CS 295A/395D: Artificial Intelligence

Elementary Game Theory

Prof. Emma Tosch

30 March 2022



The University of Vermont

Agenda

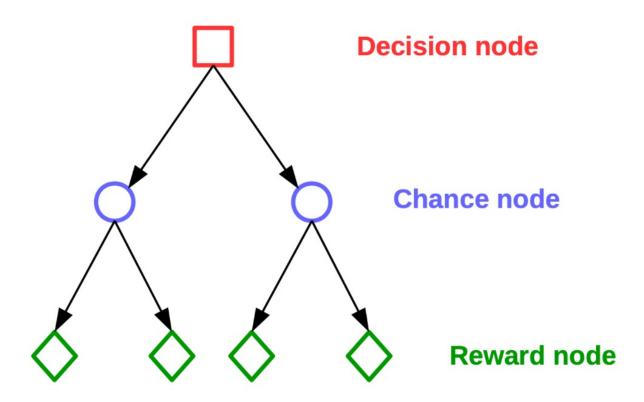
Review decision theory

Elementary game theory

- Optimum vs. optimal solutions
- Strategies
- Vocabulary

Logistics

- BB theory assignment out today
- Exam through game theory
 - Temporal reasoning pushed to next unit
 - Exam next Friday (April 8)
- Next unit: temporal reasoning and program synthesis
 - Removed machine learning



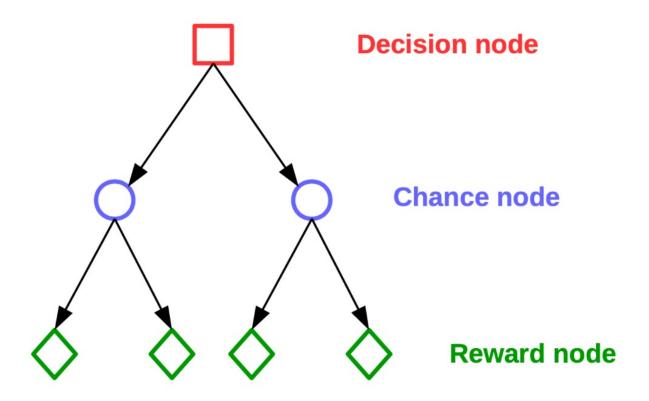
Note: "decision tree" also refers to a classification algorithm in machine learning and is completely different from the type of decision tree we will talk about here.

Recap: Decision Theory

We can express taking actions in a world with uncertainty via decision trees

Decisions trees are temporally-ordered nodes where each level corresponds to alternating:

- **Decision nodes –** state of the system; outgoing edges represent different actions
- Chance nodes probability distributions over outcomes; outgoing edges represent reachable states with some probability
- Reward nodes utility obtained from following the path



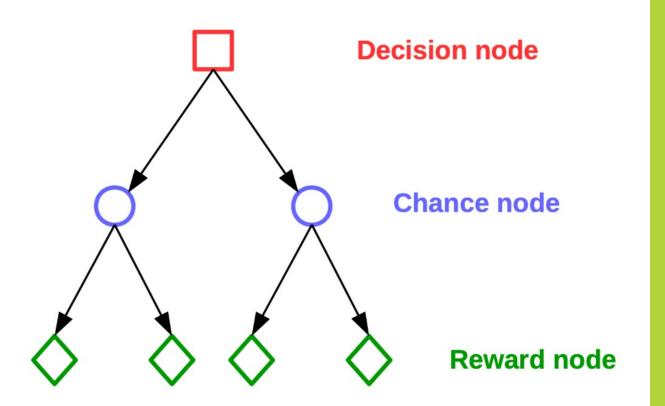
Note: "decision tree" also refers to a classification algorithm in machine learning and is completely different from the type of decision tree we will talk about here.

Recap: Maximize expected utility

$$EU[a \mid e_1, e_2, \dots] = \sum_{s'} P(S_{t+1} = s' \mid a, e_1, e_2, \dots) U(s')$$

Best action is the action a that maximizes $EU[a \mid e_1, e_2, ...]$

Sum of the utility of actions taken.



Note: "decision tree" also refers to a classification algorithm in machine learning and is completely different from the type of decision tree we will talk about here.

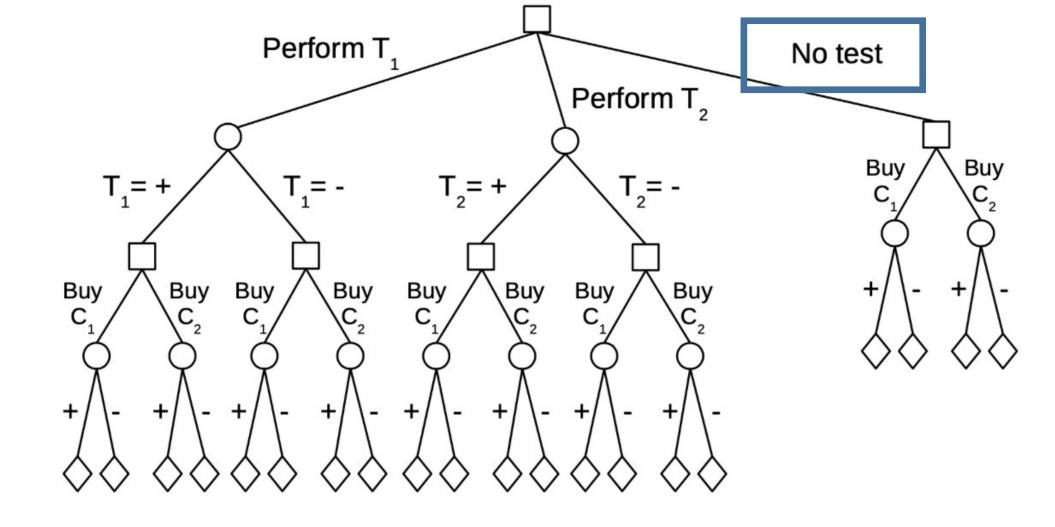
Recap: Comparing actions

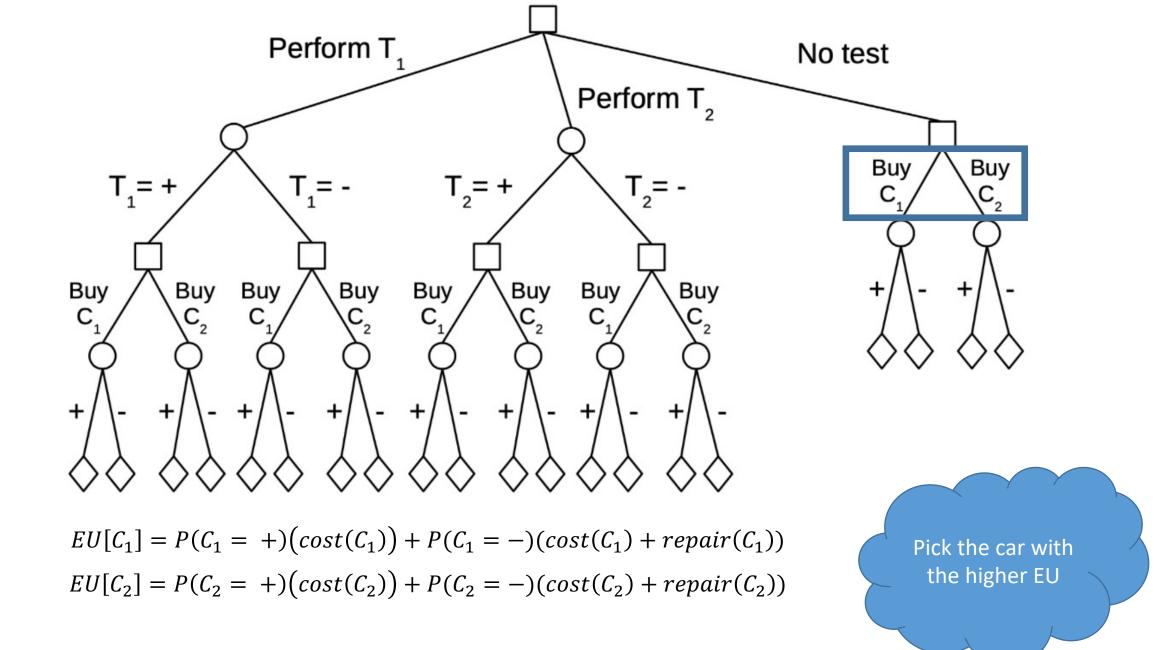
$$EU[a \mid e_1, e_2, \dots] = \sum_{s'} P(S_{t+1} = s' \mid a, e_1, e_2, \dots) U(s')$$

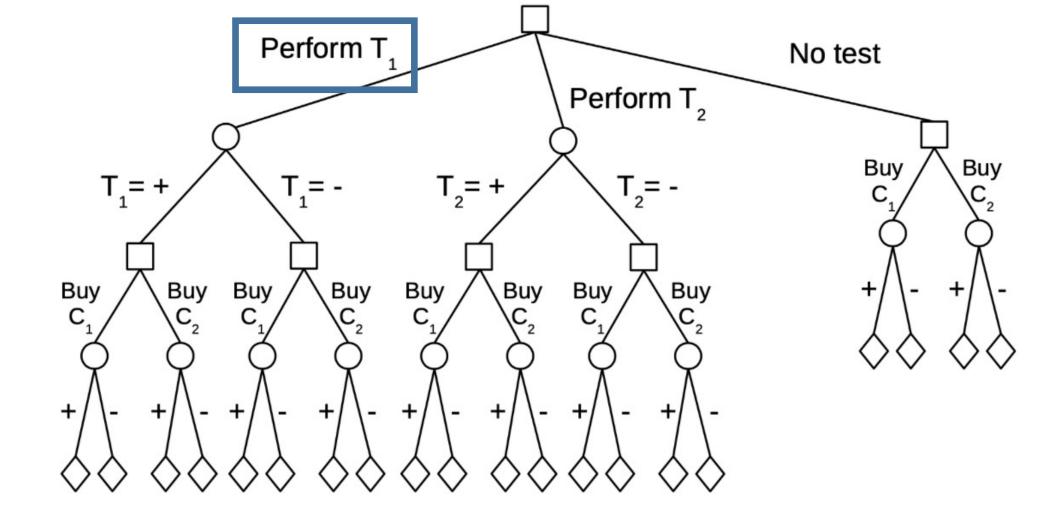
Probability mass function – over all sources of uncertainty associated with this action.

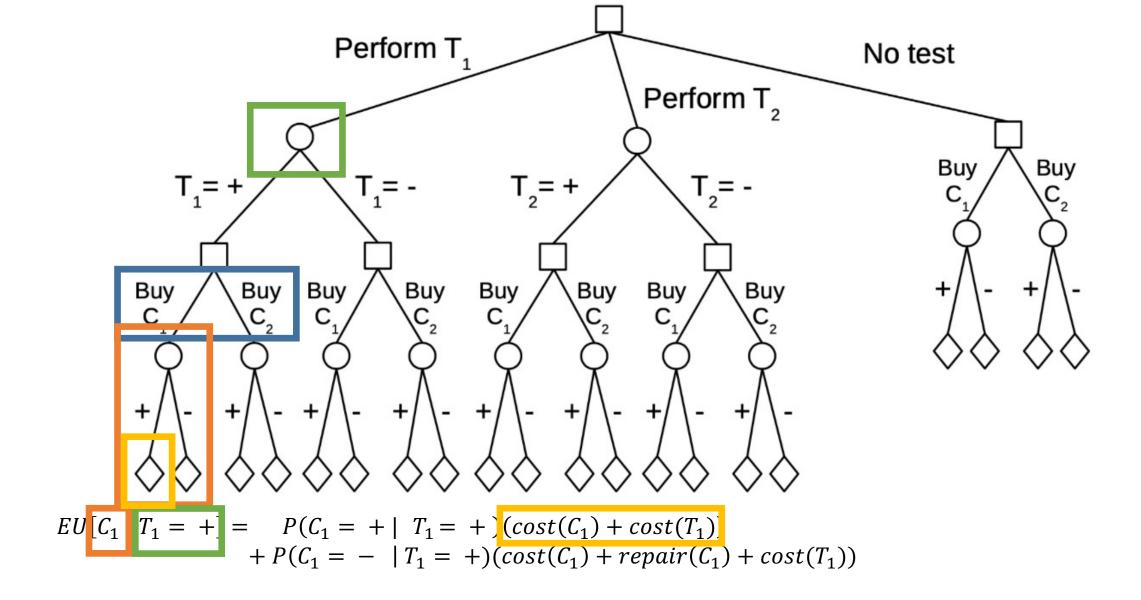
Utility function

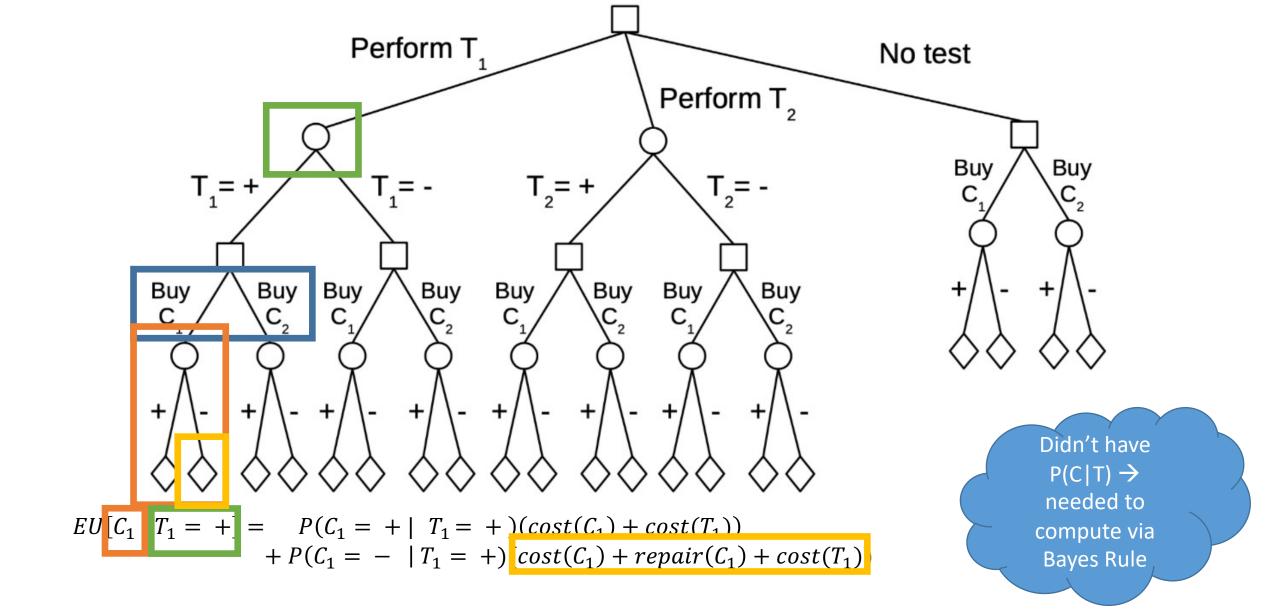
- Basic actions: reward
- Actions with subsequent actions with uncertain outcomes: EU of those actions

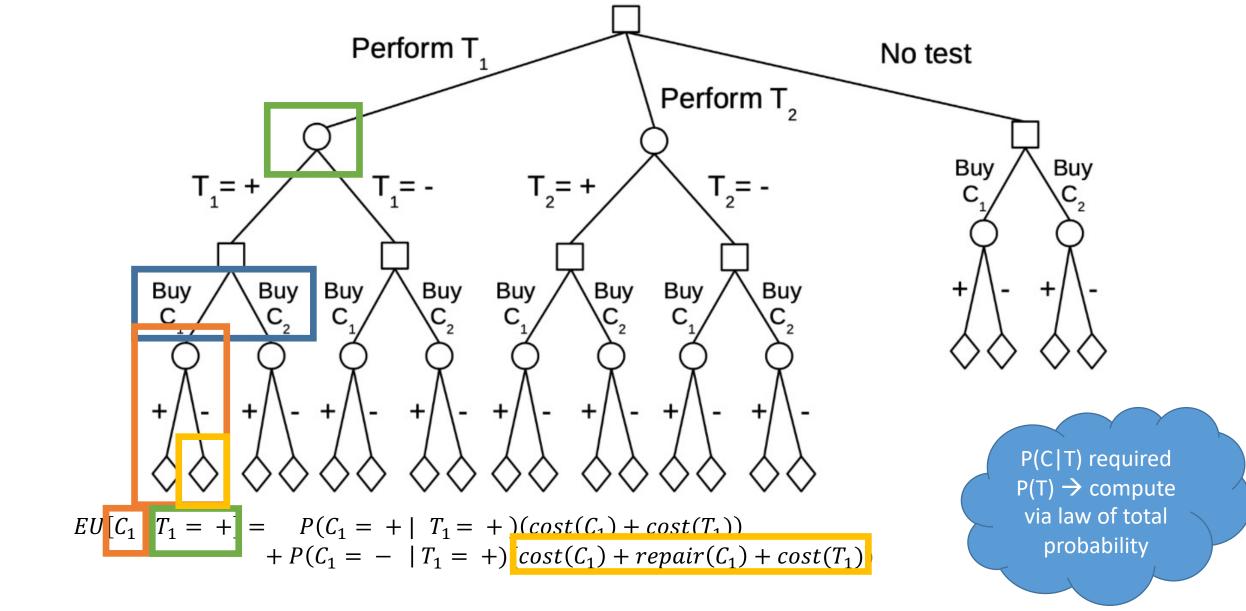


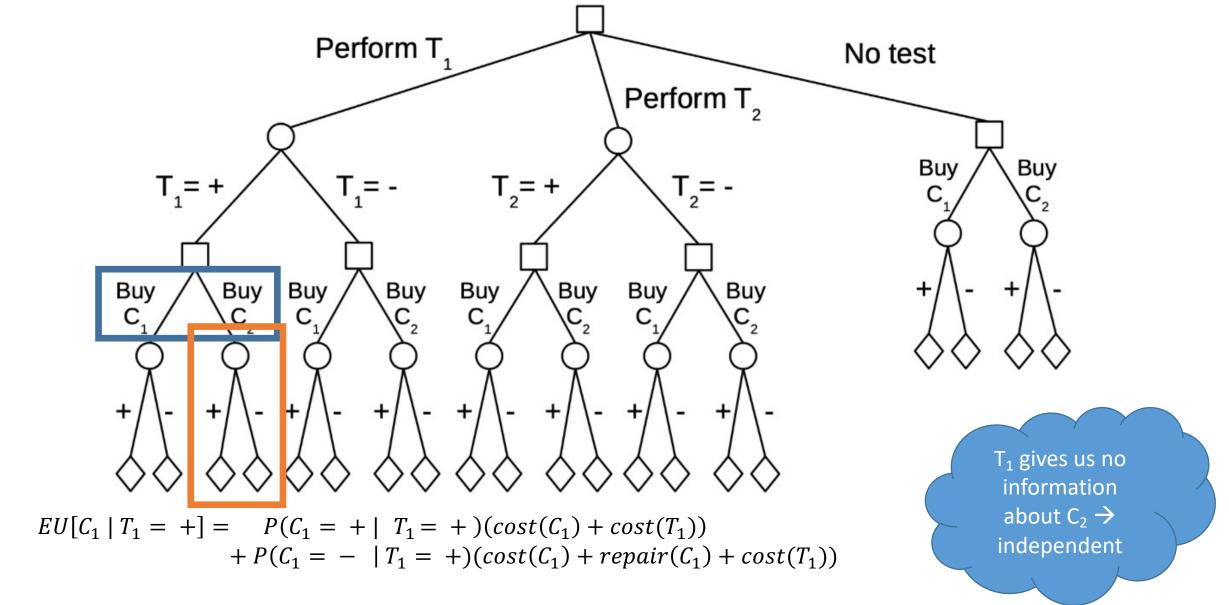




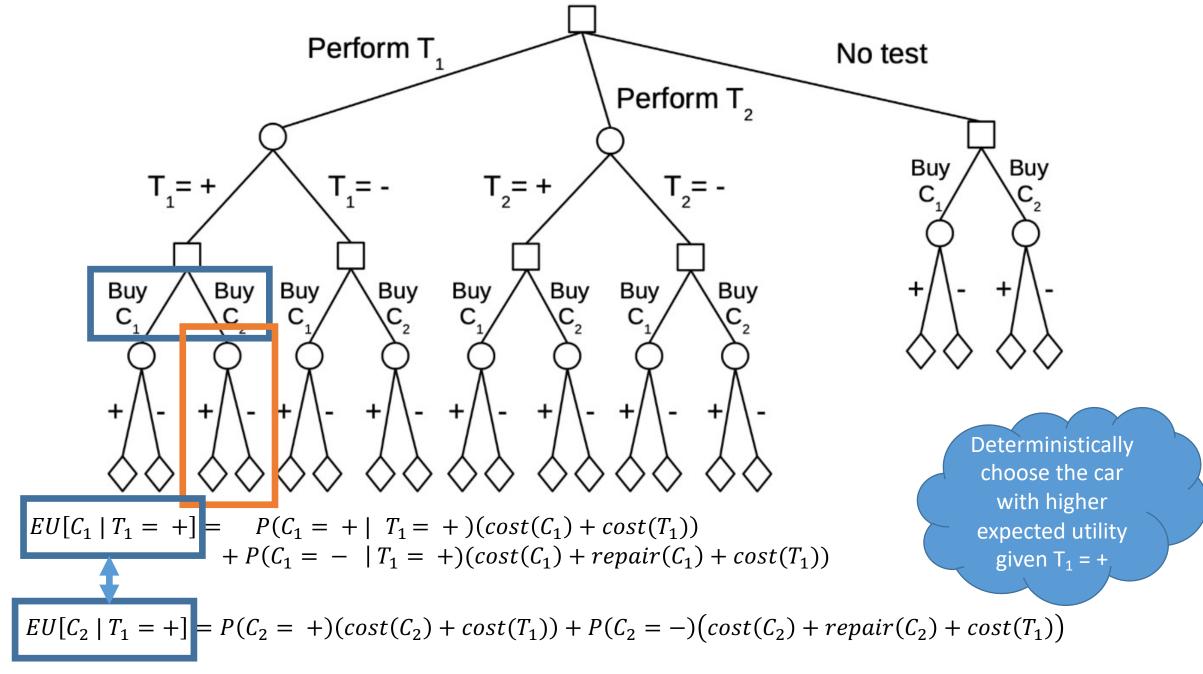




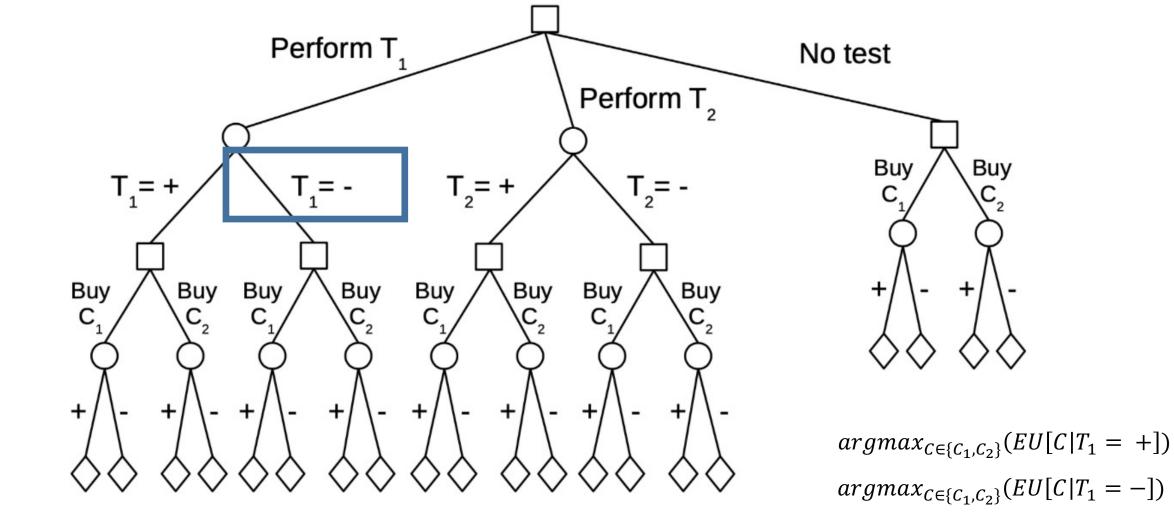


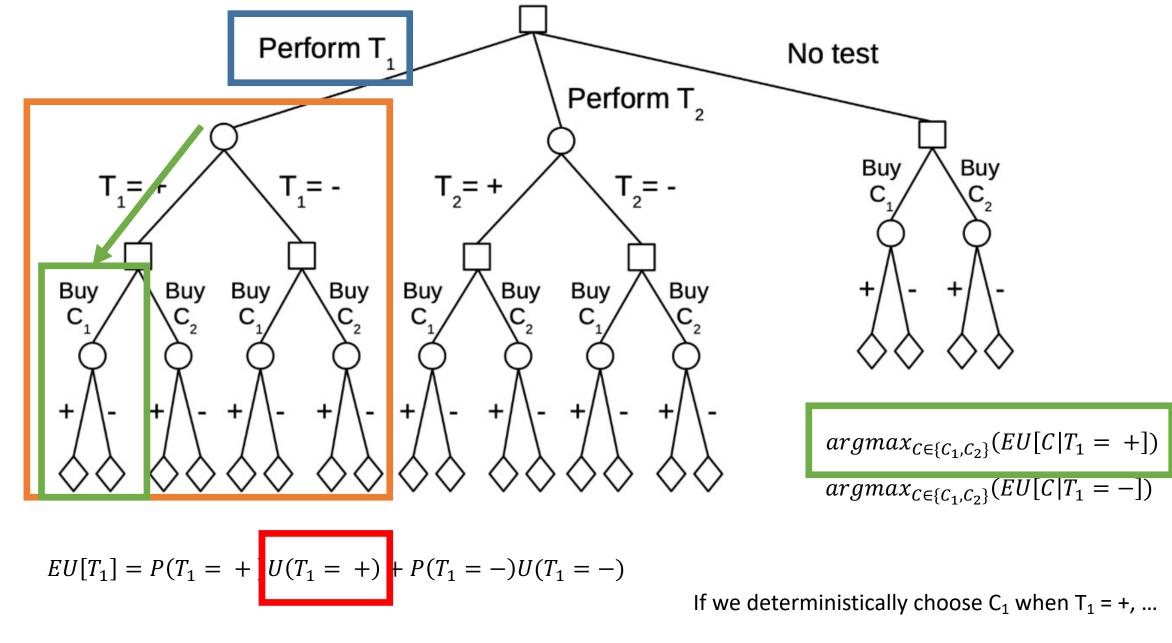


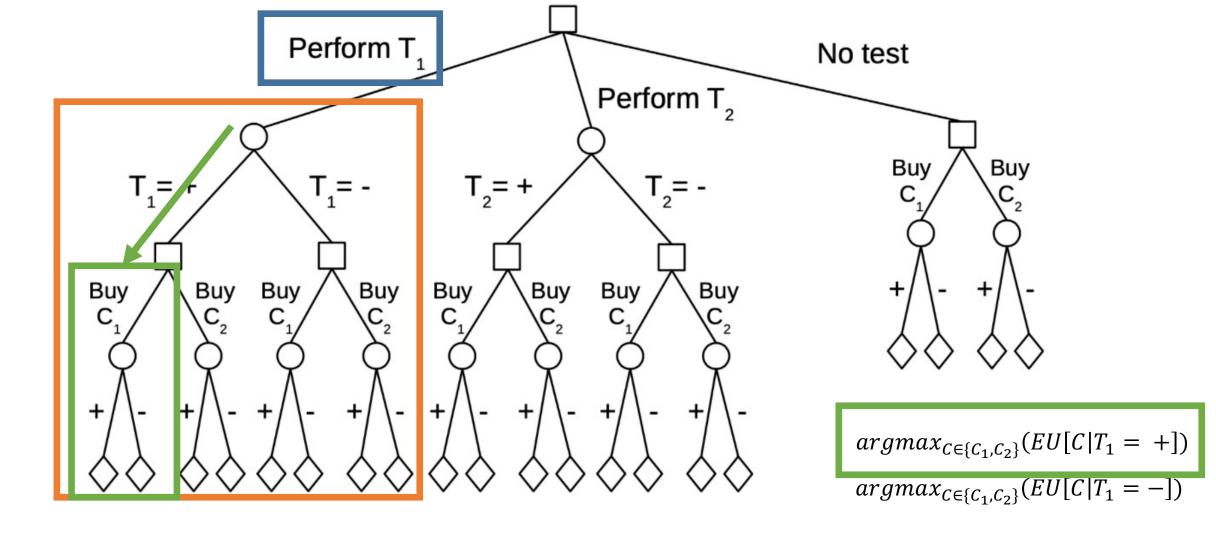
 $EU[C_2 \mid T_1 = +]$



 $argmax_{C \in \{C_1, C_2\}}(EU[C|T_1 = +])$

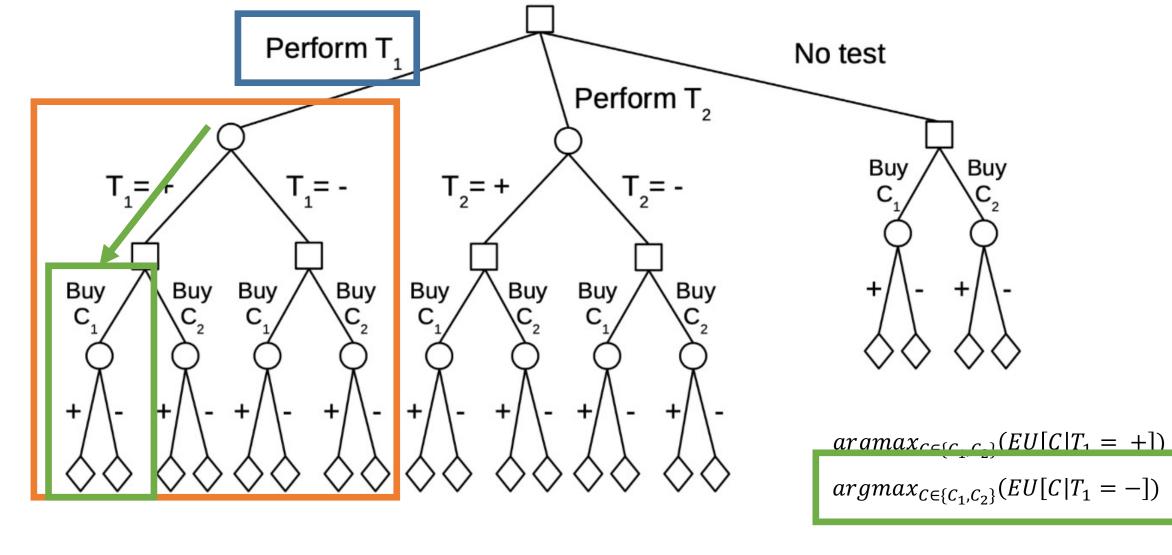






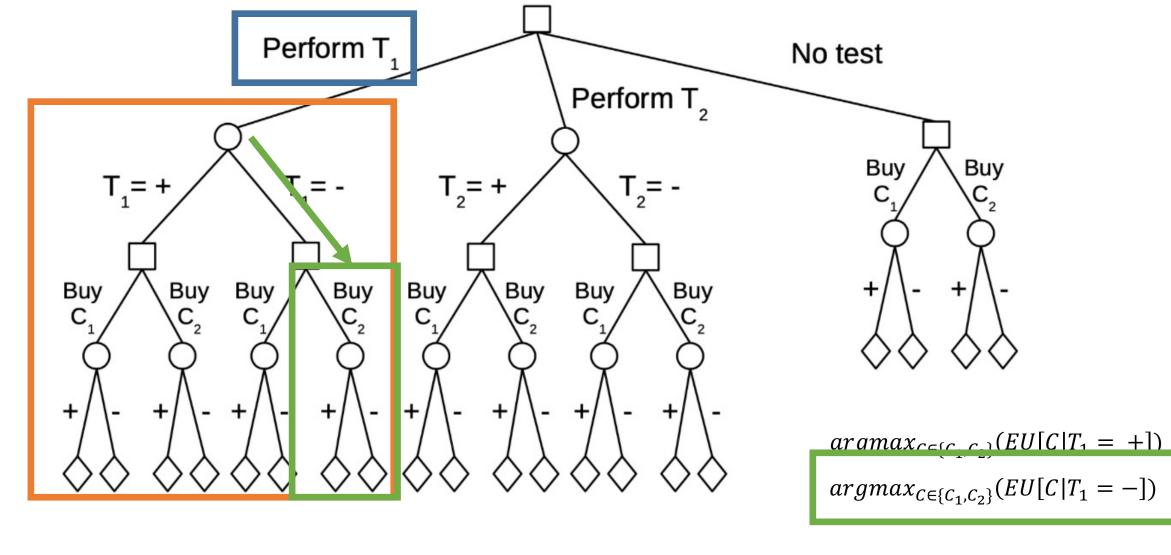
$$EU[T_1] = P(T_1 = +)EU(C_1|T_1 = +) + P(T_1 = -)U(T_1 = -)$$

If we deterministically choose C_1 when $T_1 = +, ...$



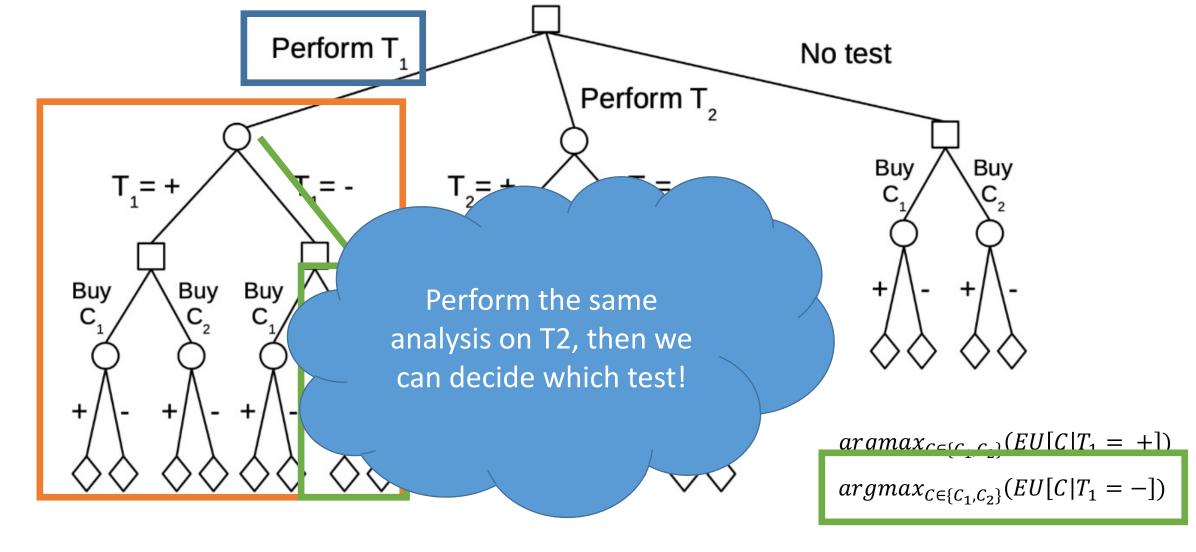
$$EU[T_1] = P(T_1 = +)EU(C_1|T_1 = +) + P(T_1 = -)U(T_1 = -)$$

If we deterministically choose C_2 when $T_1 = -, ...$



$$EU[T_1] = P(T_1 = +)EU(C_1|T_1 = +) + P(T_1 = -)U(T_1 = -)$$

If we deterministically choose C_2 when $T_1 = -, ...$



 $EU[T_1] = P(T_1 = +)EU(C_1|T_1 = +) + P(T_1 = -)EU(C_2|T_1 = -)$

If we deterministically choose C_2 when $T_1 = -, ...$

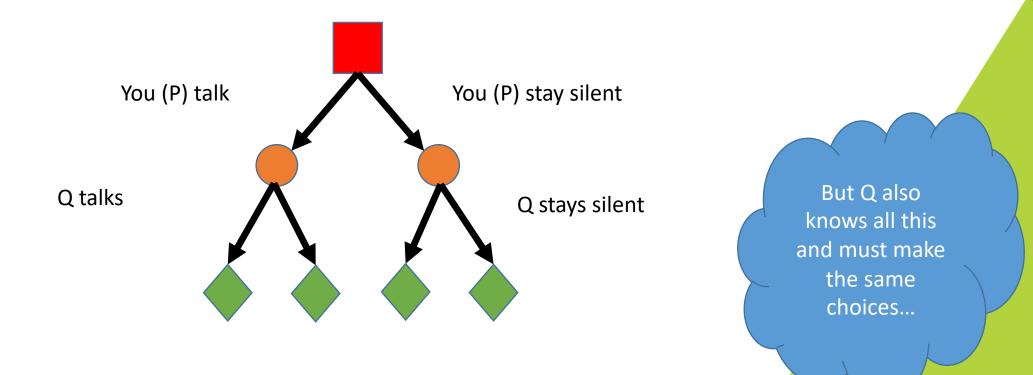
When uncertainty comes from another agent's actions

Car example: taking an action in one branch closes off possibilities in another

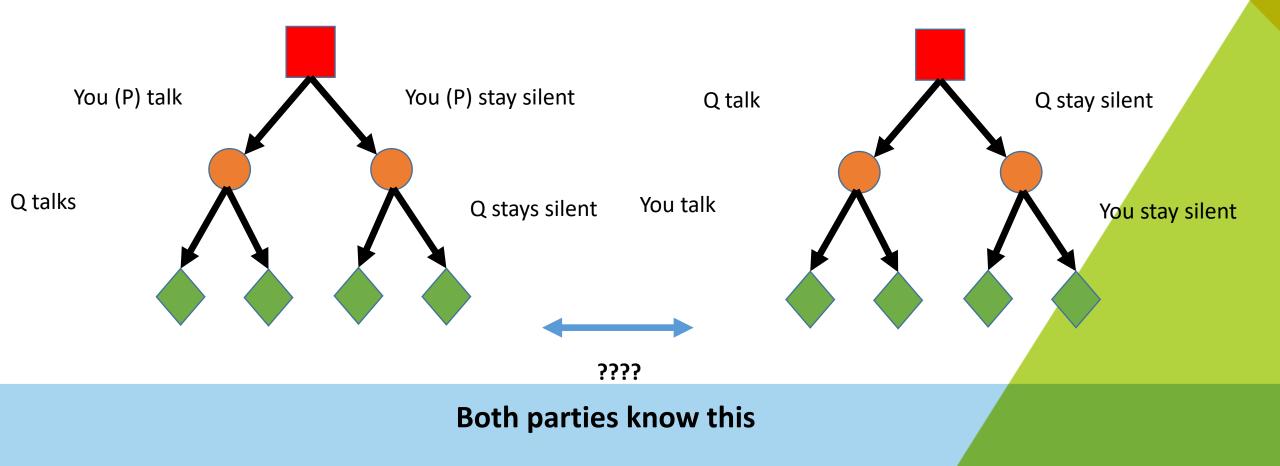
- Randomness comes from
 - Epistemic uncertainty about effects of past actions (e.g., accuracy of test results)
 - Epistemic uncertainty about future state (e.g., quality of car)

Consider the case when randomness comes from another agent's actions...

You (agent P) and an accomplice (agent Q) have been arrested for a crime...



You (agent P) and an accomplice (agent Q) have been arrested for a crime...

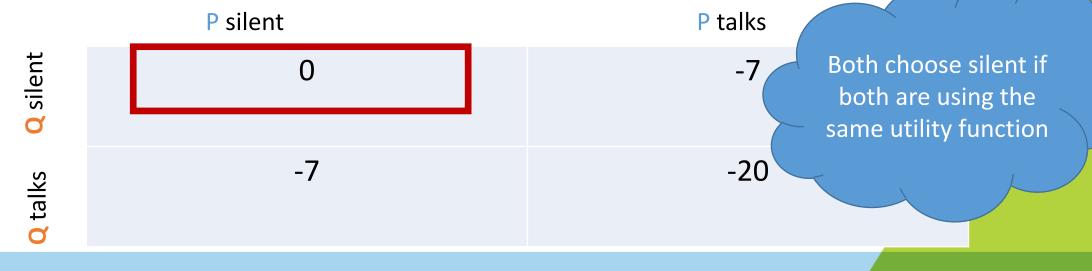


P and Q have been arrested for a crime and separated for in the choice of whether or not to confess and each action is as You don't know how your accomplice will act. What do you do? Utility function: Collective cost?

	P silent	P talks
<mark>Q</mark> silent	(<mark>0, 0</mark>)	(-2, -5)
<mark>Q</mark> talks	(-5, -2)	(-10, -10)

Both parties know this matrix

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Both parties know this matrix

P silent

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P talks



P silent

(0, 0)

(-5, -2)

You and an accomplice have been arrested for a crime and interrogation. You have the choice of whether or not to confe associated with a cost. You don't know how your accomplice will do?

Utility function: Individual Cost?

P talks

(-2, -5)

(-10, -10)

100

Weak case

2 silent

Q talks

Example: Prisoner's Dilemma You and an accomplice have been arrested for a crime and interrogation. You have the choice of whether or not to confe

P silent

associated with a cost. You don't know how your accomplice will

Utility function: Individual cost?

P talks

 0
 -2

 otals
 -5
 -10

 Both parties know this matrix
 -2

Weak case

qos

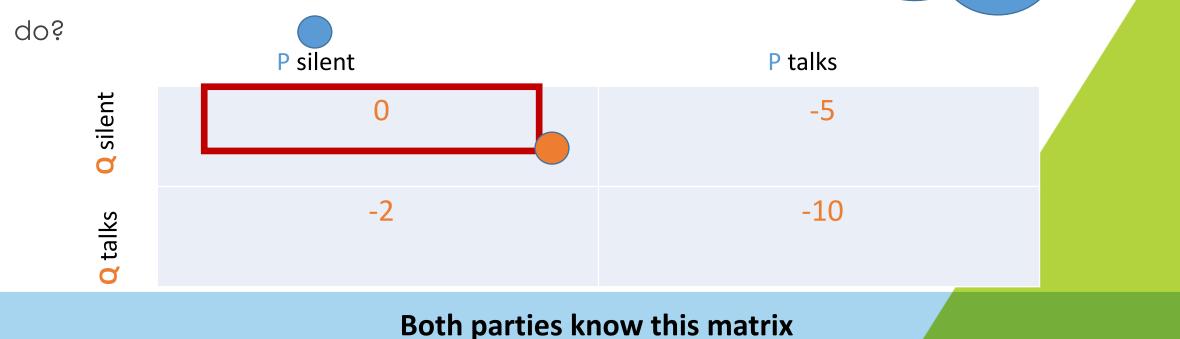
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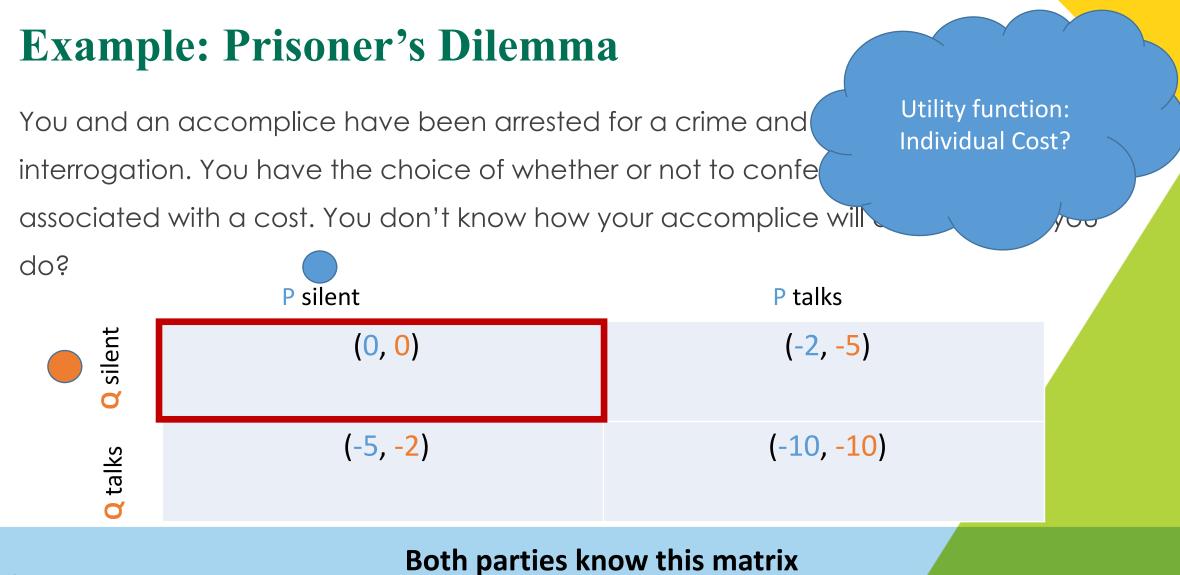
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Utility function: Individual cost?

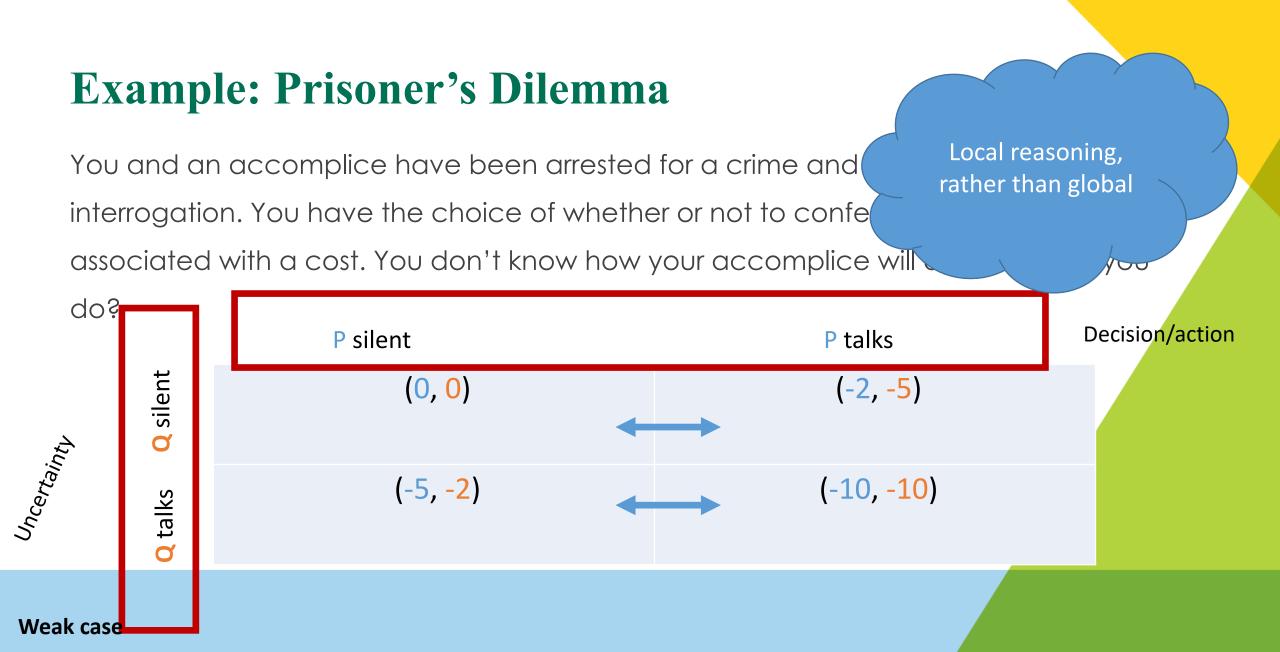
100

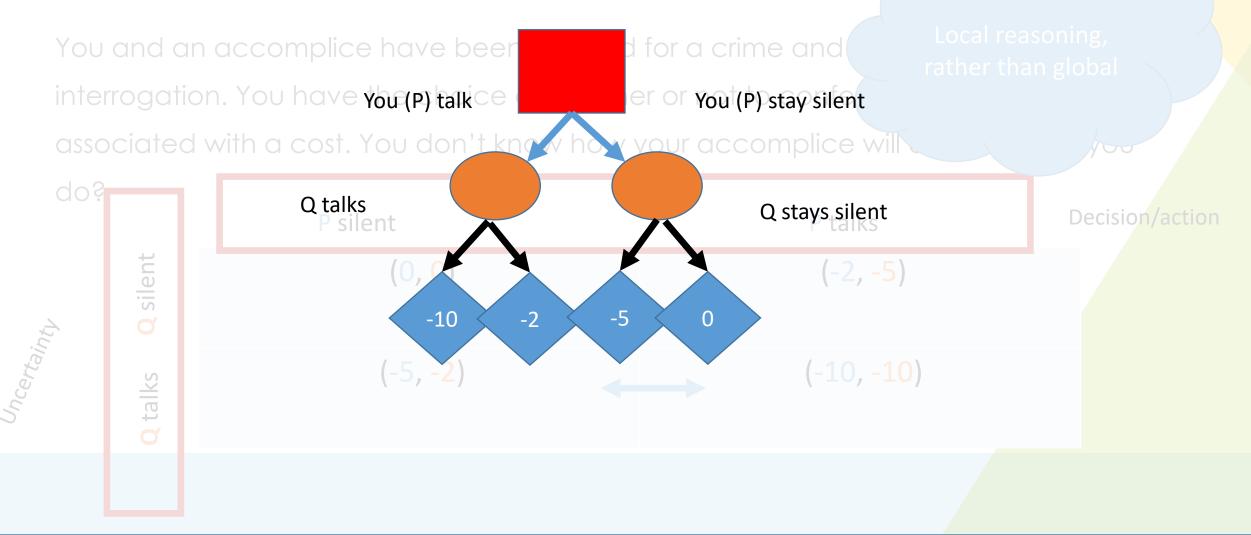


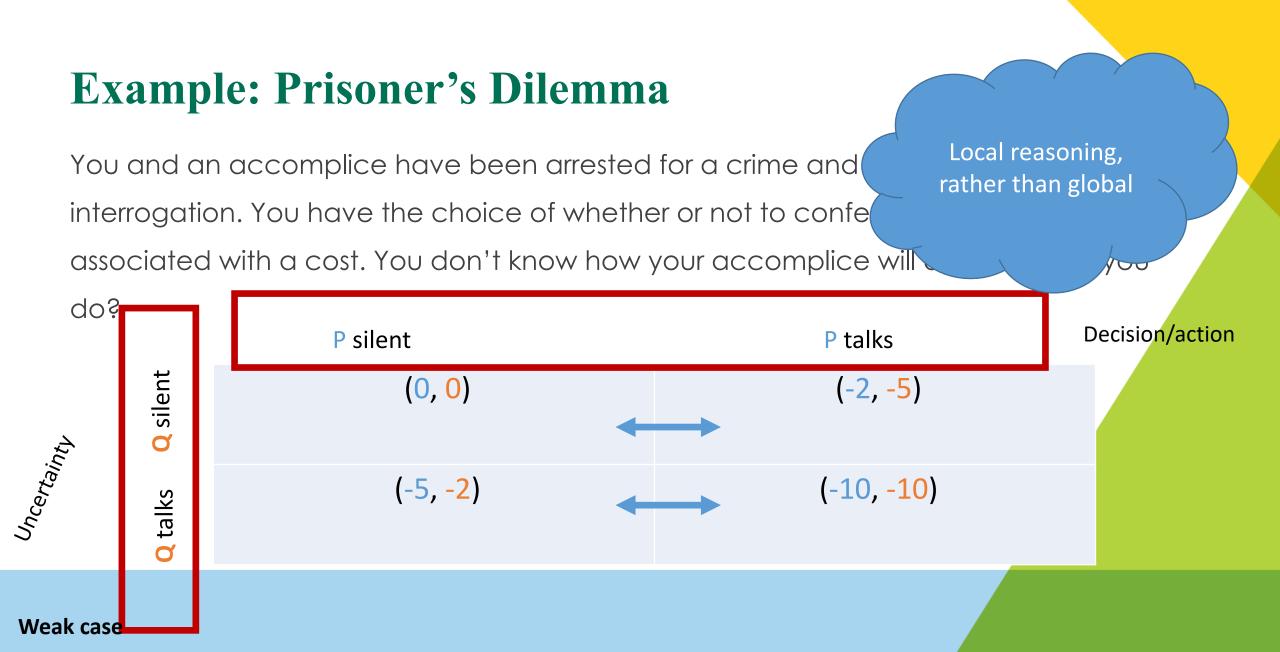
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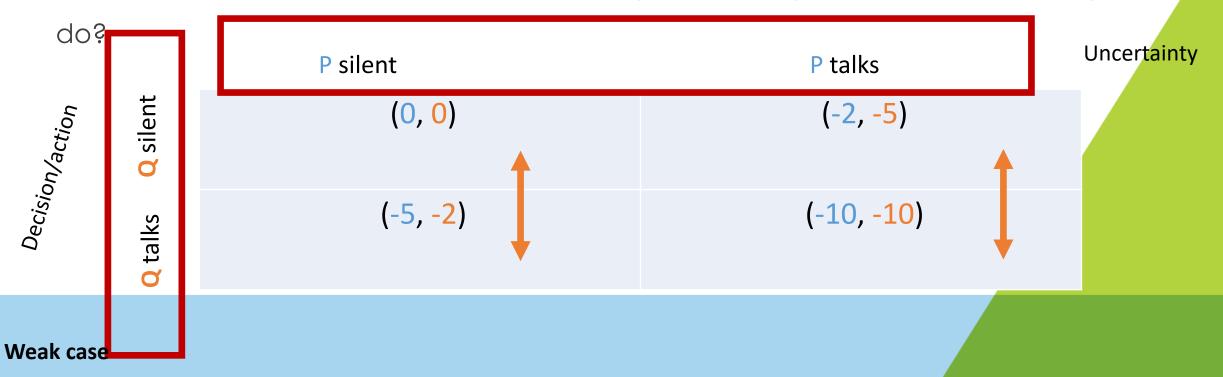
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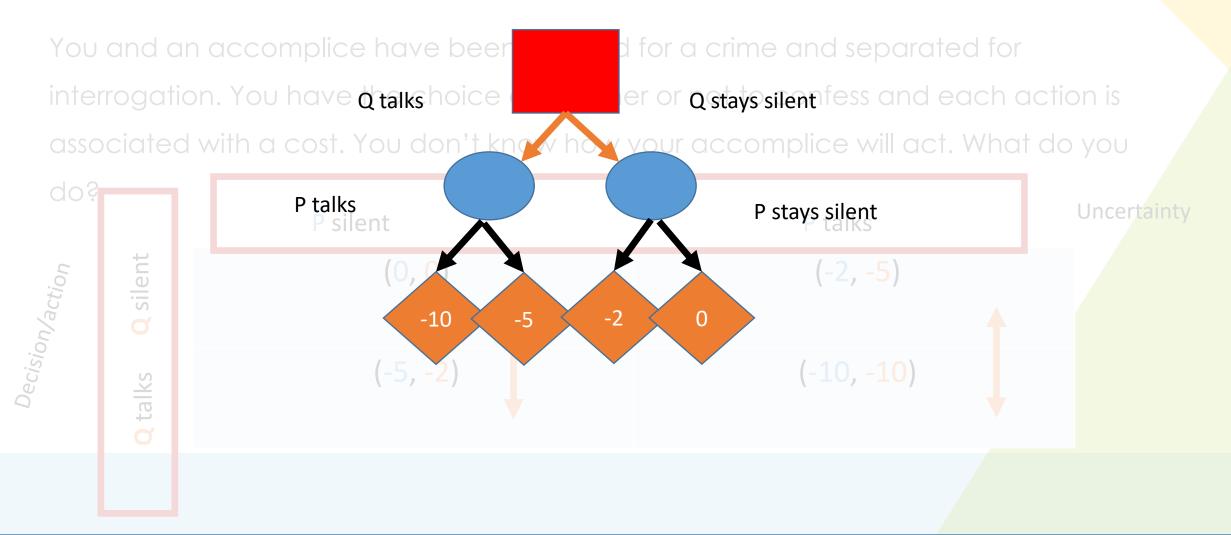




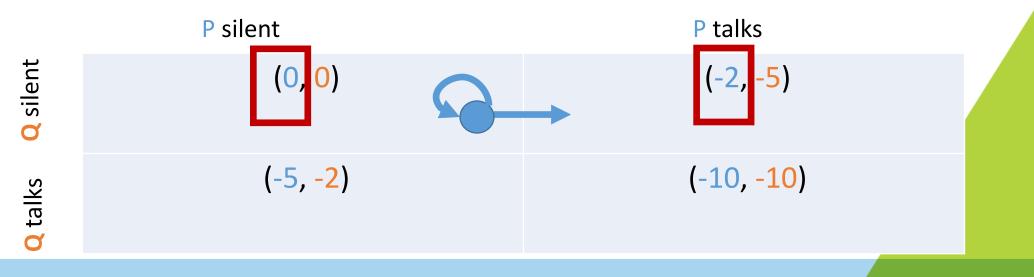


You and an accomplice have been arrested for a crime and separated for interrogation. You have the choice of whether or not to confess and each action is associated with a cost. You don't know how your accomplice will act. What do you

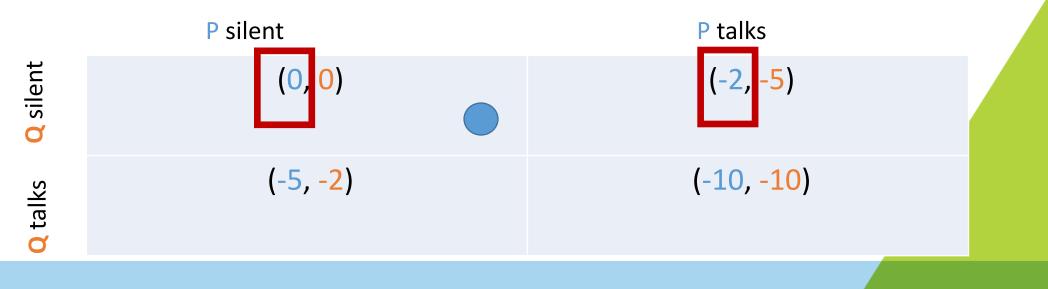




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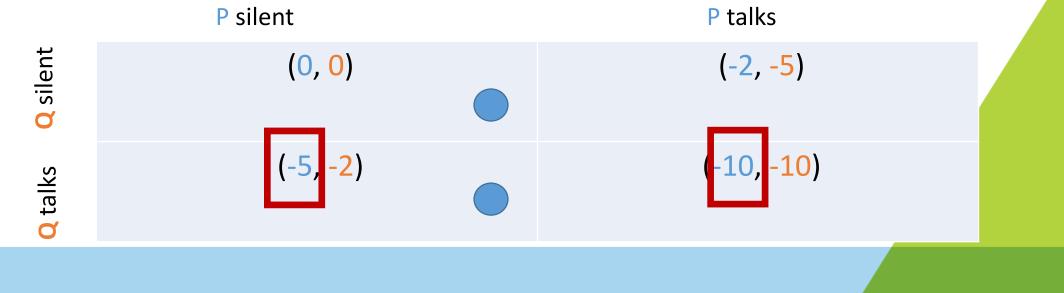
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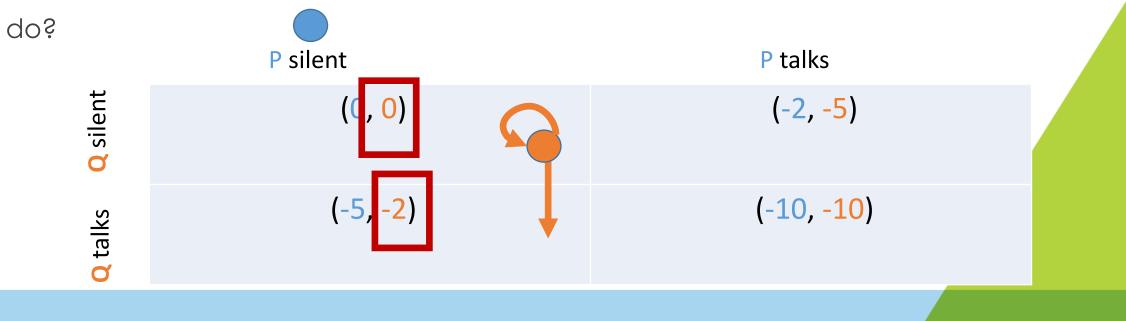
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P silent P talks (0, 0) (-2, -5) (-5, -2) (-5, -2) (-10, -10)

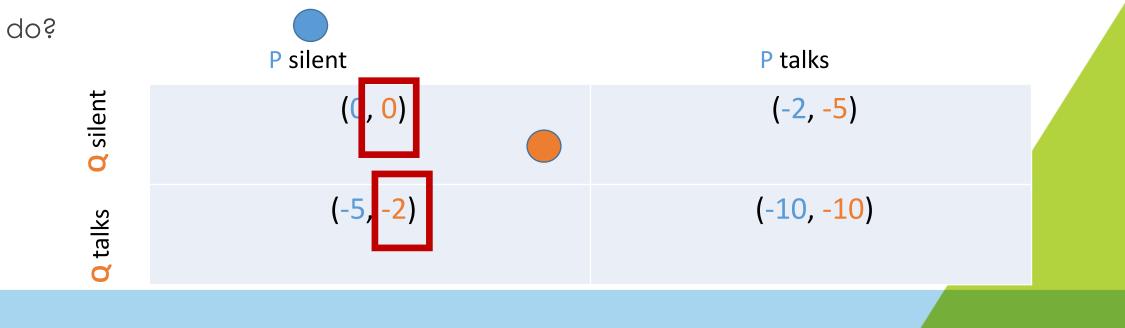
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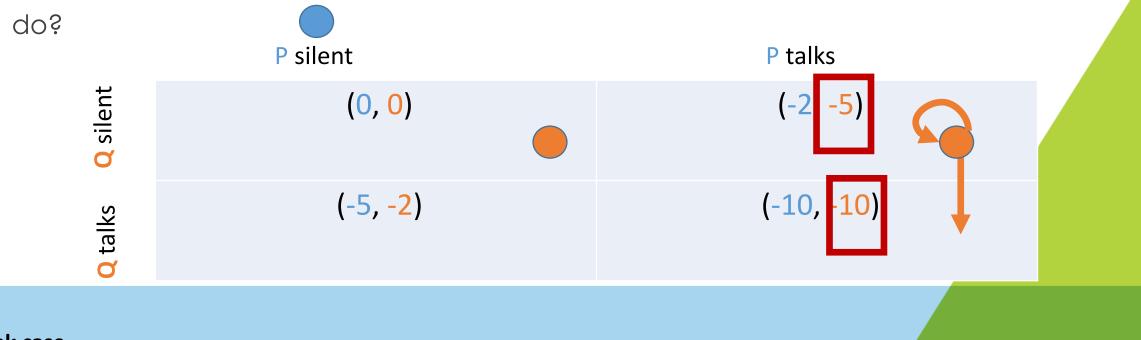
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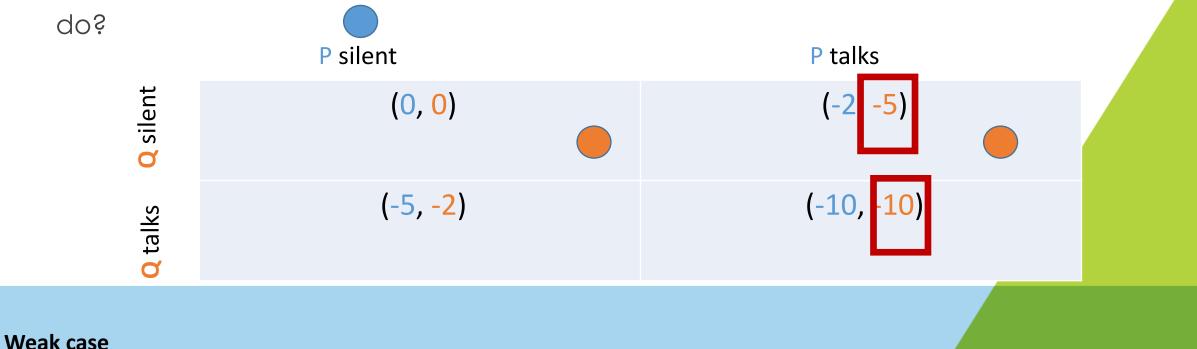
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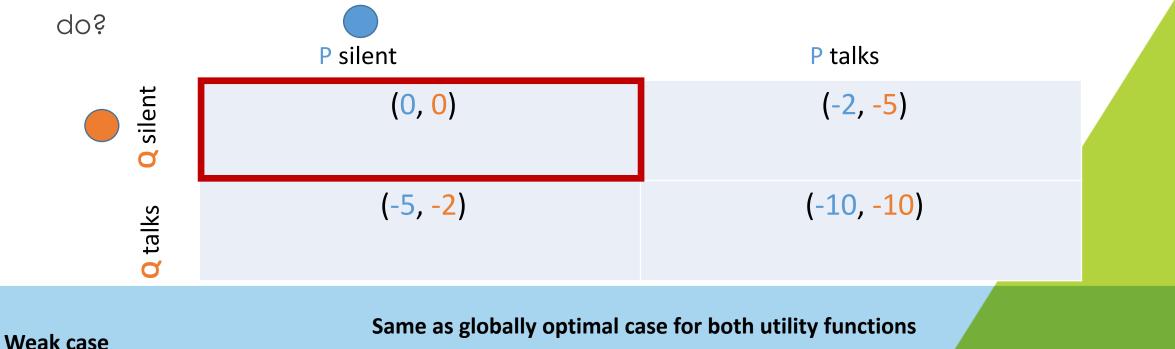
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different payoff You and an accomplice have been arrested for a crime and se interrogation. You have the choice of whether or not to confess associated with a cost. You don't know how your accomplice will a qos

P silent P talks **2** silent (0, -15) (-2, -2) (-15, 0)(-10, -10)**Q** talks

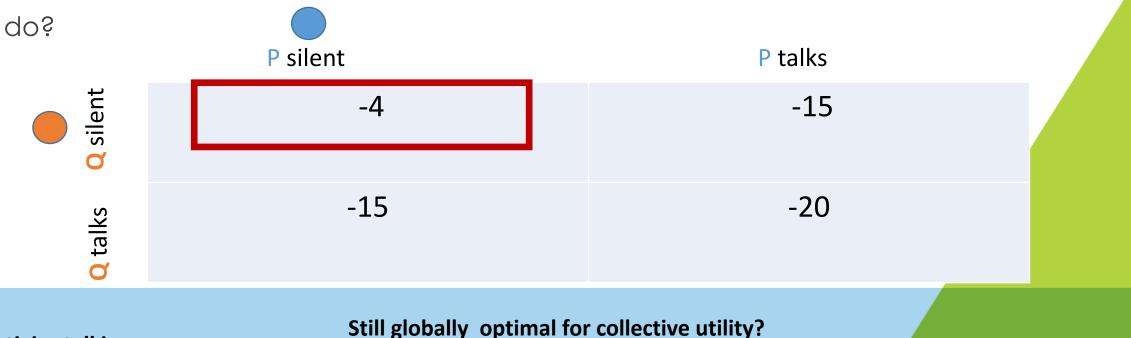
Consider a

matrix

VOU

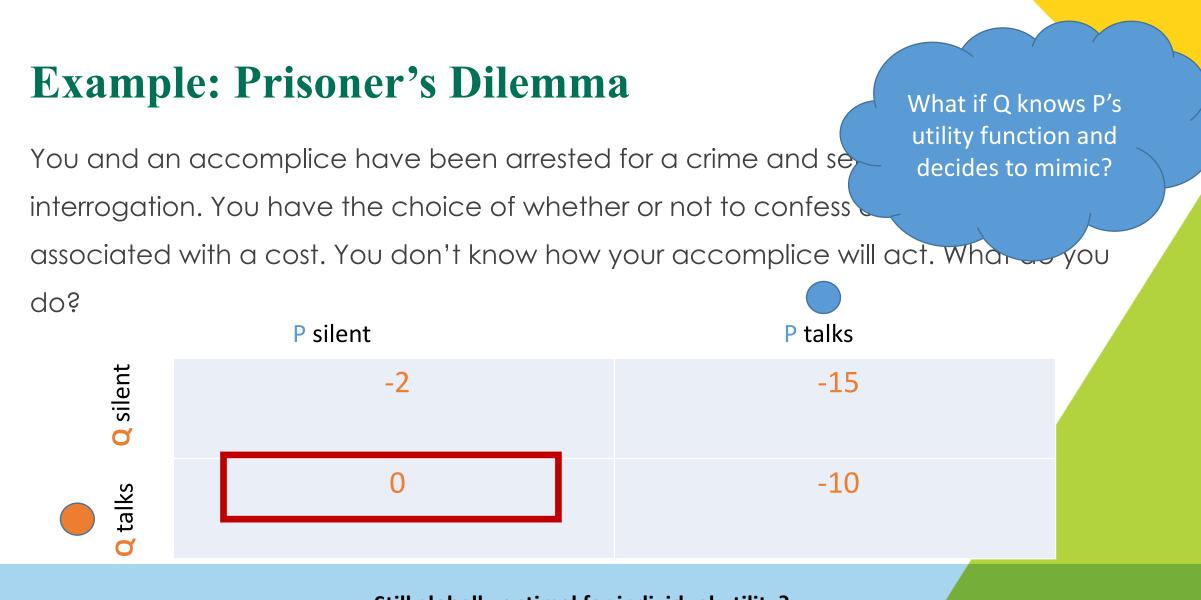
Still globally optimal for collective utility?

You and an accomplice have been arrested for a crime and separated for interrogation. You have the choice of whether or not to confess and each action is associated with a cost. You don't know how your accomplice will act. What do you



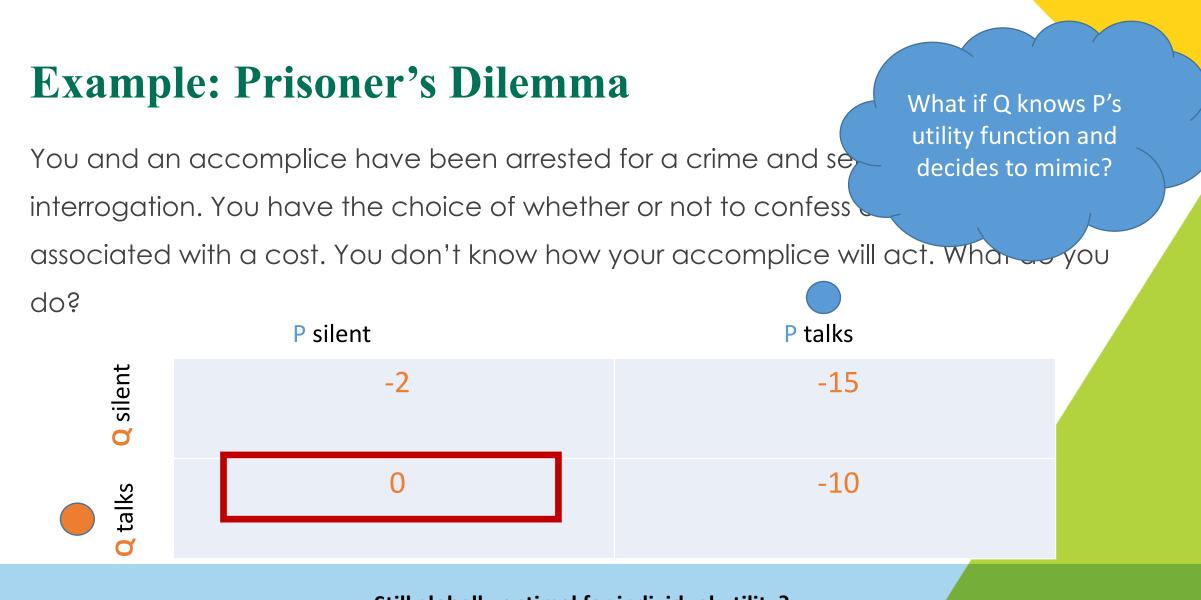
Example: Prisoner's Dilemma Assume Q uses collective utility, You and an accomplice have been arrested for a crime and se but P uses individual utility... interrogation. You have the choice of whether or not to confess associated with a cost. You don't know how your accomplice will a VOU qos P silent P talks silent -2 -15 -10 **Q** talks

Still globally optimal for individual utility for P?



Incentivize talking

Still globally optimal for individual utility?



Incentivize talking

Still globally optimal for individual utility?

You and an accomplice have been arrested for a crime and separated for interrogation. You have the choice of whether or not to confess and each action is associated with a cost. You don't know how your accomplice will act. What do you do? P silent P talks

 Image: Silent of Silentof Silent of Silent of Silent of Silent of Silent of Silent of Sil

P silent

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P talks

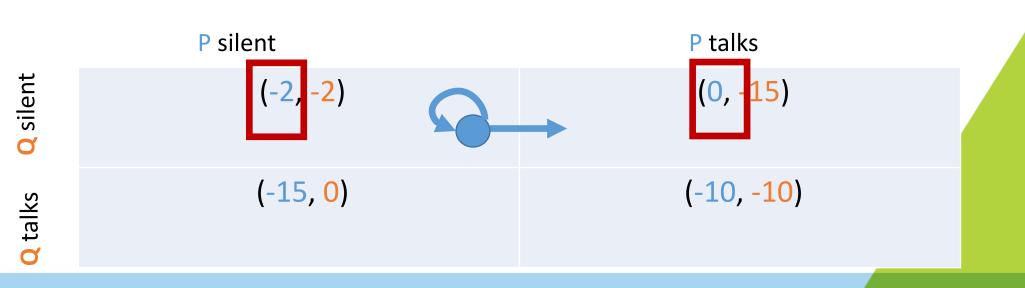
-4 -15 -20

Worst possible global outcome!

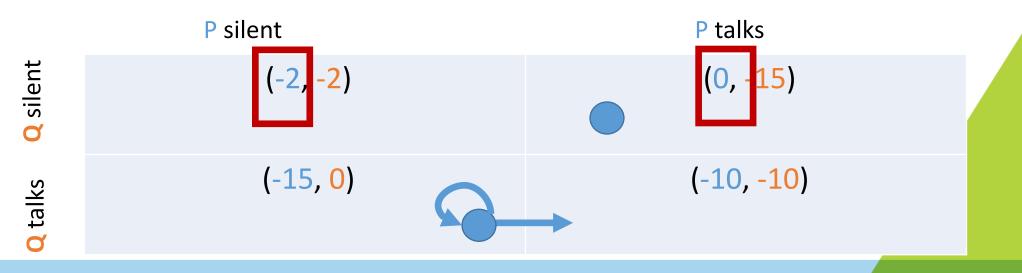
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Local reasoning, rather than global

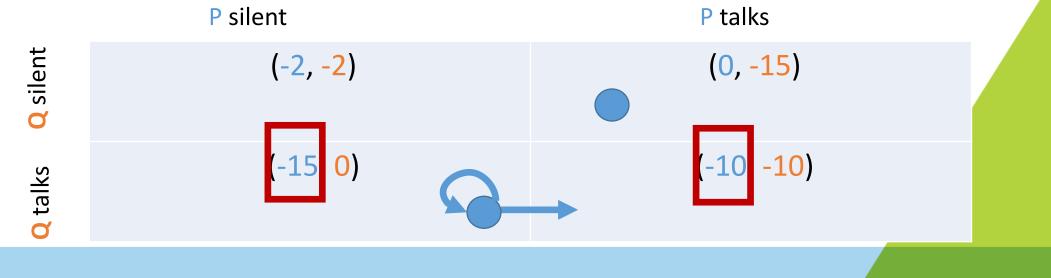
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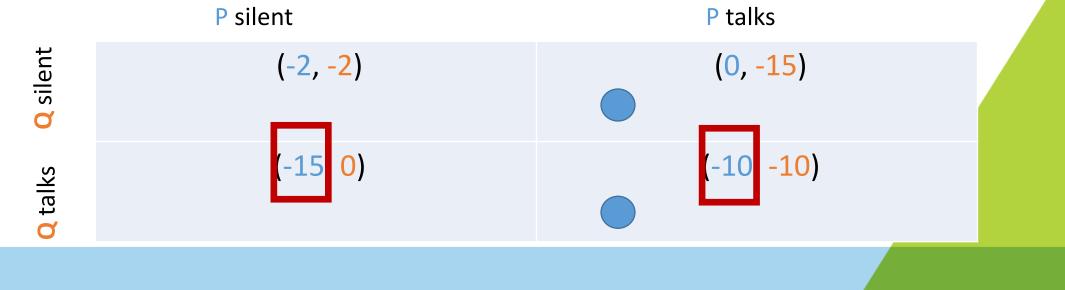
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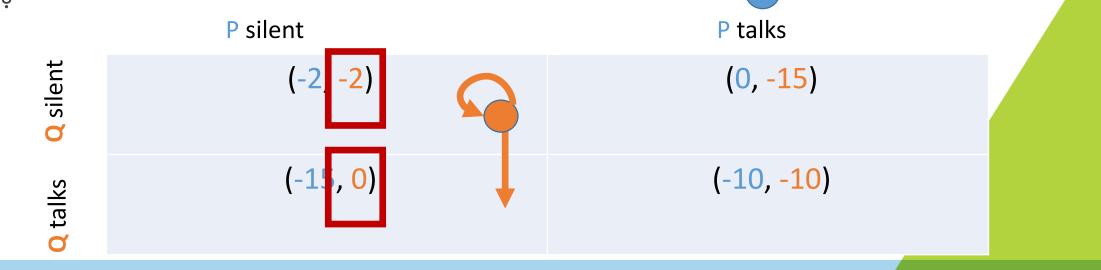
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 P silent
 P talks

 (-2, -2) (0, -15)

 (-1, 0) (-10, -10)

You and an accomplice have been arrested for a crime and separated for interrogation. You have the choice of whether or not to confess and each action is associated with a cost. You don't know how your accomplice will act. What do you do?

P silent (-2, -2) (0, 15) (0, 15) (-10, -10

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(0,

(-10)

Incentivize talking

Q silent

talks

You and an accomplice have been arrested for a crime and separated for interrogation. You have the choice of whether or not to confess and each action is associated with a cost. You don't know how your accomplice will act. What do you do? P silent P talks $\frac{t}{100}$ (0, -15)

 tion
 (-2, -2)
 (0, -15)

 sign
 (-15, 0)
 (-10, -10)

 Incentivize talking
 Same result!

Choose between 1 and 2 fingers. P wins if sum is even. Q wins if sum is odd. Loser pays the winner.

\leftarrow	P plays 1	P plays 2	
<mark>Q</mark> plays	(+2, -2)	(-3, +3)	
🔾 plays 2	(-3, +3)	(+4, -4)	

Choose between 1 and 2 fingers. P wins if sum is even. Q wins if sum is odd. Loser pays the winner.

\leftarrow	P plays 1	P plays 2	
<mark>Q</mark> plays	0	0	
<mark>Q</mark> plays 2	0	0	

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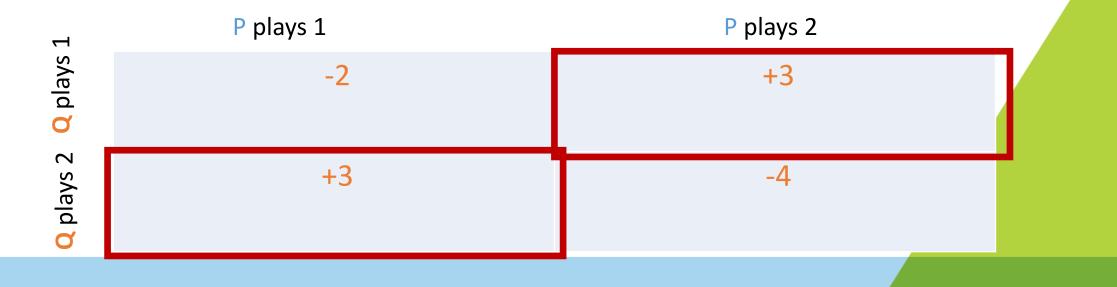
 P plays 1
 P plays 2

 +2
 -3

 -3
 +4

Zero-sum

Choose between 1 and 2 fingers. P wins if sum is even. Q wins if sum is odd. Loser pays the winner.



Zero-sum



Zero-sum

You and an accomplice have been arrested for a crime and separated for interrogation. You have the choice of whether or not to confess and each action is associated with a cost. You don't know how your accomplice will act. What do you do?

	P silent	P talks	
<mark>Q</mark> silent	(-4, -4)	(<mark>0, -6</mark>)	
Q talks	(-5, -2)	(-10, -10)	

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P silent P talks

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<mark>Q</mark> silent	(-4, -4)	(0, - <mark>6</mark>)	
<mark>Q</mark> talks	(-5, -2)	(-10, -10)	

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-4 -6

(-5, -2)

You and an accomplice have been arrested for a crime and separated for interrogation. You have the choice of whether or not to confess and each action is associated with a cost. You don't know how your accomplice will act. What do you do? P silent P silent P talks (-4, -4)(0, -6)

(-10, -10)

No free ride for Q

talks

You and an accomplice have been arrested for a crime and separated for interrogation. You have the choice of whether or not to confess and each action is associated with a cost. You don't know how your accomplice will act. What do you do?

	P silent	P talks	
<mark>Q</mark> silent	(-4, -4)	(0, - 6)	
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P silent P silent P talks (-4, -4) (-5, -2) (-10, -10)

You and an accomplice have been arrested for a crime and se interrogation. You have the choice of whether or not to confess associated with a cost. You don't know how your accomplice will a

Suppose we model Q's choice probabilistically...

VOU

qos

P silent P talks **Q** silent (-4, -4)(0, -6)(-5, -2) (-10, -10)**Q** talks Do stuff on board No free ride for Q

Vocabulary & Concepts

- Always assume local decision making (all players maximizing individual utility)
- Zero sum every entry in global collective payoff is 0
- Pure strategy always pick the same action no matter what
- **Mixed strategy** pick an action probabilistically
- Dominant strategy one action is strictly better no matter what the other plays does