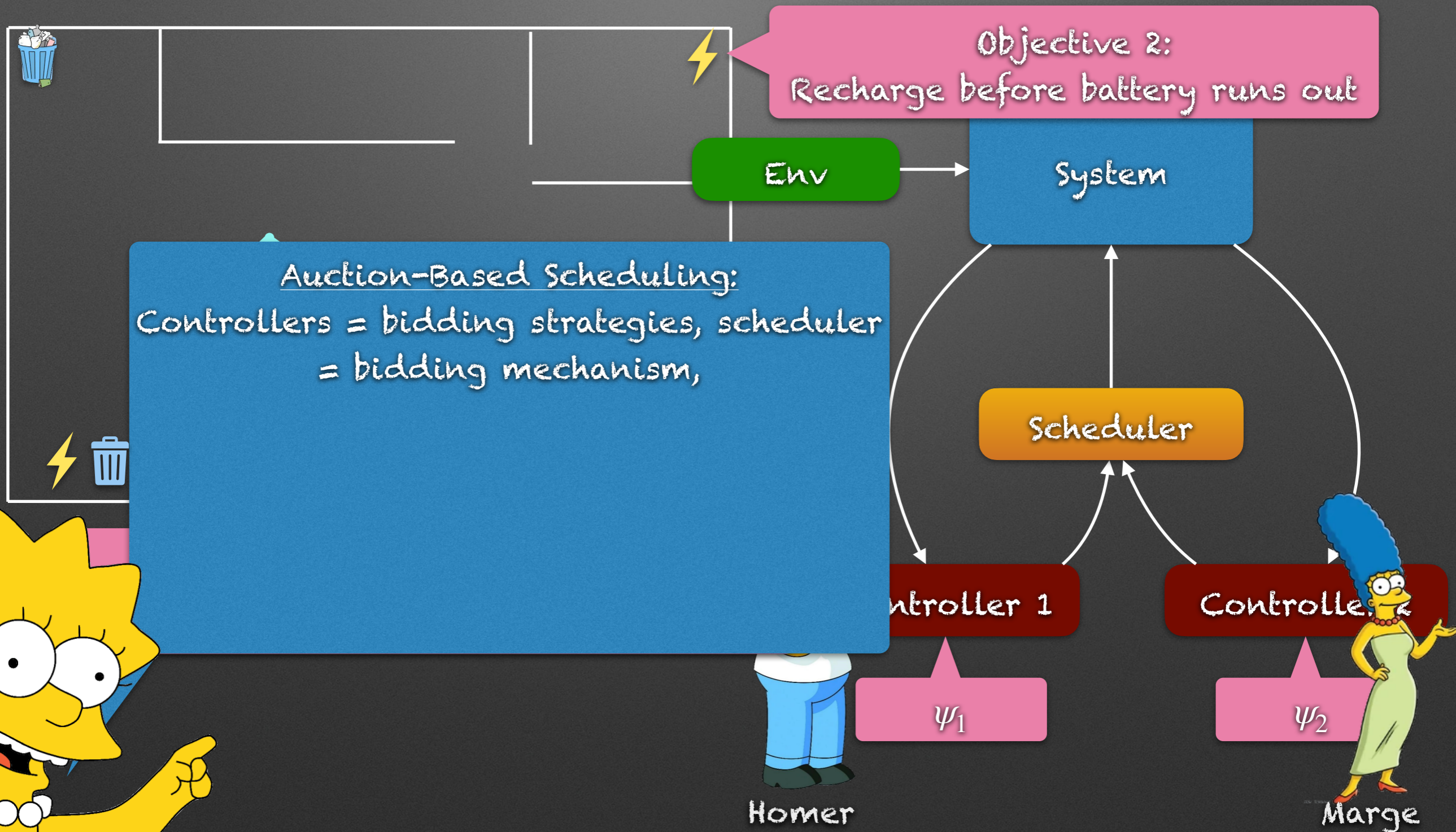
Multi-objective Decentralised Controller Synthesis



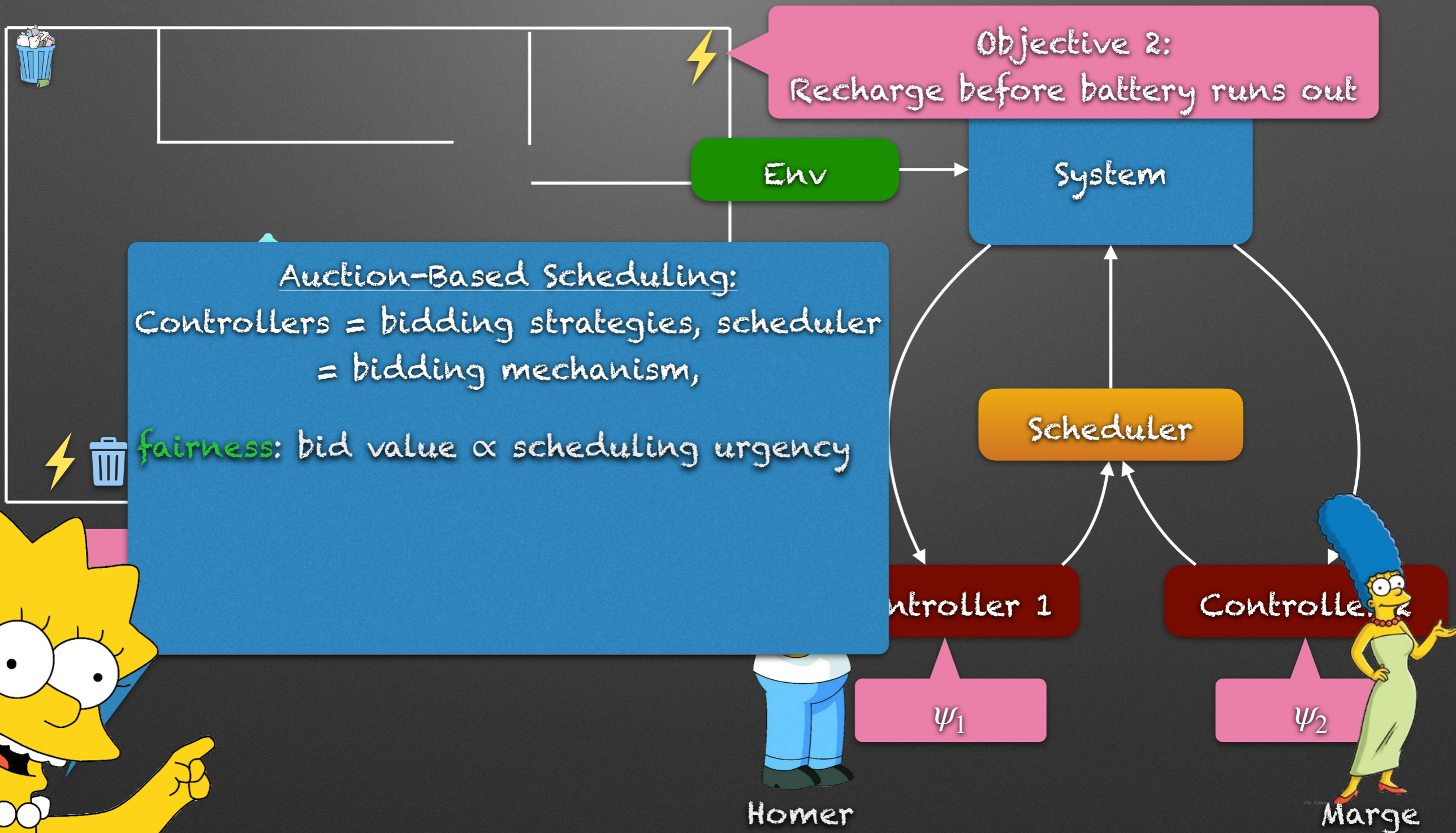
Multi-objective Decentralised Controller Synthesis



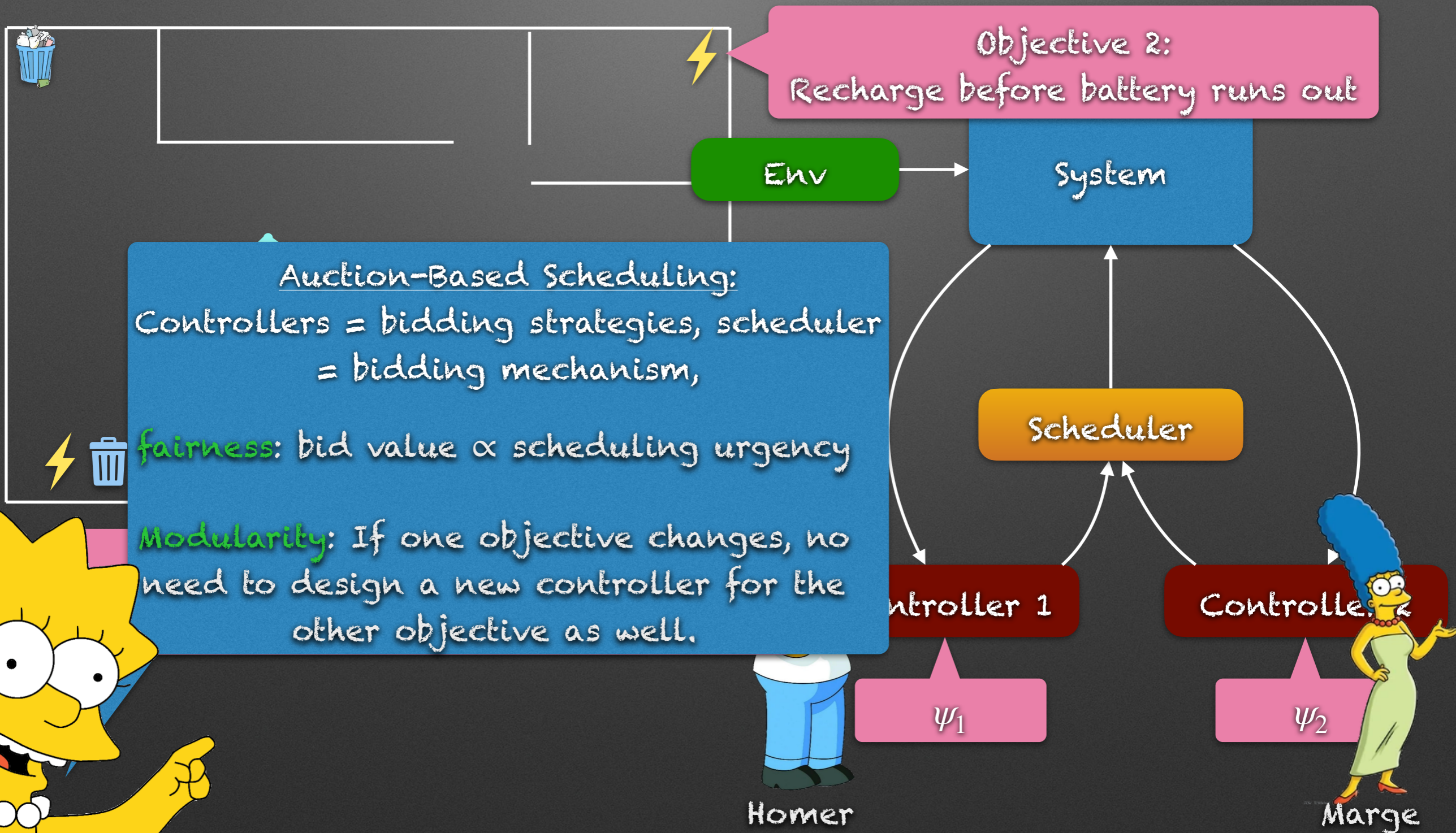
Multi-objective Decentralised Controller Synthesis



Multi-objective Decentralised Controller Synthesis



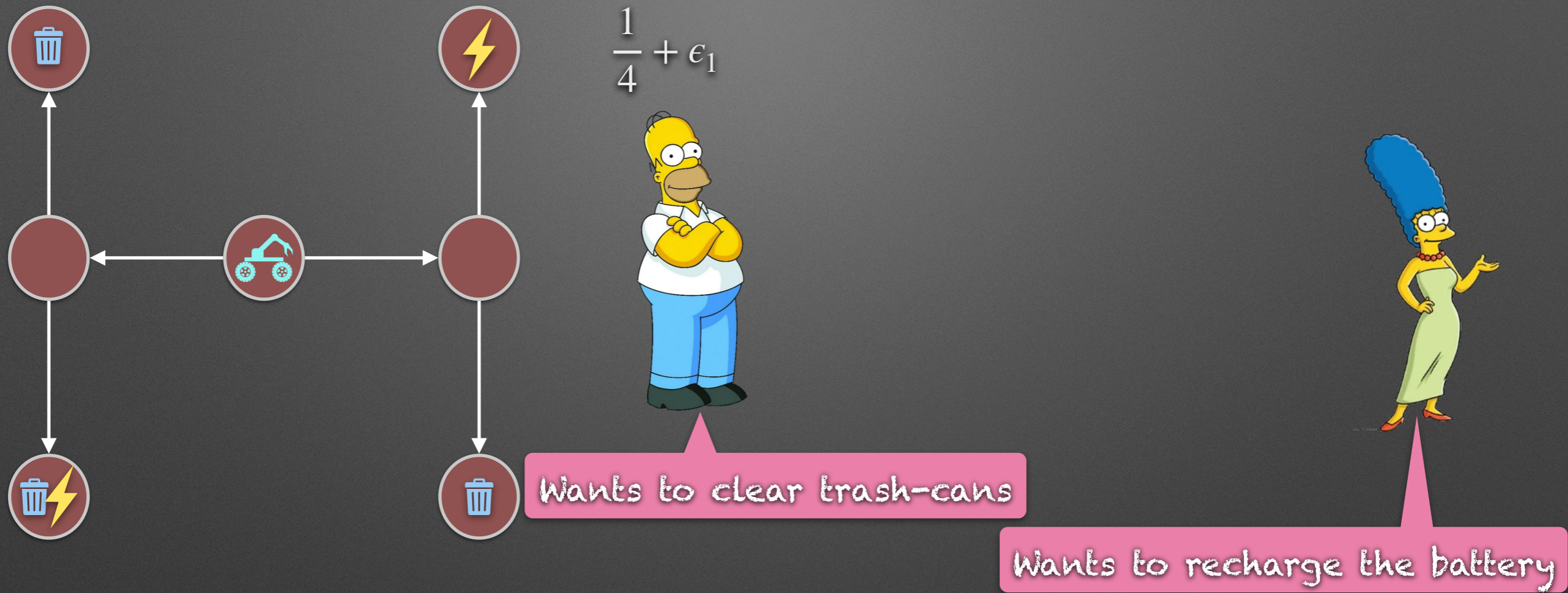
Multi-objective Decentralised Controller Synthesis



Auction-Based Scheduling

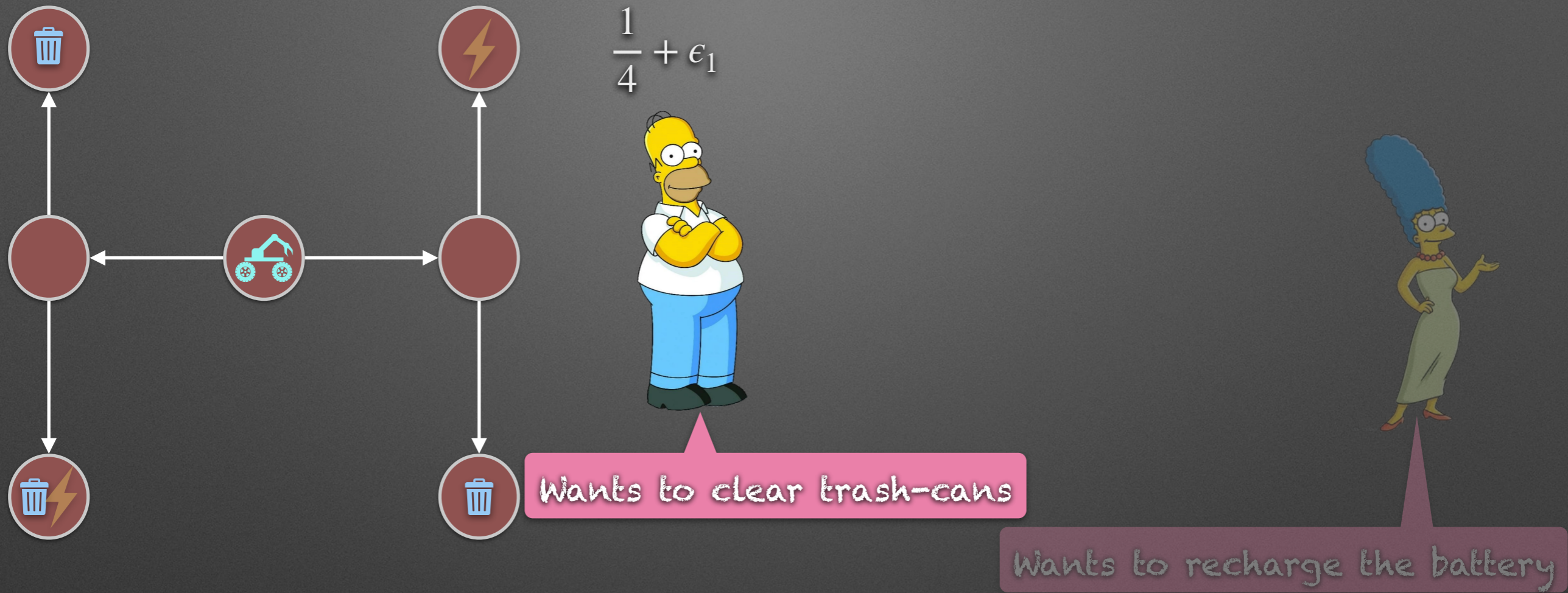


Auction-Based Scheduling



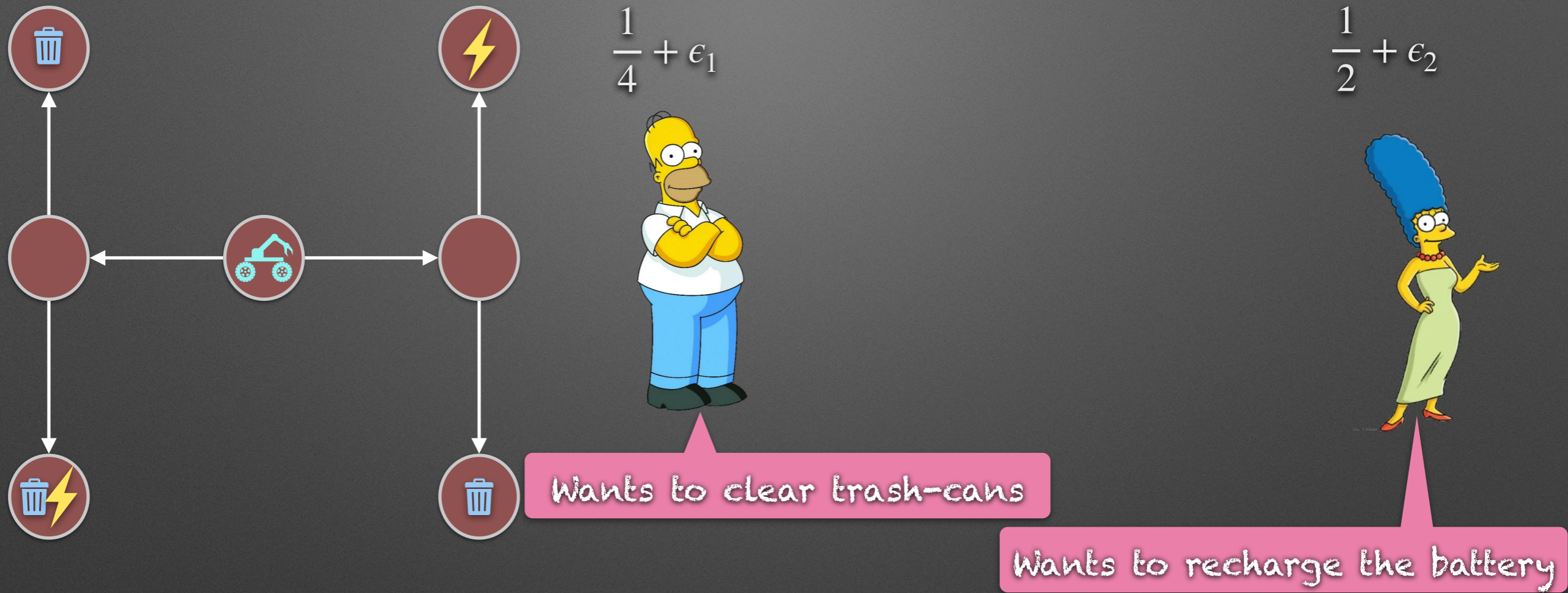
Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Auction-Based Scheduling



Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

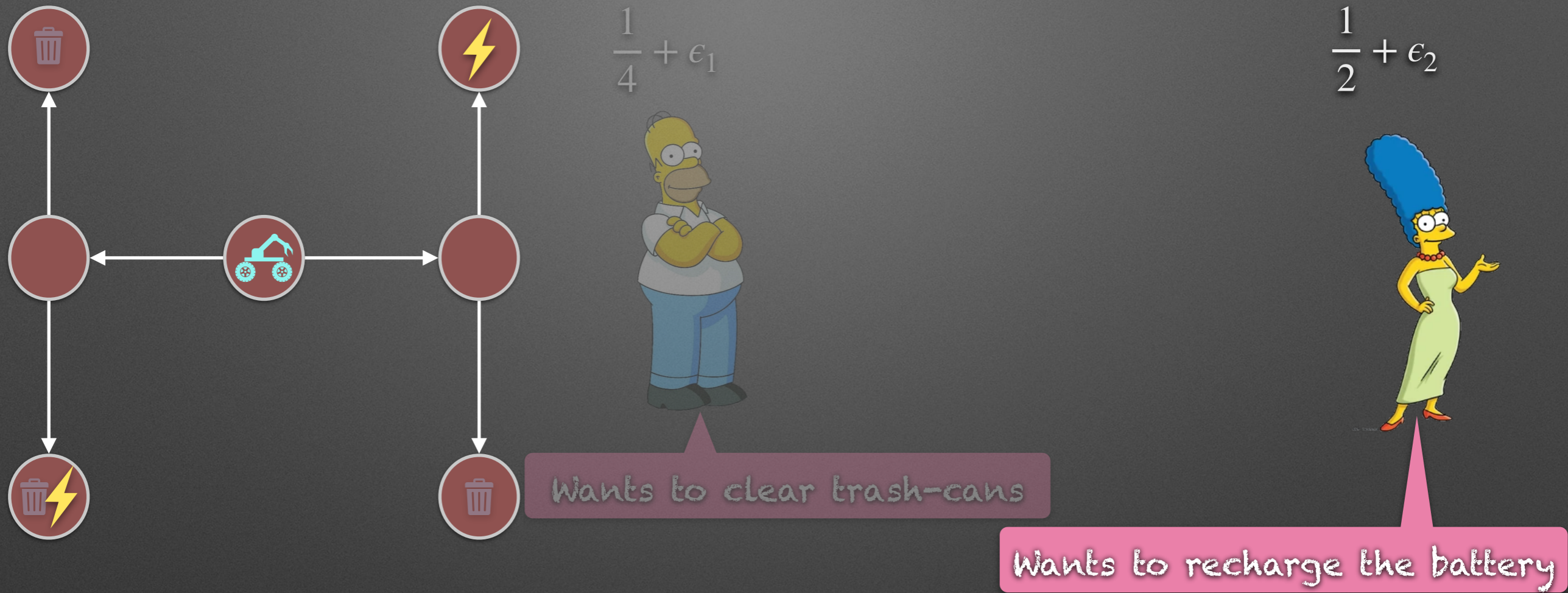
Auction-Based Scheduling



Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his objective with any budget of $> \frac{1}{2}$

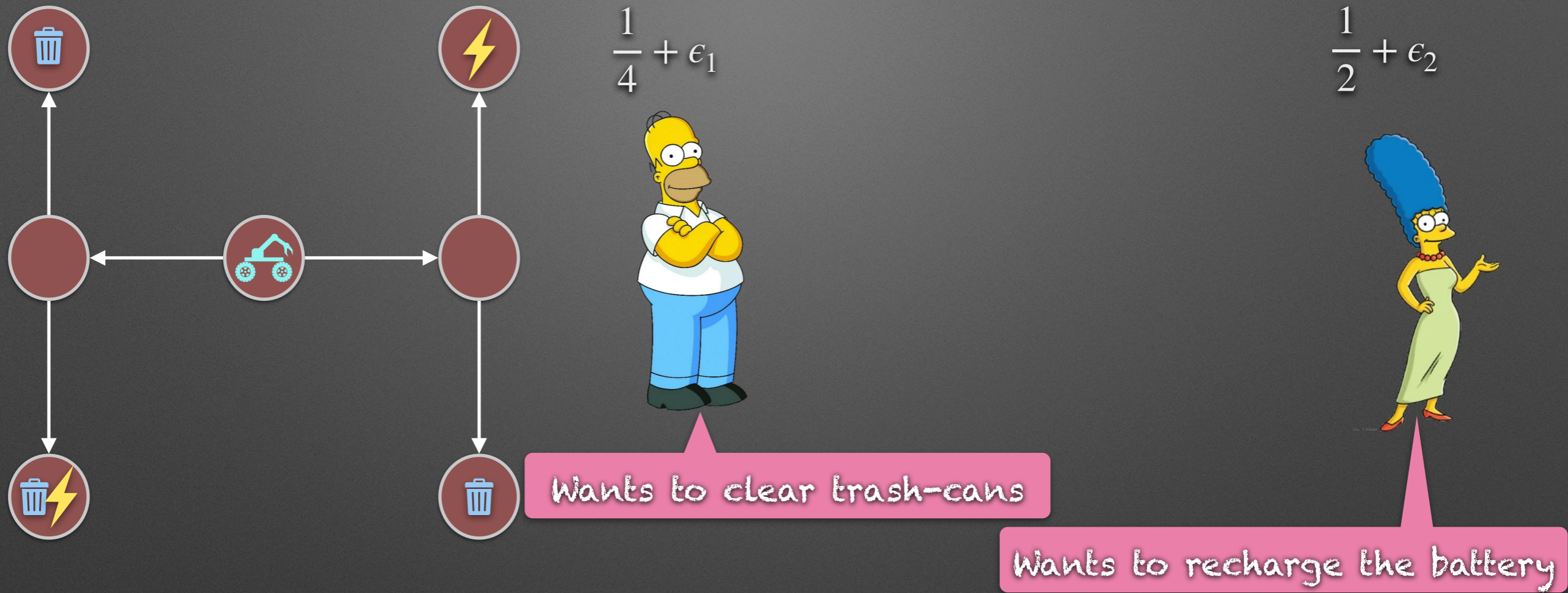
Auction-Based Scheduling



Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his objective with any budget of $> \frac{1}{2}$

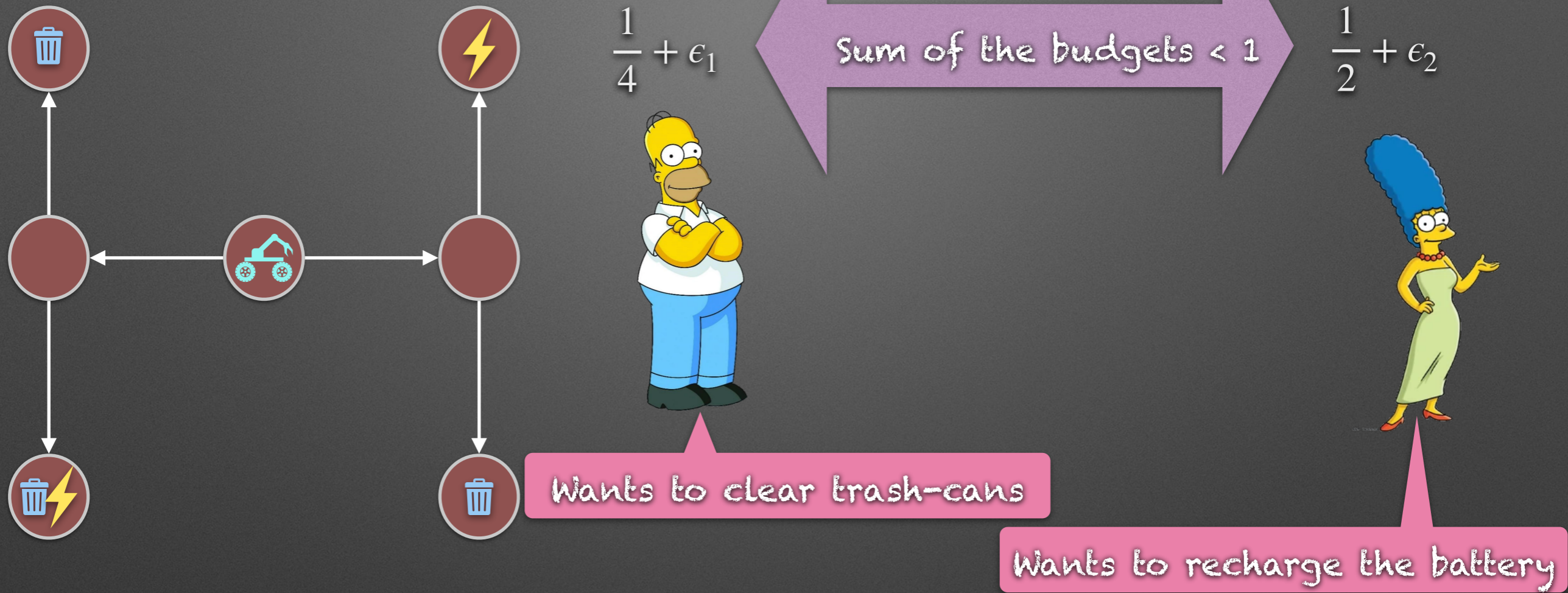
Auction-Based Scheduling



Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his objective with any budget of $> \frac{1}{2}$

Auction-Based Scheduling



Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his objective with any budget of $> \frac{1}{2}$

Auction-Based Scheduling



Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his objective with any budget of $> \frac{1}{2}$

Auction-Based Scheduling



Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his objective with any budget of $> \frac{1}{2}$

Auction-Based Scheduling



Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his objective with any budget of $> \frac{1}{2}$

Auction-Based Scheduling

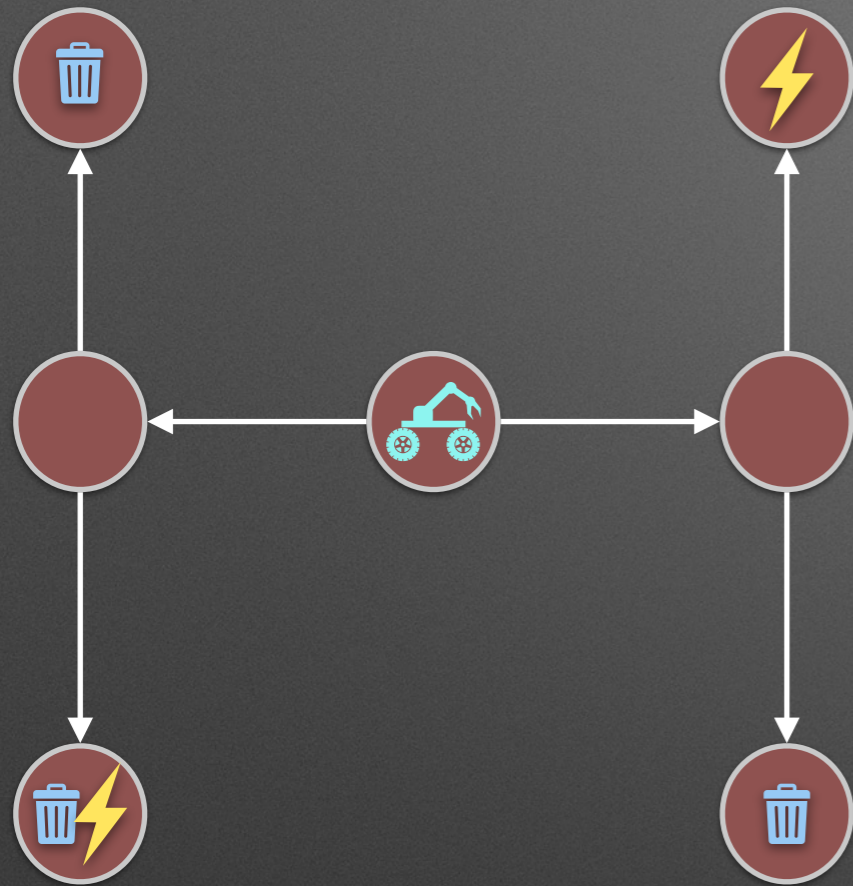


Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his objective with any budget of $> \frac{1}{2}$

Auction-Based Scheduling

$$\epsilon < \frac{1}{4}$$



ϵ



Wants to clear trash-cans

$1 - \epsilon$



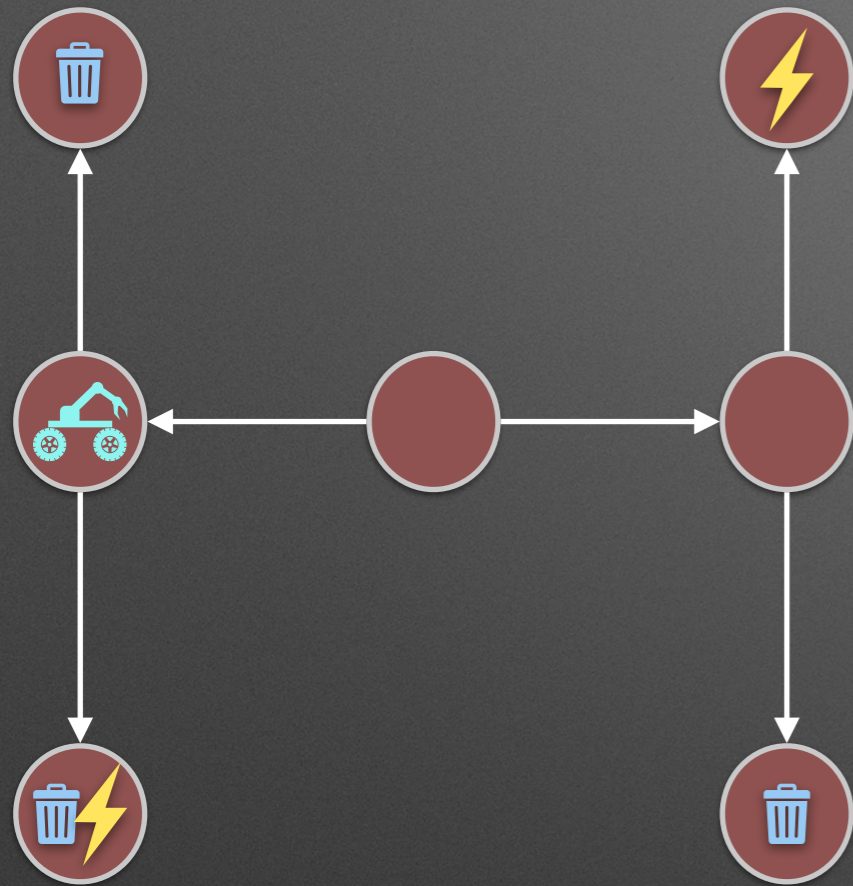
Wants to recharge the battery

Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his objective with any budget of $> \frac{1}{2}$

Auction-Based Scheduling

$$\epsilon < \frac{1}{4}$$



ϵ



Wants to clear trash-cans

$1 - \epsilon$



Wants to recharge the battery

Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his objective with any budget of $> \frac{1}{2}$

Auction-Based Scheduling

$$\epsilon < \frac{1}{4}$$



Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his objective with any budget of $> \frac{1}{2}$

Auction-Based Scheduling



Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his objective with any budget of $> \frac{1}{2}$

Auction-Based Scheduling



Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his objective with any budget of $> \frac{1}{2}$

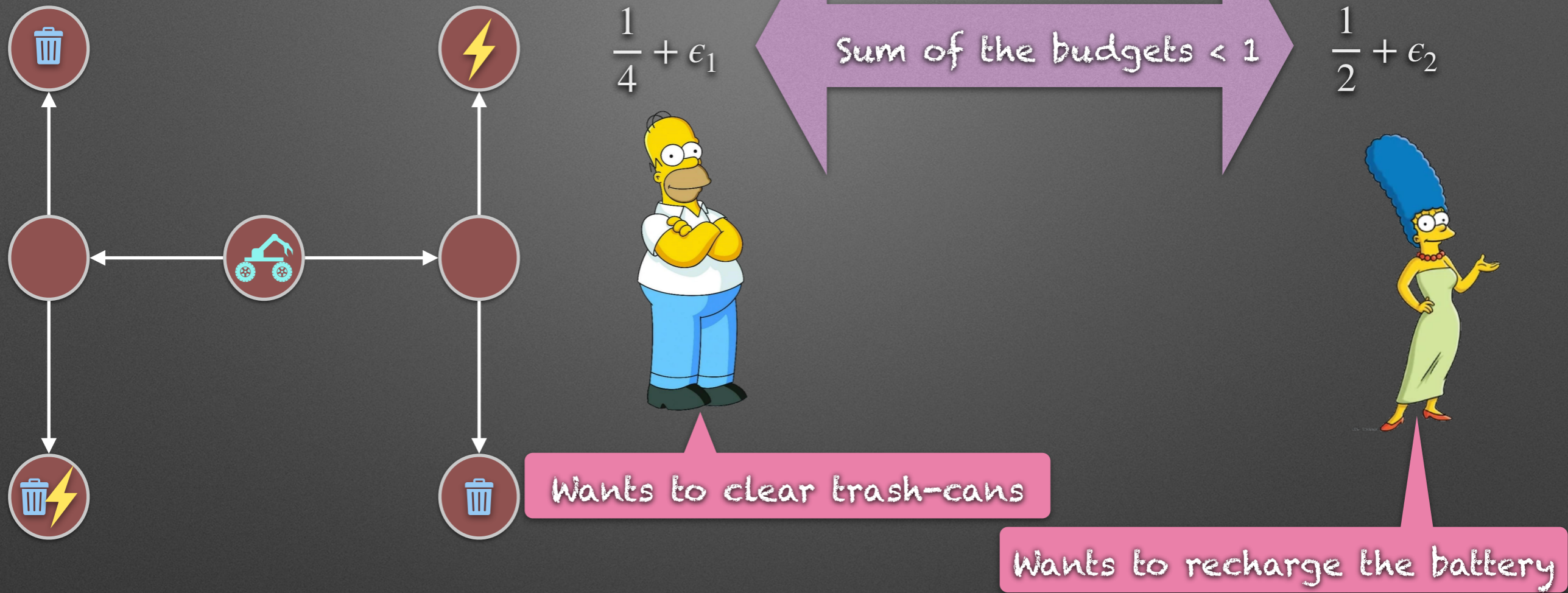
Auction-Based Scheduling



Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his objective with any budget of $> \frac{1}{2}$

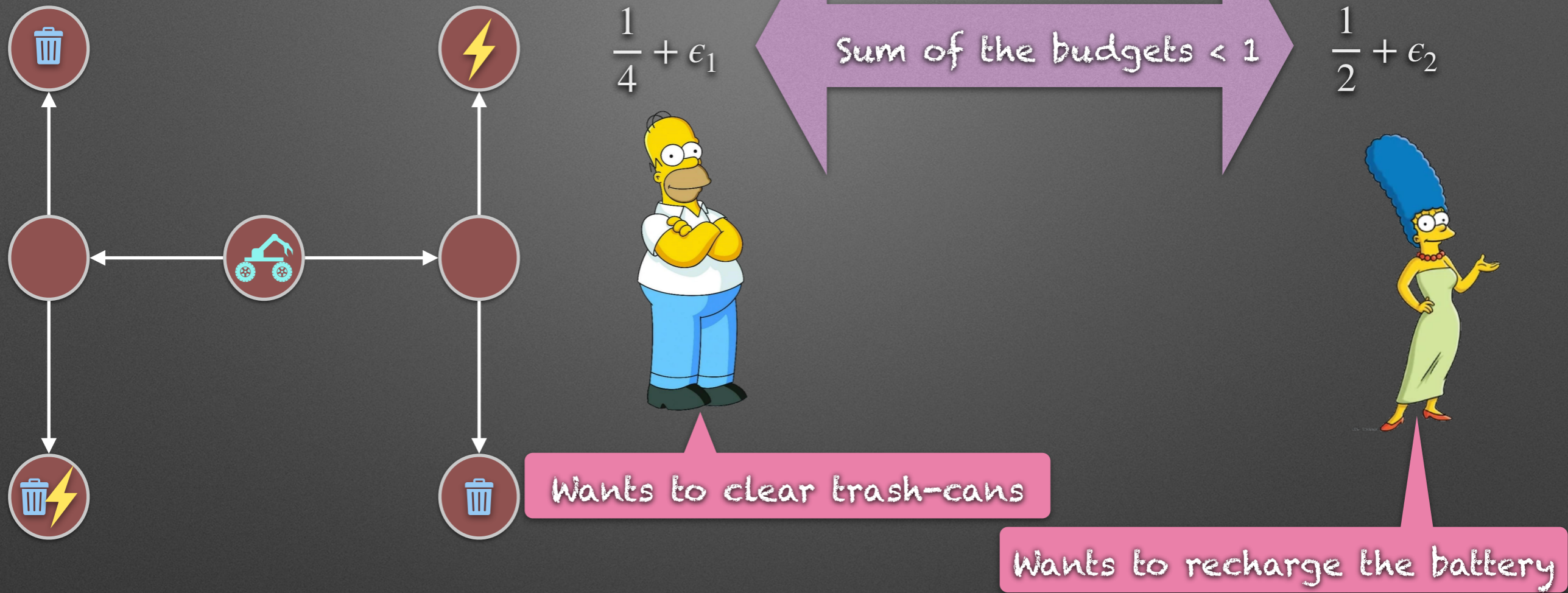
Auction-Based Scheduling



Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his objective with any budget of $> \frac{1}{2}$

Auction-Based Scheduling

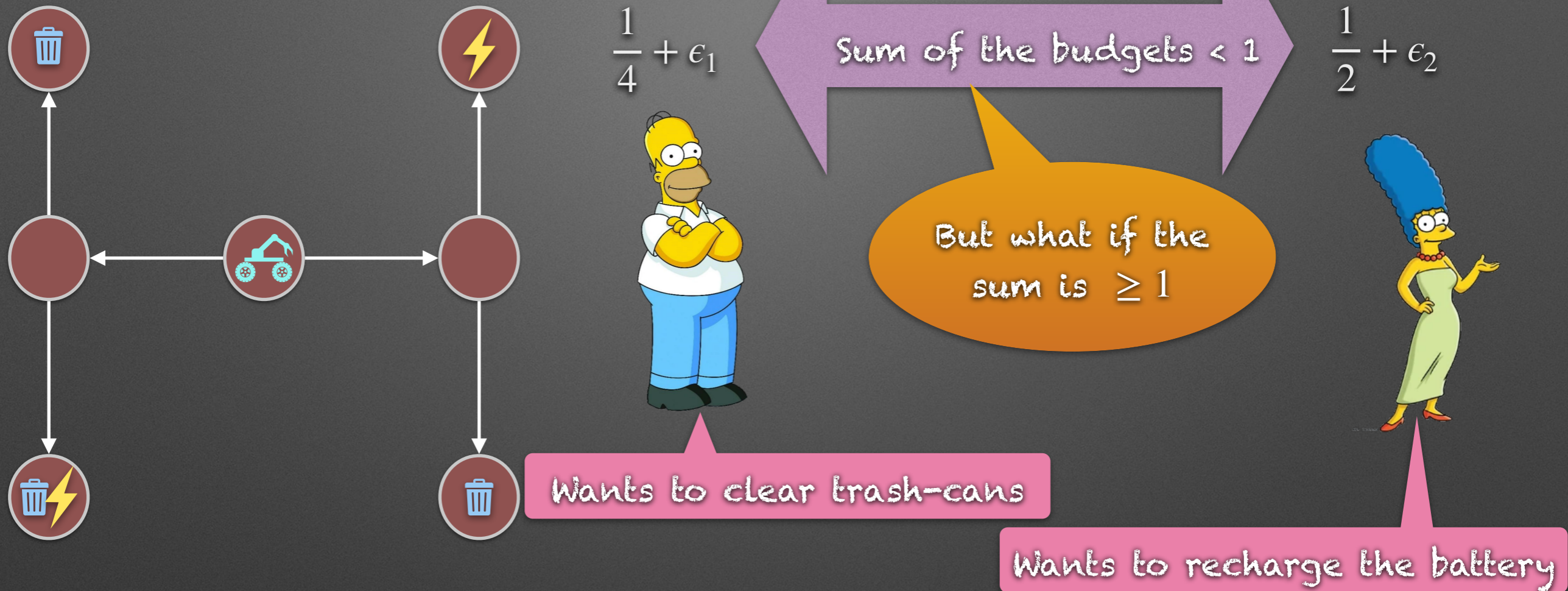


Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his o

"Strong" Synthesis: Winning strategies can be synthesized (in decentralised manner) AND composed without knowing other player's objective

Auction-Based Scheduling

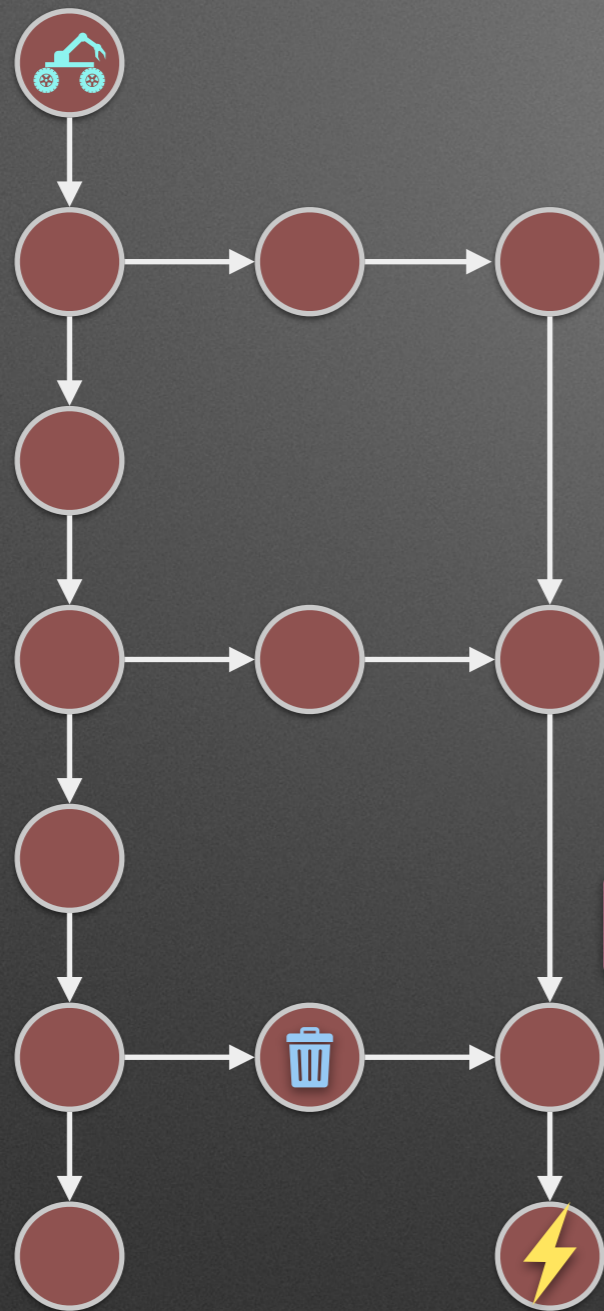


Claim 1: Homer can fulfil his objective with any budget of $> \frac{1}{4}$

Claim 2: Marge can fulfil his o

"Strong" Synthesis: Winning strategies can be synthesized (in decentralised manner) AND composed without knowing other player's objective

Classification based on Assumption

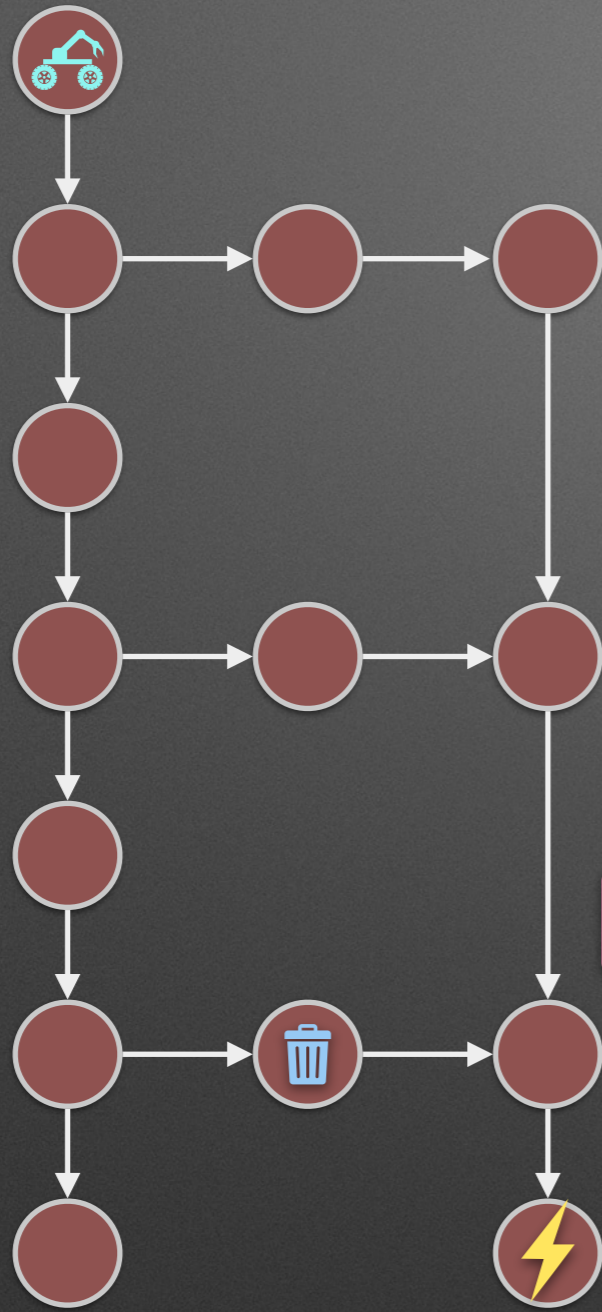


Wants to clear trash-cans



Wants to recharge the battery

Classification based on Assumption



$$\frac{7}{8} + \epsilon_1$$



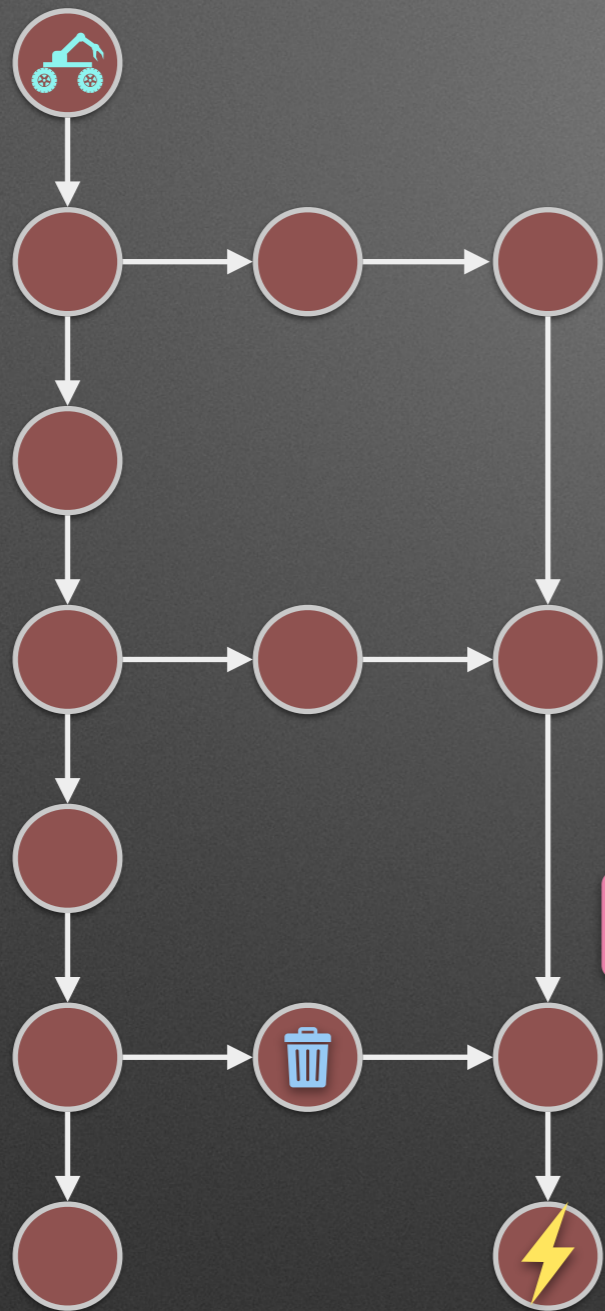
Wants to clear trash-cans

$$\frac{1}{8} + \epsilon_2$$



Wants to recharge the battery

Classification based on Assumption



$$\frac{7}{8} + \epsilon_1$$



Wants to clear trash-cans

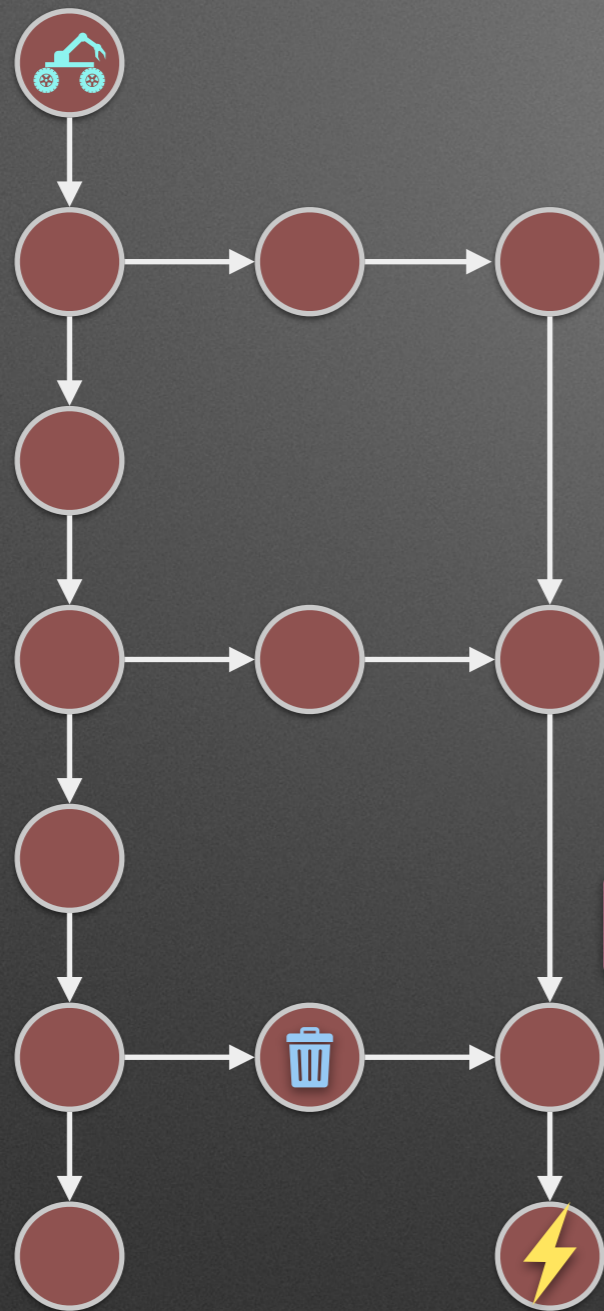
Sum of the budgets > 1

$$\frac{1}{8} + \epsilon_2$$



Wants to recharge the battery

Classification based on Assumption



$$\frac{7}{8} + \epsilon_1$$



Wants to clear trash-cans

Sum of the budgets > 1

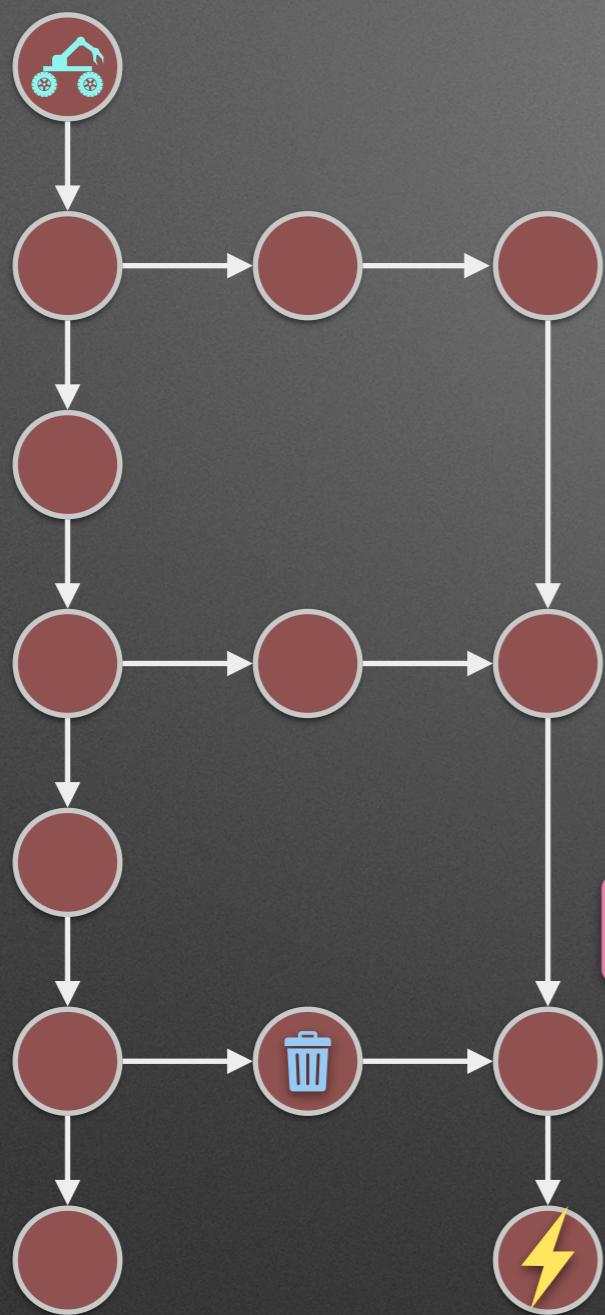
FAILS!!

$$\frac{1}{8} + \epsilon_2$$



Wants to recharge the battery

Classification based on Assumption



$$\frac{7}{8} + \epsilon_1$$



Wants to clear trash-cans

Sum of the budgets > 1

FAILS!!

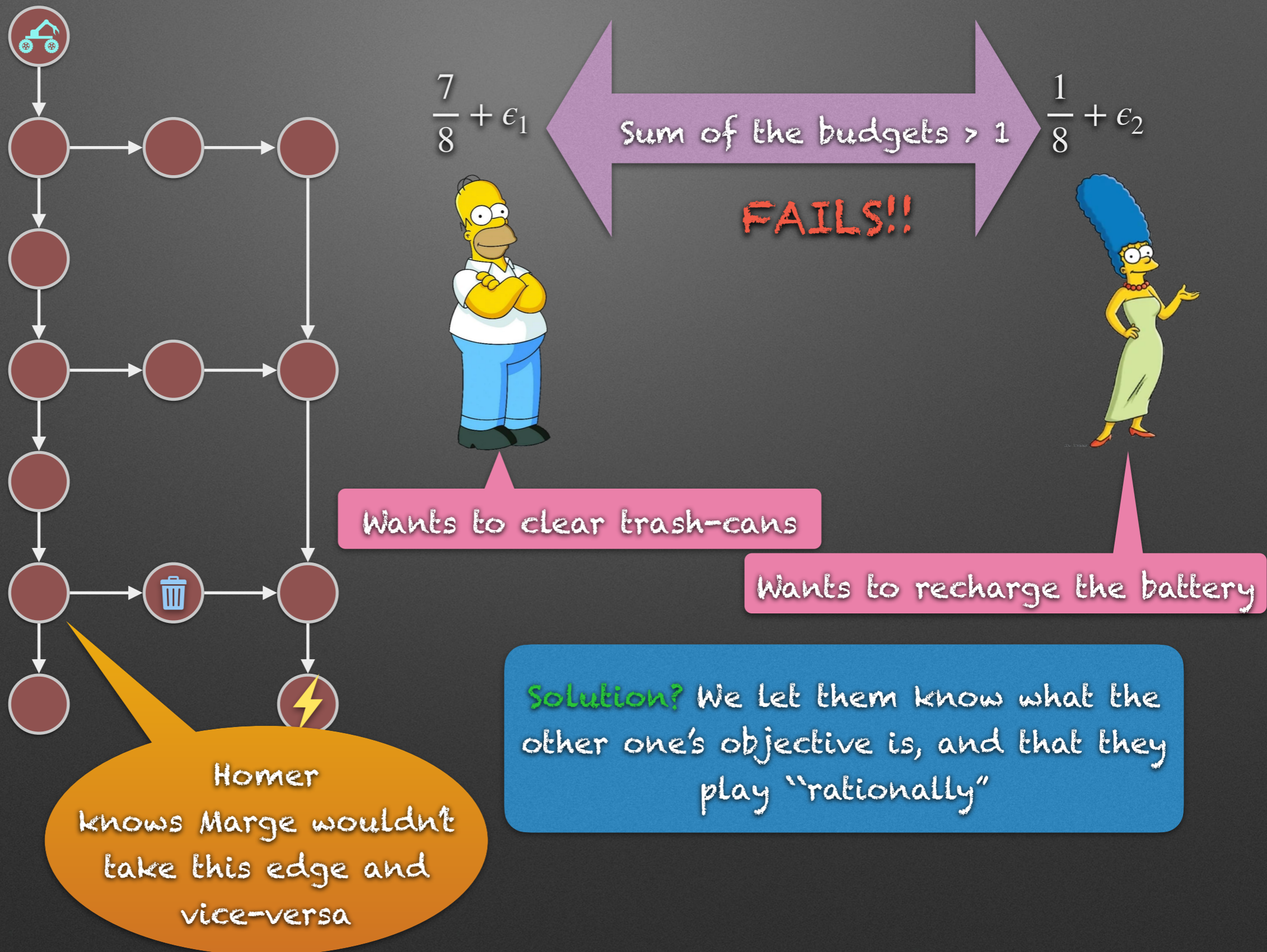
$$\frac{1}{8} + \epsilon_2$$



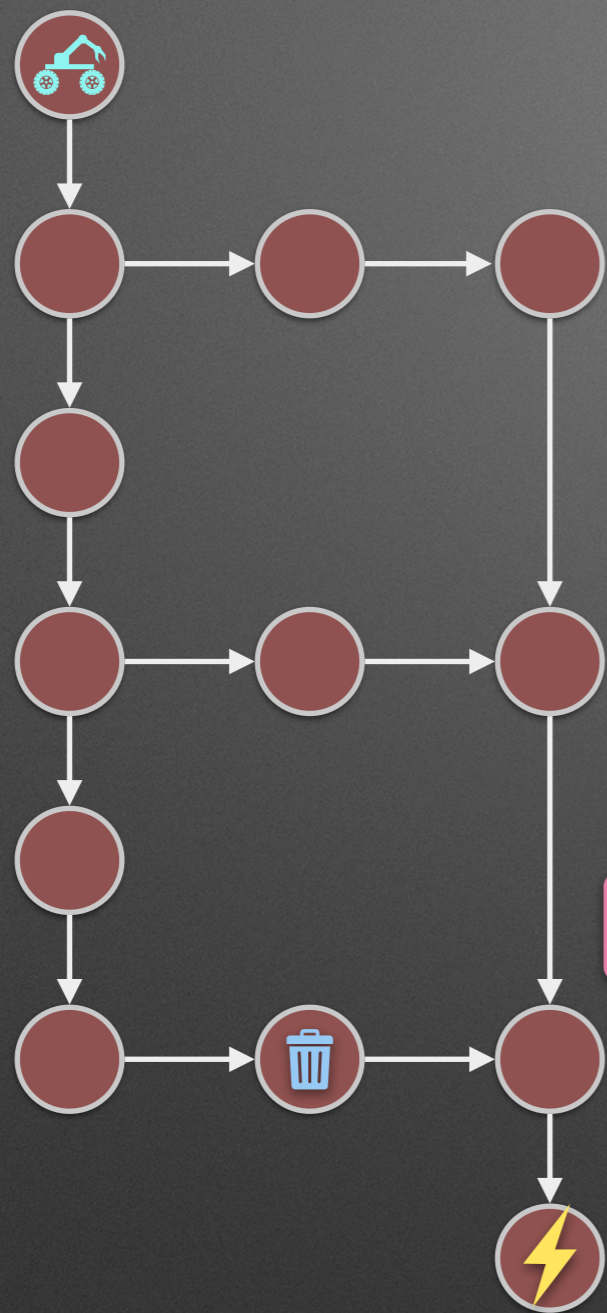
Wants to recharge the battery

Solution? We let them know what the other one's objective is, and that they play "rationally"

Classification based on Assumption



Classification based on Assumption



$$\frac{7}{8} + \epsilon_1$$



Wants to clear trash-cans

Sum of the budgets > 1

FAILS!!

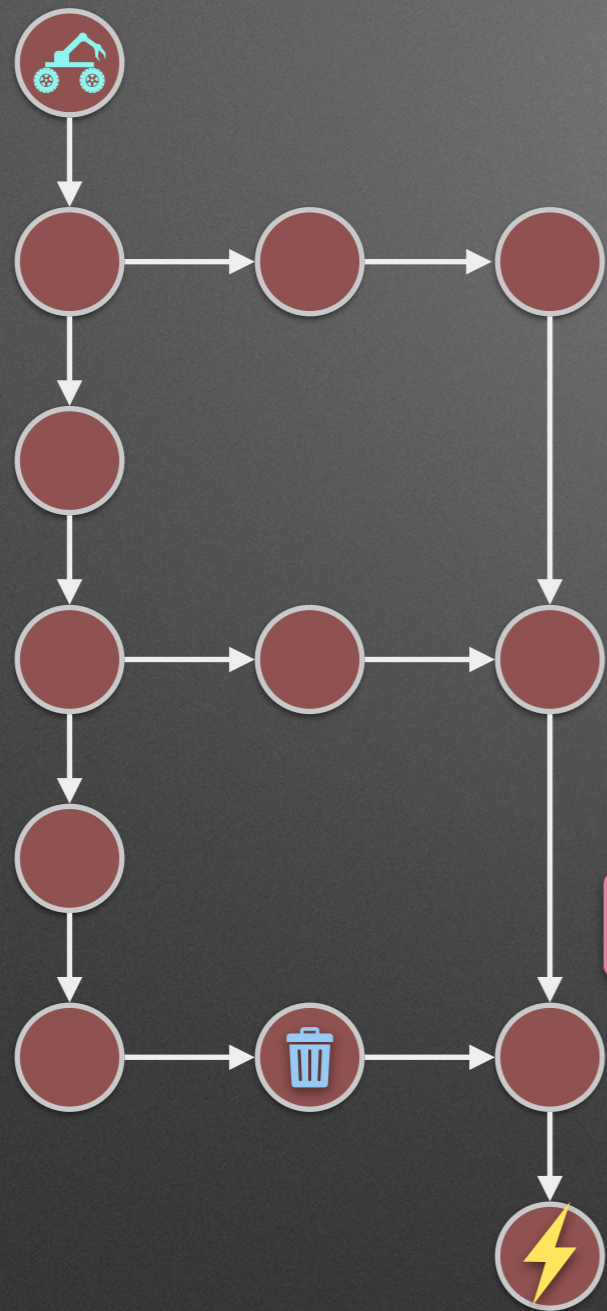
$$\frac{1}{8} + \epsilon_2$$



Wants to recharge the battery

Solution? We let them know what the other one's objective is, and that they play "rationally"

Classification based on Assumption



$$> \frac{3}{4}$$



Wants to clear trash-cans

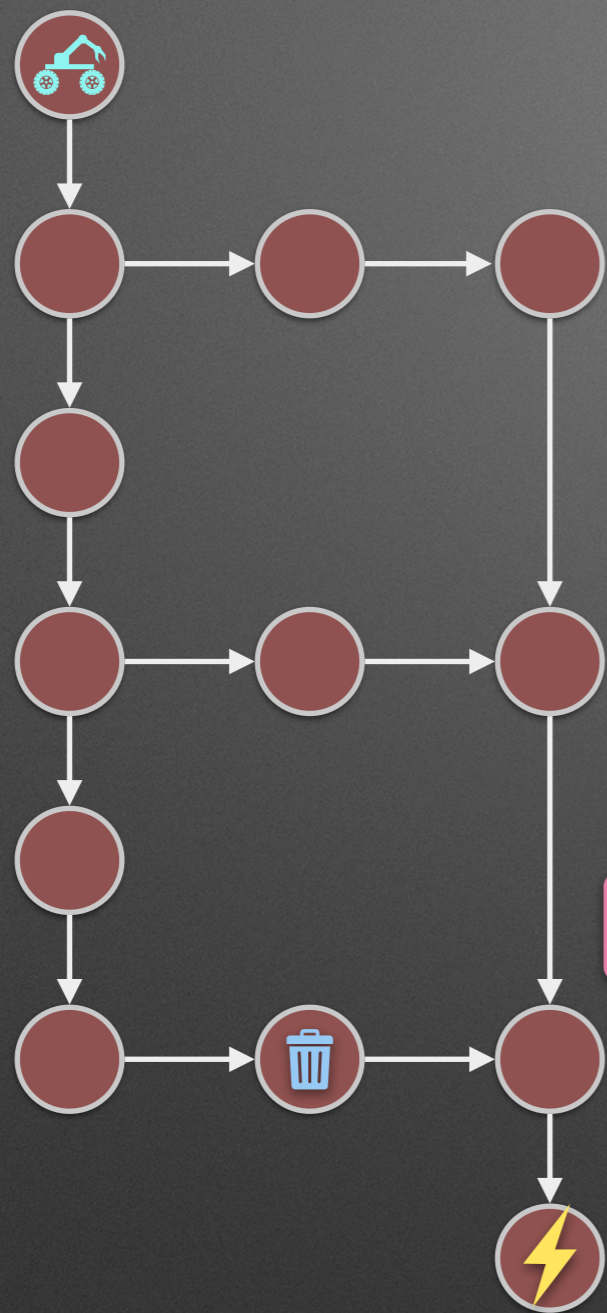
$$> 0$$



Wants to recharge the battery

Solution? We let them know what the other one's objective is, and that they play "rationally"

Classification based on Assumption



$$> \frac{3}{4}$$



Wants to clear trash-cans

Sum of the budgets < 1

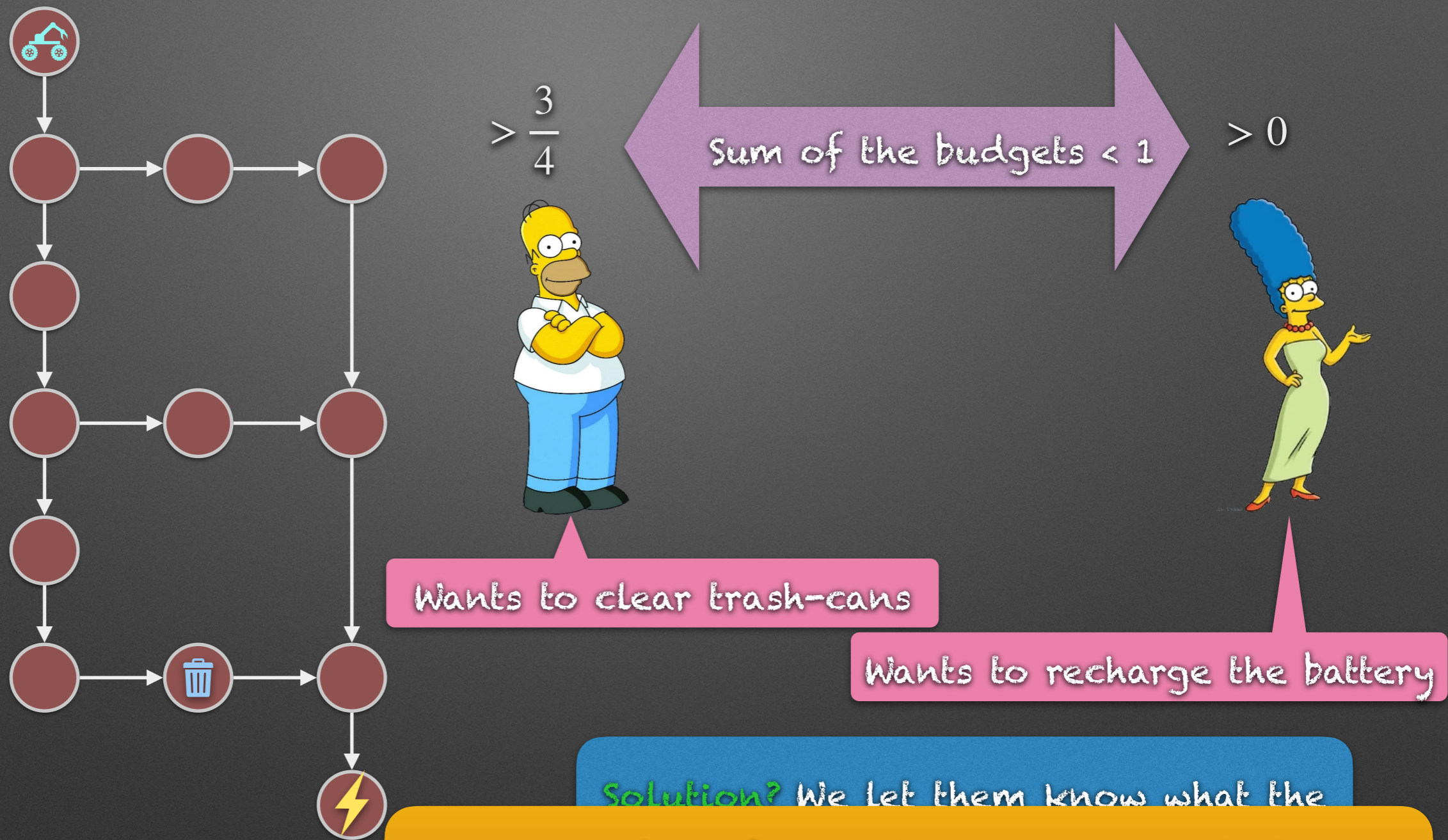
$$> 0$$



Wants to recharge the battery

Solution? We let them know what the other one's objective is, and that they play "rationally"

Classification based on Assumption



"Assume-admissible" Synthesis: Winning strategies can be synthesized (in decentralised manner) AND composed after knowing the other player's objective, and their rational behaviour

Auction-based Scheduling Problem - (somewhat) Formally

Input: A graph-arena G and two non-conflicting objectives

Output: **Yes**, if we can **synthesise** two controllers and **schedule them via bidding** so that they fulfil their own objectives.

Auction-based Scheduling Problem - (somewhat) Formally

Input: A graph-arena G and two non-conflicting objectives

Output: **Yes**, if we can **synthesise** two controllers and **schedule** them **via bidding** so that they fulfil their own objectives.

For a given set of assumptions about the other controller

Auction-based Scheduling Problem - (somewhat) Formally

Input: A graph-arena G and two non-conflicting objectives

Output: **Yes**, if we can **synthesise** two controllers and **schedule** them **via bidding** so that they fulfil their own objectives.

For a given set of assumptions about the other controller

Strong Synthesis:

- No knowledge about objective, no assumption about behaviour, quite flexible if solution exists
- Restricted solution space

Auction-based Scheduling Problem - (somewhat) Formally

Input: A graph-arena G and two non-conflicting objectives

Output: **Yes**, if we can **synthesise** two controllers and **schedule** them via **bidding** so that they fulfil their own objectives.

For a given set of assumptions about the other controller

Strong Synthesis:

- No knowledge about objective, no assumption about behaviour, quite flexible if solution exists
- Restricted solution space

Assume-admissible Synthesis:

- Knowledge about objective, rational behavioural assumption, less flexible
- Solution space expanded

Auction-based Scheduling Problem - (somewhat) Formally

Input: A graph-arena G and two non-conflicting objectives

Output: **Yes**, if we can **synthesise** two controllers and **schedule them via bidding** so that they fulfil their own objectives.

For a given set of assumptions about the other controller

Strong Synthesis:

- No knowledge about objective, no assumption about behaviour, quite flexible if solution exists
- Restricted solution space

Assume-admissible Synthesis:

- Knowledge about objective, rational behavioural assumption, less flexible
- Solution space expanded

Assume-guarantee synthesis:

- Knowledge about objective, exact behavioural assumption, least flexible
- Solution space expanded more

Auction-based Scheduling Problem - (somewhat) Formally

Input: A graph-arena G and two non-conflicting objectives

Output: **Yes**, if we can **synthesise** two controllers and **schedule** them **via bidding** so that they fulfil their own objectives.

For a given set of assumptions about the other controller

Tradeoff between knowledge/assumption/flexibility vs solution

Strong Synthesis:

- No knowledge about objective, no assumption about behaviour, quite flexible if solution exists
- Restricted solution space

Assume-admissible Synthesis:

- Knowledge about objective, rational behavioural assumption, less flexible
- Solution space expanded

Assume-guarantee synthesis:

- Knowledge about objective, exact behavioural assumption, least flexible
- Solution space expanded more

Auction-based Scheduling Problem - (somewhat) Formally

Input: A graph-arena G and two non-conflicting objectives

Output: **Yes**, if we can **synthesise** two controllers and **schedule** them via **bidding** so that they fulfil their own objectives.

For a given set of assumptions about the other controller
(Some of the) Theorems (Avni, Mallik, and S.' 24):

Tradeoff between knowledge/assumption/flexibility vs solution

Strong Synthesis:

- No knowledge about objective, no assumption about behaviour, quite flexible if solution exists
- Restricted solution space

Assume-admissible Synthesis:

- Knowledge about objective, rational behavioural assumption, less flexible
- Solution space expanded

Assume-guarantee synthesis:

- Knowledge about objective, exact behavioural assumption, least flexible
- Solution space expanded more

Auction-based Scheduling Problem - (somewhat) Formally

Input: A graph-arena G and two non-conflicting objectives

Output: **Yes**, if we can **synthesise** two controllers and **schedule them via bidding** so that they fulfil their own objectives.

For a given set of assumptions about the other controller

(Some of the) Theorems (Avni, Mallik, and S.' 24):

- Strong Synthesis can be solved in $NP \cap coNP$, and in PTIME for binary graphs. Moreover, for SCC and Buchi objectives, strong synthesis is always possible.

Tradeoff between knowledge/assumption/flexibility vs solution

Strong Synthesis:

- No knowledge about objective, no assumption about behaviour, quite flexible if solution exists
- Restricted solution space

Assume-admissible Synthesis:

- Knowledge about objective, rational behavioural assumption, less flexible
- Solution space expanded

Assume-guarantee synthesis:

- Knowledge about objective, exact behavioural assumption, least flexible
- Solution space expanded more

Auction-based Scheduling Problem - (somewhat) Formally

Input: A graph-arena G and two non-conflicting objectives

Output: **Yes**, if we can **synthesise** two controllers and **schedule them via bidding** so that they fulfil their own objectives.

For a given set of assumptions about the other controller

(Some of the) Theorems (Avni, Mallik, and S.' 24):

- Strong Synthesis can be solved in $NP \cap coNP$, and in PTIME for binary graphs. Moreover, for SCC and Buchi objectives, strong synthesis is always possible.
- Strong-synthesised controller in redundant-vertex-removed graph (if exists) \Rightarrow Assume-admissible controller for original graph [Sound solution but not complete]

....

Tradeoff between knowledge/assumption/flexibility vs solution

Strong Synthesis:

- No knowledge about objective, no assumption about behaviour, quite flexible if solution exists
- Restricted solution space

Assume-admissible Synthesis:

- Knowledge about objective, rational behavioural assumption, less flexible
- Solution space expanded

Assume-guarantee synthesis:

- Knowledge about objective, exact behavioural assumption, least flexible
- Solution space expanded more

Auction-based Scheduling Problem - (somewhat) Formally

Input: A graph-arena G and two non-conflicting objectives
Output: **Yes**, if we can **synthesise** two controllers and **schedule** them via **bidding** so that they fulfil their own objectives.

For a given set of assumptions about the other controller

(Some of the) Theorems (Avni, Mallik, and S.' 24):

synthesis can be solved in $NP \cap coNP$, and in PTIME for binary
for SCC and Buchi objectives, strong synthesis is always possible.

redundant-vertex-removed graph (if exists) \Rightarrow graph [Sound solution but not complete]

Auction-Based Scheduling

Guy Avni¹, Kaushik Mallik², and Suman Sadhukhan¹

¹ University of Haifa, Haifa, Israel,
gavni@cs.haifa.ac.il,
ssadhukh@campus.haifa.ac.il
² Institute of Science and Technology Austria (ISTA), Klosterneuburg, Austria,
kaushik.mallik@ist.ac.at

Abstract. Sequential decision-making tasks often require satisfaction of multiple, partially-contradictory objectives. Existing approaches are monolithic, where a single policy fulfills all objectives. We present *auction-based scheduling*, a decentralized framework for multi-objective sequential decision making. Each objective is fulfilled using a separate and independent policy. Composition of policies is performed at runtime, where at each step, the policies simultaneously bid from pre-allocated budgets for the privilege of choosing the next action. The framework allows policies to be independently created, modified, and replaced. We study path-planning problems on finite graphs with two temporal objectives in a decentralized manner. We consider three different synthesis algorithms to synthesize policies together with synthesis problems, parameterized by the number of objectives. We show that synthesis is possible for which

assumption/flexibility vs solution

Assumable Synthesis:

- Knowledge about objective, exact behavioural assumption, less flexible
- Solution space expanded

Assume-guarantee synthesis:

- Knowledge about objective, exact behavioural assumption, least flexible
- Solution space expanded more

Take Away - Part II

Decentralised Synthesis Problem:

Given a game arena \mathcal{G} , two overlapping winning objectives, when can we synthesize two controllers and schedule them so that both the objectives are satisfied.

Take Away - Part II

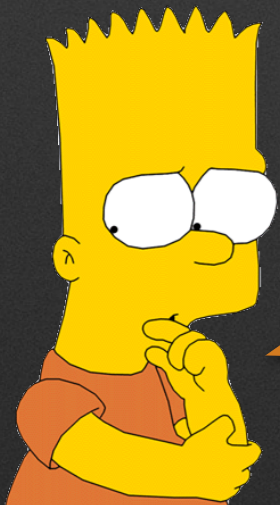
Decentralised Synthesis Problem:

Given a game arena \mathcal{G} , two overlapping winning objectives, when can we synthesize two controllers and schedule them so that both the objectives are satisfied.

- We propose a solution using bidding games
- We identify where some solution always exists, and analyse complexity for finding solutions for **qualitative objectives**
- We show knowledge/assumption/flexibility tradeoff with solution space

Future work:

- Quantitative objectives?
- Complete solutions for assume-admissibility, assume-guarantee?
 - Multi-player bidding?



Recap: Bidding Games on Graphs

In Theory

Studied Richman first-price discrete parity bidding games:

- Fixed-point algorithm gives nice structure to the threshold budgets, and optimal bids
- Showed membership in $NP \cap coNP$ by using that structure and algorithm for turn-based parity games

In Practice

Auction-Based Scheduling:

- Proposed a solution for decentralised synthesis problem using bidding for scheduling mechanism
- Studied where such solution always exists (graph arena, objectives), where it gives sound-but-incomplete solution, and complexity results
- Tradeoff between solution space and behavioural solution

Recap: Bidding Games on Graphs

In Theory

Studied Richman first-price discrete parity bidding games:

- Fixed-point algorithm gives nice structure to the threshold budgets, and optimal bids
- Showed membership in $NP \cap coNP$ by using that structure and algorithm for turn-based parity games

In Practice

Auction-Based Scheduling:

- Proposed a solution for decentralised synthesis problem using bidding for scheduling mechanism
- Studied where such solution always exists (graph arena, objectives), where it gives sound-but-incomplete solution, and complexity results
- Tradeoff between solution space and behavioural solution

Thanks!

