

# Rational Inattention via Ignorance Equivalence

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joint with

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# Introduction

# Main Contribution

- We propose the novel concept of the **ignorance equivalent** as a parsimonious summary of the RI decision problem and its properties.
  - Ability to learn is '*equivalent*' to access to a larger menu
  - Learning analogue of the certainty equivalent for lotteries

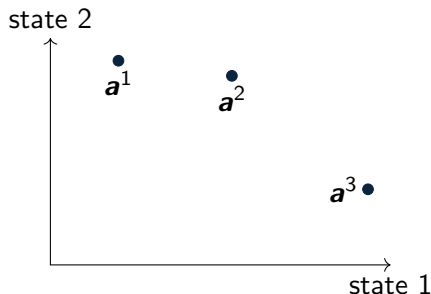
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- We propose the novel concept of the **ignorance equivalent** as a parsimonious summary of the RI decision problem and its properties.
  - Ability to learn is '*equivalent*' to access to a larger menu
  - Learning analogue of the certainty equivalent for lotteries
- The equivalence between learning ability and fictional payoffs simplifies analysis, including in multi-player settings.

# Model Setup

- An agent is choosing an action from a finite menu  $\mathcal{A}$ .
- Action  $\mathbf{a} \in \mathcal{A} \subseteq \mathbb{R}^l$  yields utility  $a_i$  in state  $i \in \mathcal{I} = 1, \dots, l$ .
- The agent has a prior belief  $\pi \in \Delta \mathcal{I}$  over states.

- **Payoffs, states and actions**



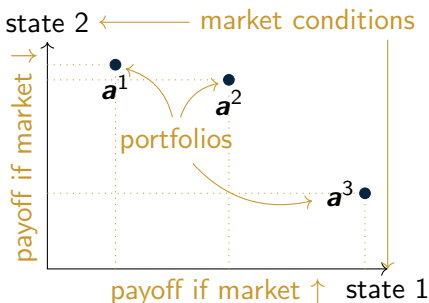
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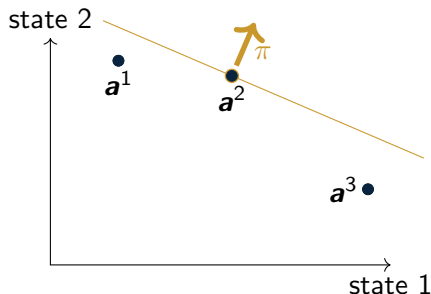
Investor Example



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- **No information**
  - Agent maximizes expected utility under prior belief  $\pi$ .

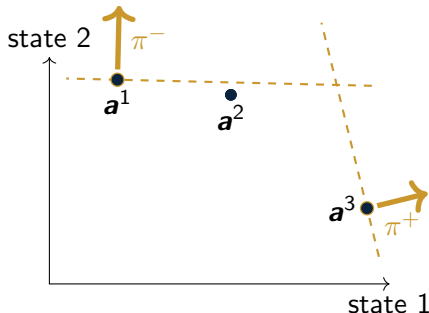


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- **Incomplete information**

- Agent observes signal draw  $s$ ,
- updates belief to  $\pi^s$ ,
- maximizes expected utility under this belief.



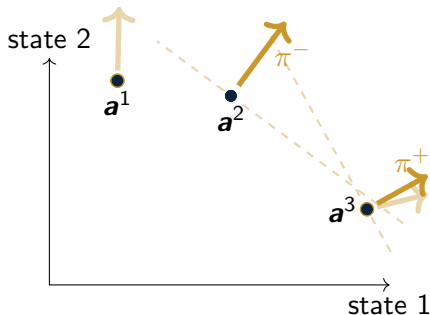


# Rational Inattention

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- **Rational Inattention**

- Agent chooses *which* costly signal to draw,
- ... and proceeds as before.



**Welfare:**  $W(\mathcal{A}, \pi, c) = E[\text{consumption utility}] - [\text{cost of signal}]$ .

# Learning Strategies

- Agent can choose *any* **learning strategy**  $\mathcal{S} = \langle \mathcal{A}, \mathbf{q} \rangle$ , where  $q_i(\mathbf{a})$  denotes the likelihood of taking action  $\mathbf{a}$  conditional on state  $i$ .

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- Cost  $c(\mathcal{S}, \pi)$  satisfies five intuitive properties, formal statements which are shared by all smooth & prior-concave UPS costs.

Prominent examples:

- Mutual Information (*Sims JME'03*),
- some Tsallis costs (*Caplin-Dean-Leahy '19*)
- Total Information (*Bloedel-Zhong '20*), which subsumes
  - Wald costs (*Morris-Strack '19*), Fisher Information (*Hébert-Woodford '20*).

# Ignorance Equivalent

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- the agent is willing to commit to *never* implement  $\alpha$ ,

$$W(\mathcal{A}, \pi, c) \geq W(\mathcal{A} \cup \{\alpha\}, \pi, c).$$

*Agent is willing to forgo learning opportunities that arise when  $\alpha$  is added to  $\mathcal{A}$ .*

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Since larger menus are always better,

$$\{\alpha\} \sim \mathcal{A} \sim \mathcal{A} \cup \{\alpha\}$$

in terms of the agent's preference over menus given cost  $c$  and prior  $\pi$ .



# Existence and Uniqueness

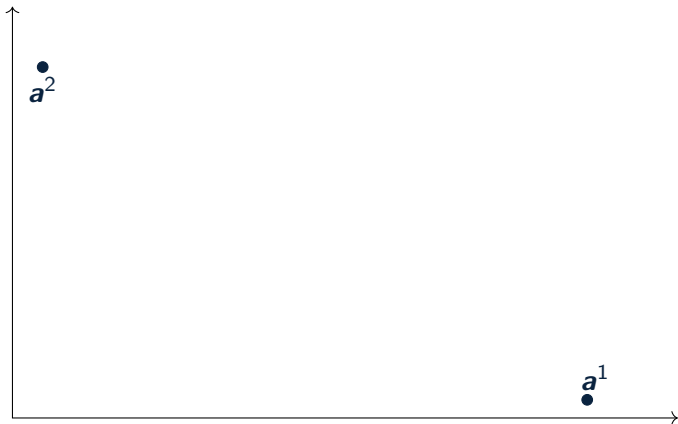
## Theorem 1

Each RI problem  $(\mathcal{A}, \pi, c)$  admits a unique ignorance equivalent  $\alpha$ .  
The ignorance equivalent can be constructed from any optimal signal  $\mathcal{S}$ .

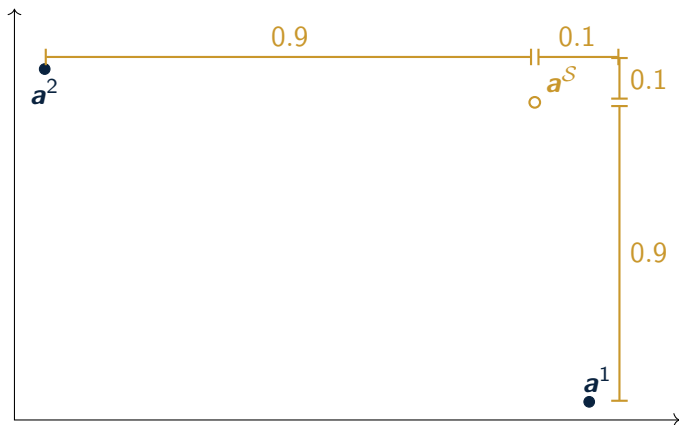
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Ignorance equivalence:  $W(\{\alpha\}, \pi, c) = W(\mathcal{A}, \pi, c) = W(\mathcal{A} \cup \{\alpha\}, \pi, c)$ .

# Locating the Ignorance Equivalent

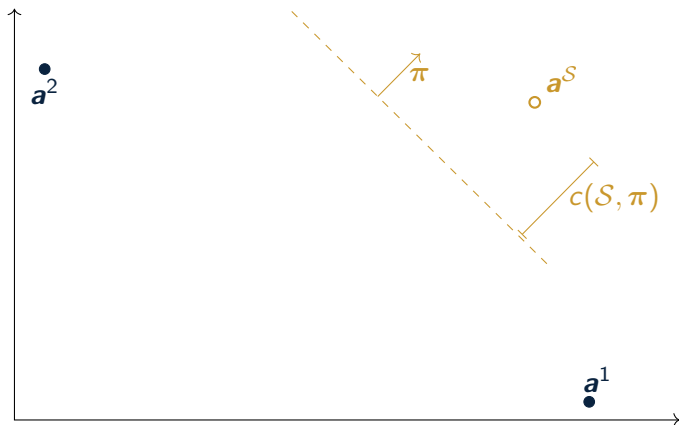


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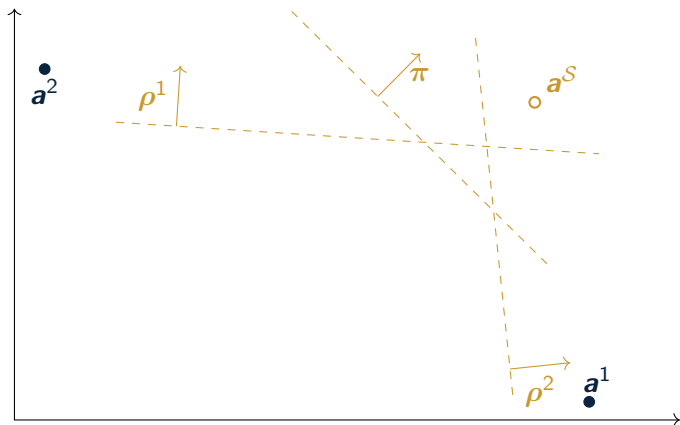
- Strategy  $\mathcal{S}$  always implements the high-payoff action with  $q_i(\mathbf{a}^i) = 0.9$ .
- In each state  $i$ , the expected consumption payoff is  $a_i^{\mathcal{S}} = \sum_{\mathbf{a} \in \mathcal{A}} q_i(\mathbf{a}) a_i$ .

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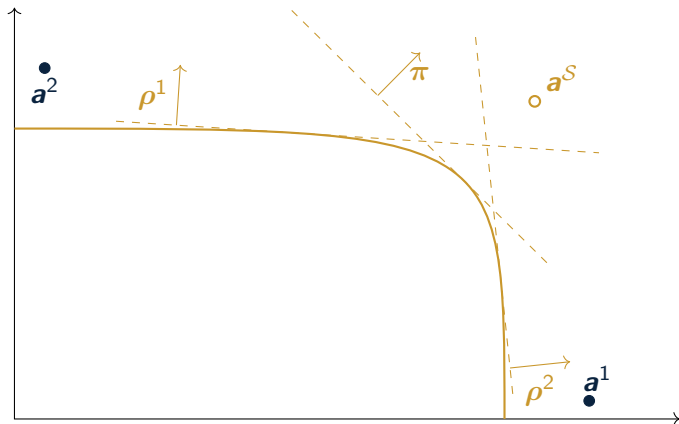
- Following  $S$  yields net utility  $\pi \cdot a^S - c(S, \pi)$  under prior  $\pi$ .

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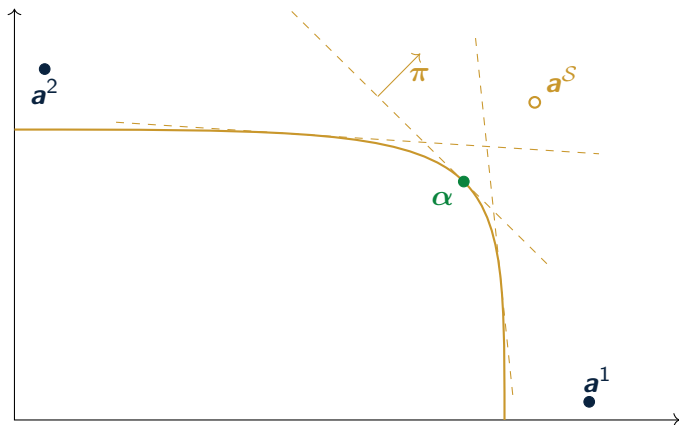
- The same construction shows net utility from  $S$  under any belief  $\rho$ .

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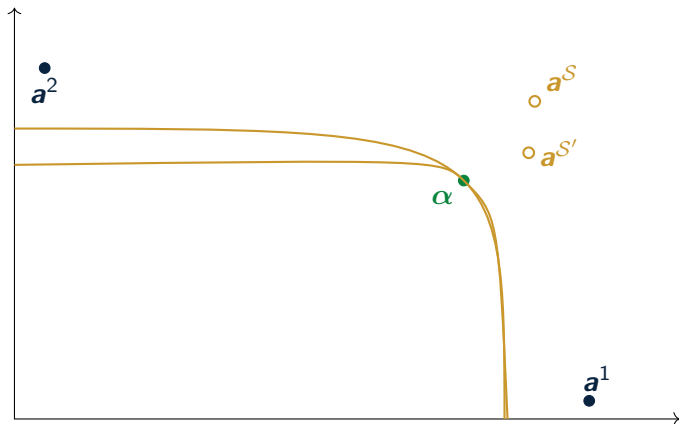
- Dominance:  $\mathbf{x} \succsim \mathcal{S} \iff \rho \cdot \mathbf{x} \leq \rho \cdot \mathbf{a}^{\mathcal{S}} - c(\mathcal{S}, \rho) \forall \rho.$

# Locating the Ignorance Equivalent



- Unconditional implementation of the ignorance equivalent  $\alpha$ 
  - is just as good as the optimal  $S$  under the prior.
  - is no better than  $S$  under *any* belief.

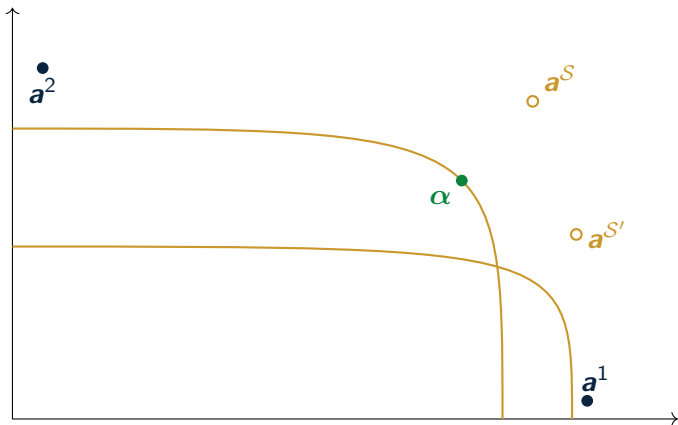
# Identifying optimal signals



- Optimal signals are exactly those that beat  $\alpha$  under any belief.



# A suboptimal signal



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# Properties of the Ignorance Equivalent

The ignorance equivalent  $\alpha$  of RI problem  $(\mathcal{A}, \pi, c)$  ...

- characterizes all optimal learning strategies w/o reference to beliefs.

**Corollary 1:** If  $\alpha$  is also the ignorance equivalent of  $(\mathcal{A}, \pi', c)$ , then the two RI problems have the same set of optimal learning strategies.

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- ★ is sufficient to identify which menu additions  $\mathbf{a}^+ \in \mathbb{R}^l$  are welfare enhancing,  $W(\mathcal{A} \cup \{\mathbf{a}^+\}, \pi, c) > W(\mathcal{A}, \pi, c)$ .

**Theorem 3:**  $\mathbf{a}^+$  adds welfare to  $\mathcal{A}$   $\iff$   $\mathbf{a}^+$  adds welfare to  $\{\alpha\}$ .

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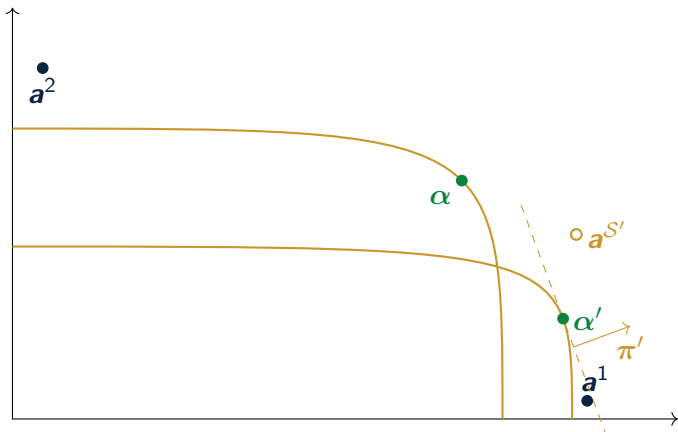
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- does not distort learning under *any* prior.

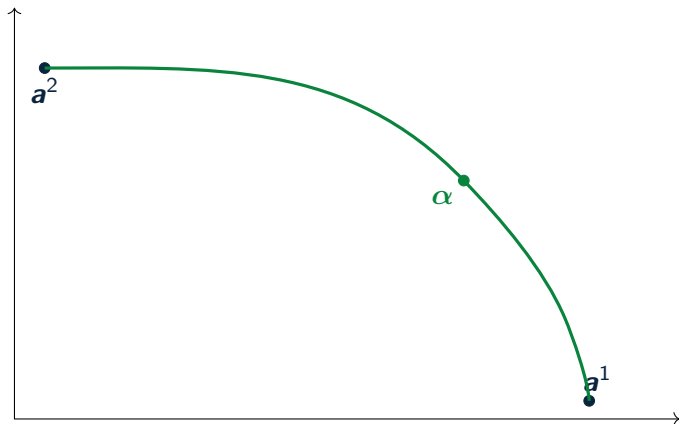
**Corollary 3:** If learning strategy  $\langle \mathcal{A}, \mathbf{q} \rangle$  is optimal in RI problem  $(\mathcal{A}, \pi', c)$ , then it is also optimal in  $(\mathcal{A} \cup \{\alpha\}, \pi', c)$ .

# Self-selection Property



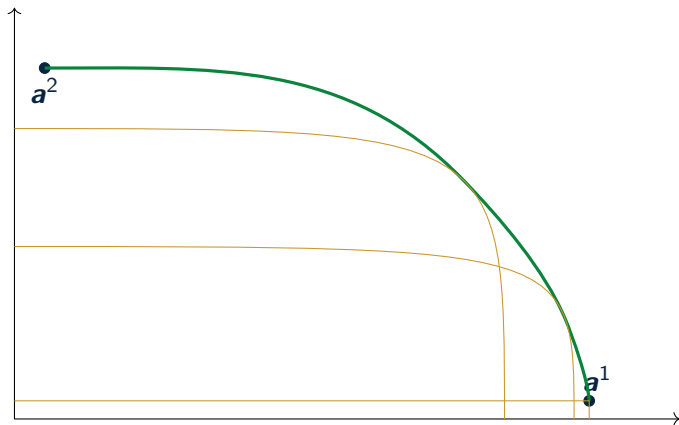
- Stopping at  $\alpha'$  is no better than continuing with  $S'$ .

# Learning-Proof Menu



- Together, ignorance equivalents form the **Learning-Proof menu**  $\bar{\mathcal{A}}$ .

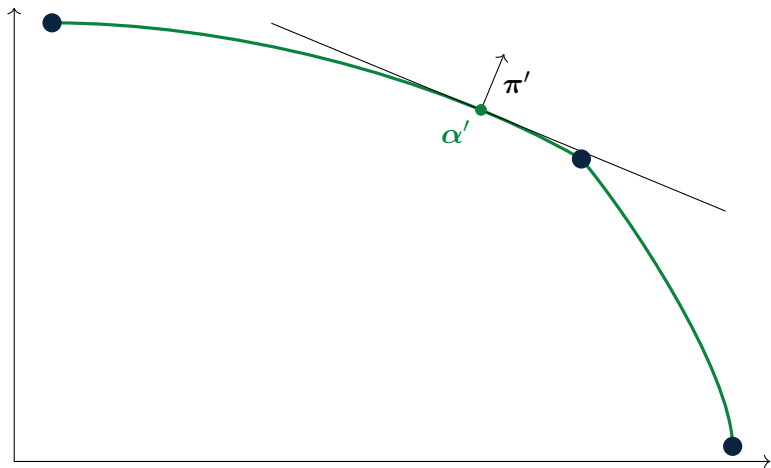
# Learning-Proof Menu



- The learning-proof menu can also be constructed from the signals.

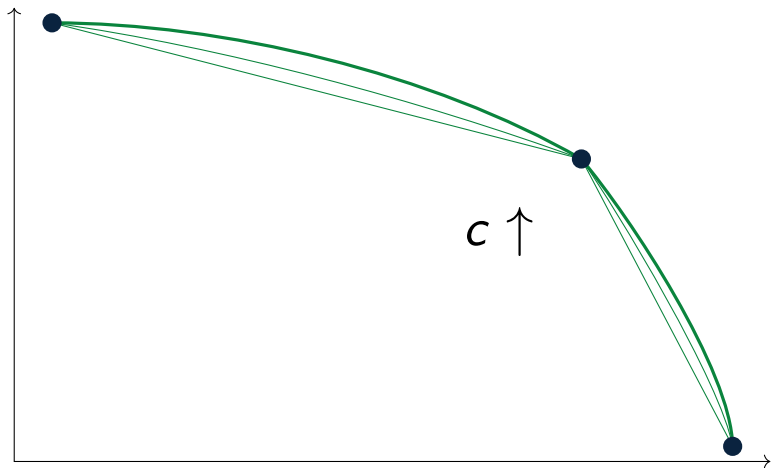


# Learning-Proof Menu



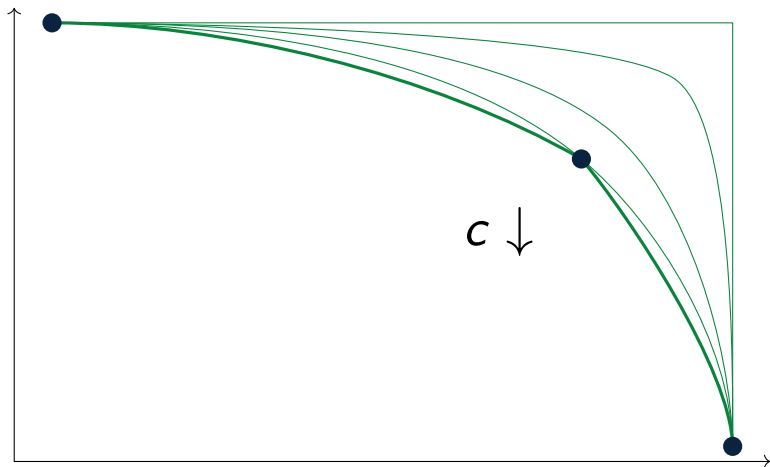
The Learning-Proof Menu is a **EU representation** of the RL problem:  
Ability to learn is *as if* agent has access to  $\bar{\mathcal{A}}$  rather than  $\mathcal{A}$ .

# Learning-Proof Menu



For high costs,  $\bar{\mathcal{A}}$  approaches the boundary of the convex hull.

# Learning-Proof Menu



For low costs,  $\bar{\mathcal{A}}$  approaches the boundary of the hypercube.

# Certainty Equivalent vs Ignorance Equivalent

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- Condenses the appeal of a lottery into a scalar.
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## Ignorance equivalent:

- Condenses the entire menu  $\mathcal{A}$  into one payoff vector  $\alpha$ .
- Retains enough detail to capture learning opportunities.
- Useful for comparisons across signals, menus, and beliefs.

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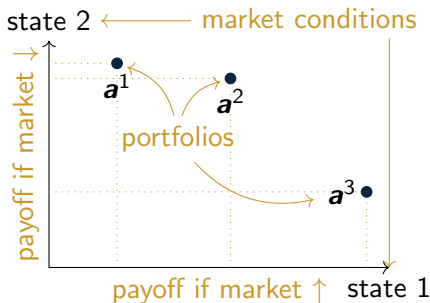
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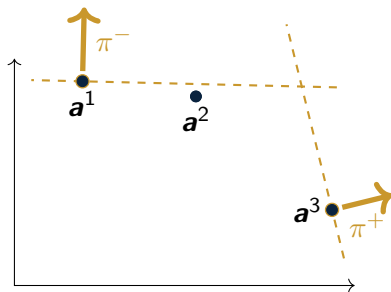


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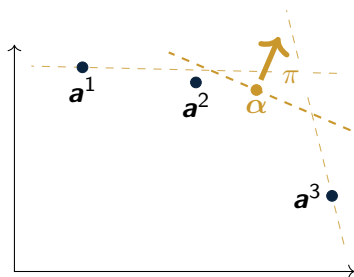


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- $\alpha$  describes a portfolio that
  - is purchased unconditionally
  - makes her no better off.

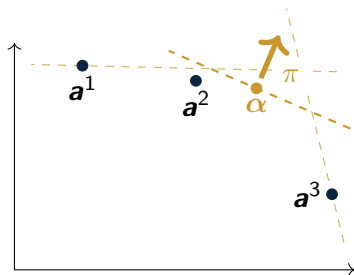


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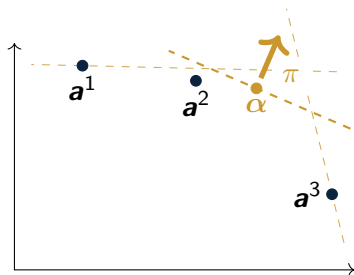
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- $\alpha$  is what he wants to offer!
  - Unconditional acceptance.
  - Avoids adverse selection.
  - Reveals no free information.
  - Socially optimal.



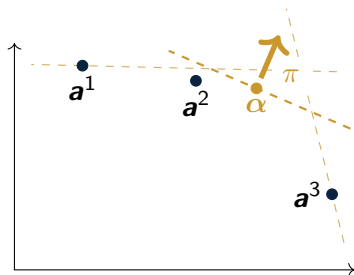
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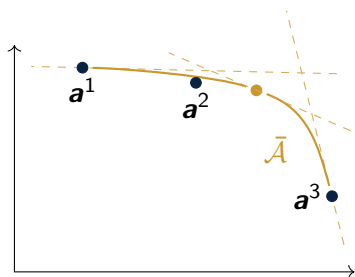
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- What if prior  $\pi$  is unknown?
  - The manager can offer  $\bar{\mathcal{A}}$ .





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  - ▶ *Crémer&Khalil'92, but with flexible learning*
- If agents can access different menus and have comparative advantages in learning (technology acquisition example), the first best typically involves learning by multiple agents (teams problem).
  - ▶ *We construct a PBE that achieves the first best through repeated trades.*

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- Yields novel insights
- Economically relevant
  - *not only* when learning is to be avoided.

# Appendix

Notation:

- Signal  $\mathcal{S} = \langle S, \mathbf{q} \rangle$  returns  $s \in S$  with probability  $q_i(s)$  in state  $i$ .
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---

We impose five conditions on  $c$ :

- 1 The cost function is continuous.
  - $\forall \mathcal{S}, \forall \hat{c} \geq 0$ , the pre-image  $\{(\mathbf{q}, \boldsymbol{\pi}) \in (\Delta S)^{\mathcal{I}} \times \Delta \mathcal{I} \mid c(\langle \mathcal{S}, \mathbf{q} \rangle, \boldsymbol{\pi}) \geq \hat{c}\}$  is open.

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- 1 The cost function is continuous.
- 2 The agent can freely dispose of information.
  - $c(\cdot, \pi)$  is non-decreasing in the Blackwell order  $\forall \pi$ .
  - $c(\mathcal{S}, \cdot)$  is weakly concave in the prior  $\forall \mathcal{S}$ .



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We impose five conditions on  $c$ :

- 1 The cost function is continuous.
- 2 The agent can freely dispose of information.
- 3 Ties are broken through learning:
  - $\forall \boldsymbol{\pi} \in \Delta \mathcal{I}, \forall \mathbf{a} \in \mathbb{R}^I$  with  $\boldsymbol{\pi} \cdot \mathbf{a} = 0$  and  $\boldsymbol{\pi} \cdot |\mathbf{a}| > 0$ ,  
 $\exists \mathcal{S} = \langle \{0, 1\}, \mathbf{q} \rangle$  such that  $c(\mathcal{S}, \boldsymbol{\pi}) < \sum_{i \in \mathcal{I}} \pi_i q_i(1) a_i$ .

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draw  $\langle S, \mathbf{q} \rangle \rightarrow$  observe  $s \rightarrow$  update belief to  $\boldsymbol{\pi}^s \rightarrow$  draw  $\langle S^s, \mathbf{q}^s \rangle$ ,  
the one-shot implementation

$$\tilde{\mathcal{S}} = \langle S \times \bigcup_{s \in S} S^s, \tilde{\mathbf{q}} \rangle \text{ with } \tilde{q}_i(s, \tilde{s}) = q_i(s)q_i^s(\tilde{s})$$

is no more costly in expectation,

$$c(\tilde{\mathcal{S}}, \boldsymbol{\pi}) \leq c(\langle S, \mathbf{q} \rangle, \boldsymbol{\pi}) + \sum_{s \in S} (\boldsymbol{\pi} \cdot \mathbf{q}(s)) c(\langle S^s, \mathbf{q}^s \rangle, \boldsymbol{\pi}^s).$$

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- ★ Sequential information acquisition brings no extra costs.
- As above, but with the opposite inequality,

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## Game Setup:

- All agents share a common prior  $\pi^0$  about the state  $i$ .
- Initially, the opportunity rests with agent 1.  
It remains transferable as long as it has not been executed.
- Agents can learn at any time
  - each according to a (possibly distinct) cost function  $c^k$ ,
  - regardless of whether they currently own the opportunity,
  - without 'executing' the opportunity.

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**Trade:** A trade between agents  $k$  and  $\ell$  at *terms*  $\mathbf{t} \in \mathbb{R}^I$

- requires the agreement of both agents.
- means that agent  $k$  releases the opportunity to agent  $\ell$ , who in turn pays the former  $t_i$  once the state  $i$  realizes.

- *Teams.* A firm buys a new technology that will affect many stakeholders. Some workers are uniquely qualified to learn about specific characteristics of the technology. Can they achieve the optimal sequence of cost-benefit investigations across all workers?

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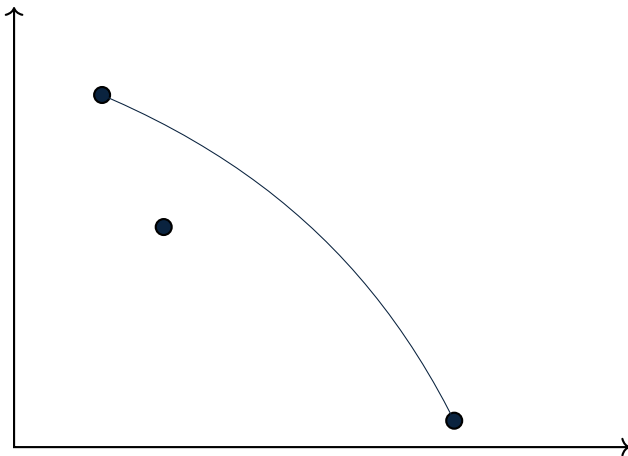
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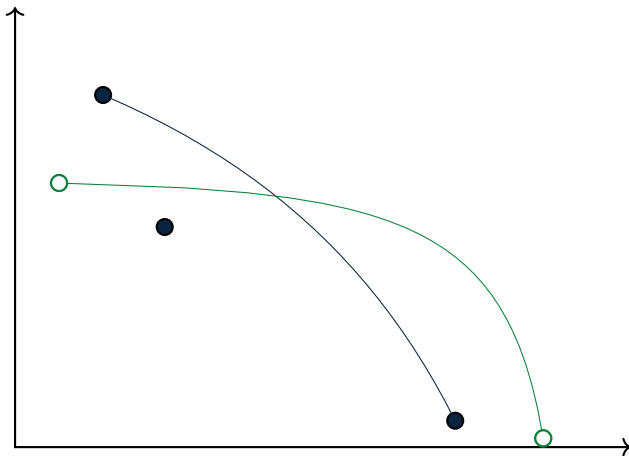
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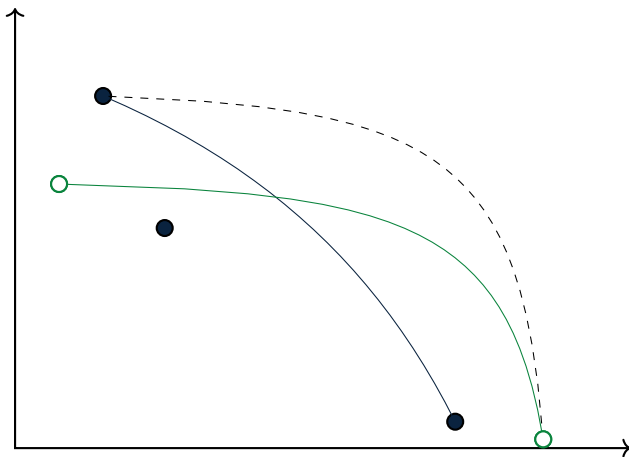
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  - All agents are willing to learn or execute if and only if it is socially efficient for them to do so.



Payoff possibilities for agent 1



Payoff possibilities for agent 2



Payoff possibilities for social planner



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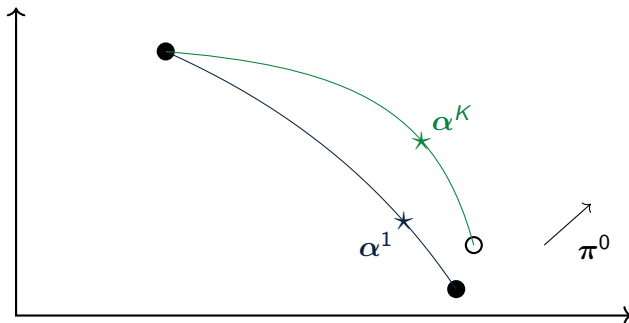
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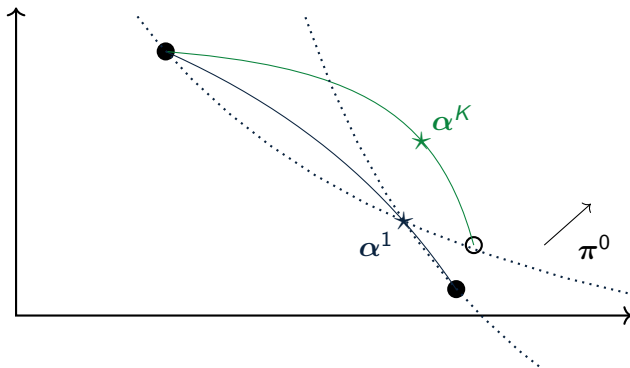
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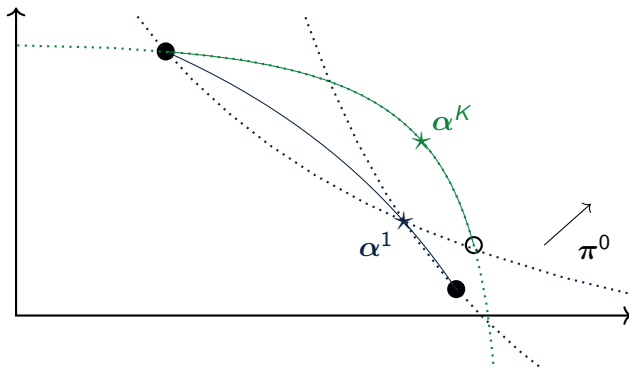
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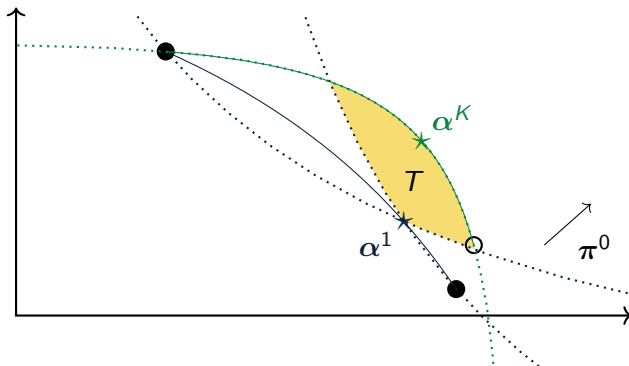
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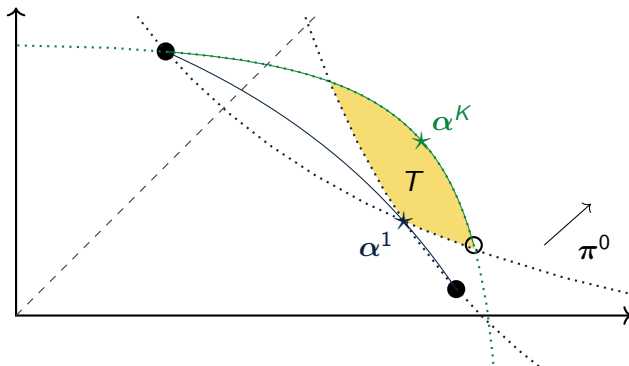


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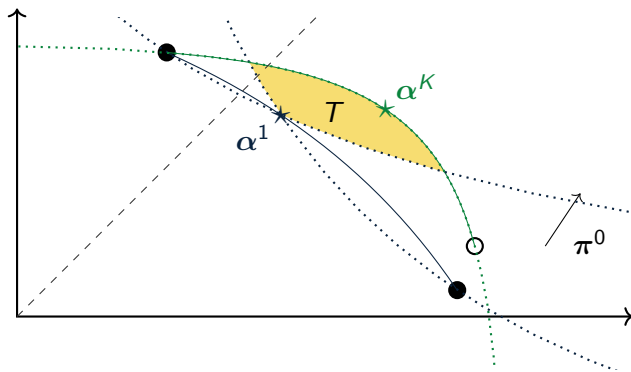
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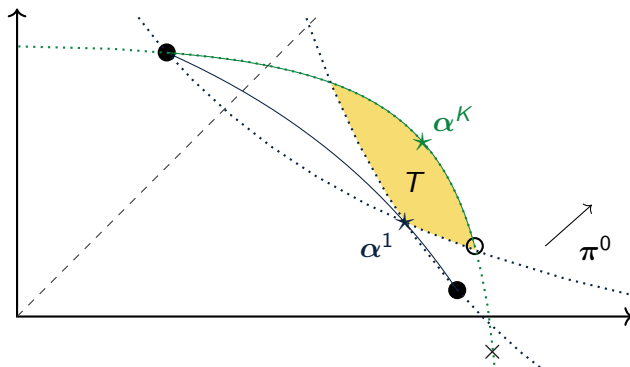
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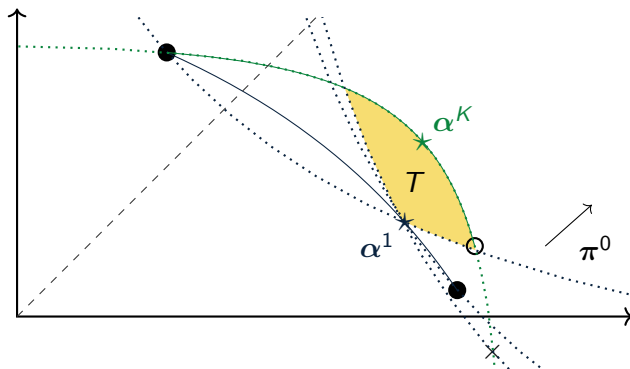
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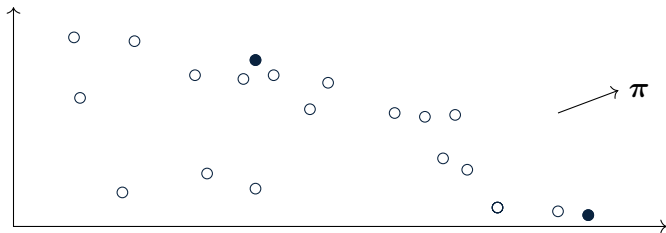
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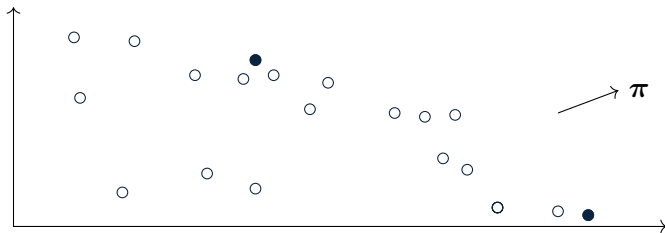
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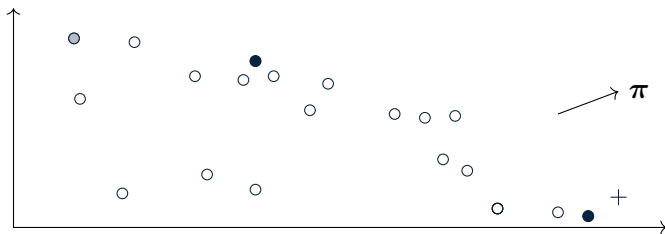
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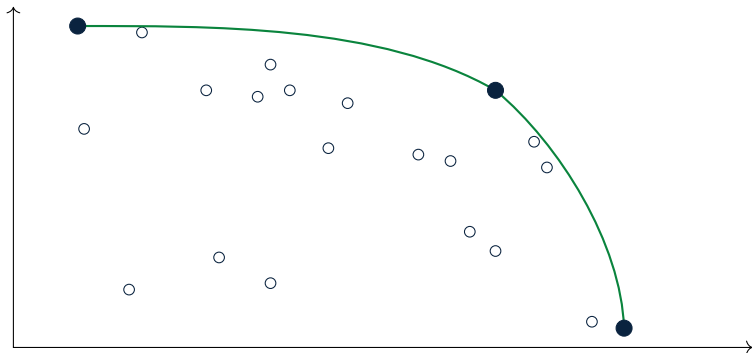
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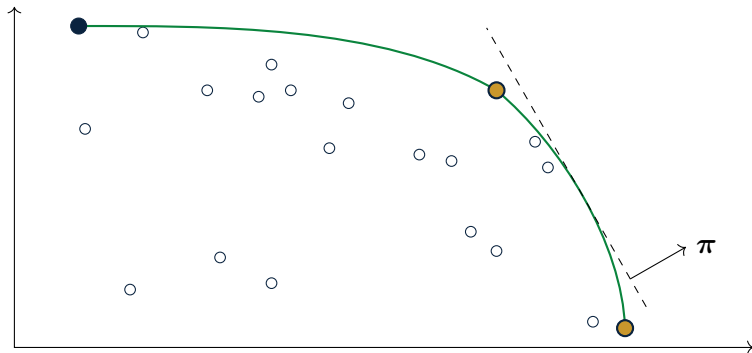
# Anchor Actions



## Theorem

*Anchors  $\mathbf{a} \in \mathcal{A} \cap \bar{\mathcal{A}}$  form a 'latent' consideration set:*

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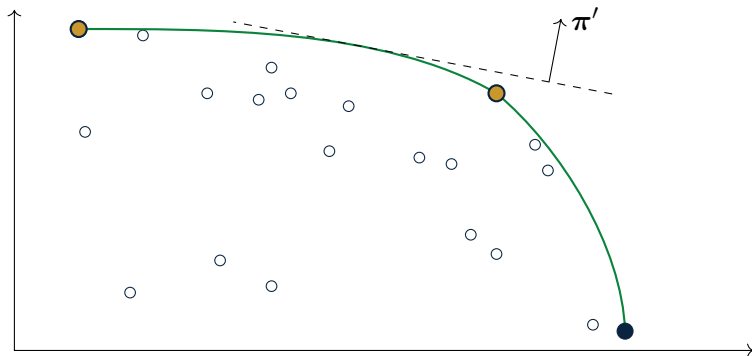


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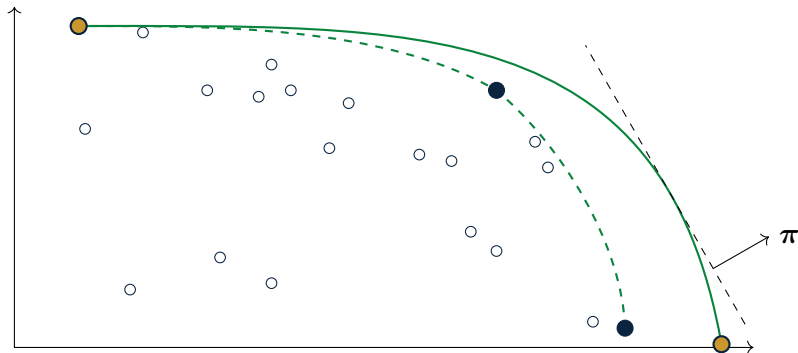


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- A subset of them is chosen at any given prior  $\pi$ .
- Changes in  $\pi$  can activate any of them.
- Menu expansion can activate any of them for a fixed prior  $\pi$ .

[details](#)

Consider an RL problem  $(\mathcal{A}, \pi, c)$ .

**Question:** What happens if we add action  $\mathbf{a}^+ \in \mathbb{R}^I$  to the menu  $\mathcal{A}$ ?

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... and the 'right' complement  $\mathbf{a}^+$  can activate any anchor action.

Theorem (Activation of anchor actions)

For any anchor action  $\mathbf{a} \in \mathcal{A} \cap \bar{\mathcal{A}}$ , there exists  $\mathbf{a}^+ \in \mathbb{R}^I$  such that

$$p(\mathbf{a}) > 0 \text{ in RI problem } (\mathcal{A} \cup \mathbf{a}^+, \pi, c).$$

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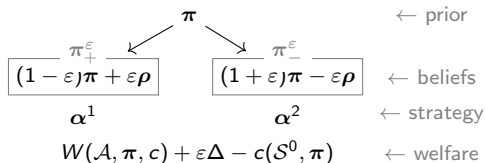
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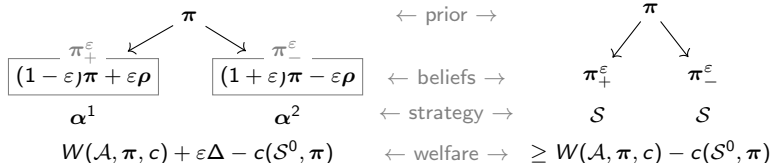
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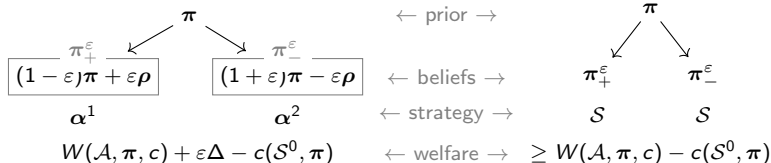
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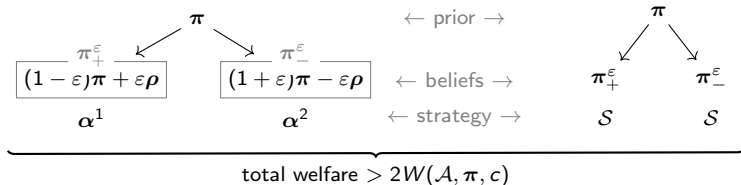
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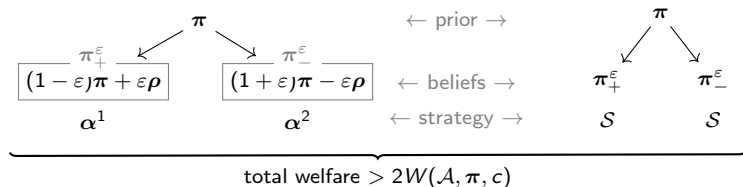


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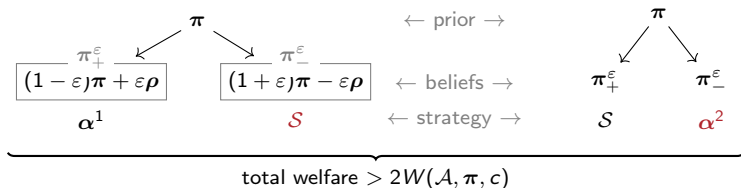
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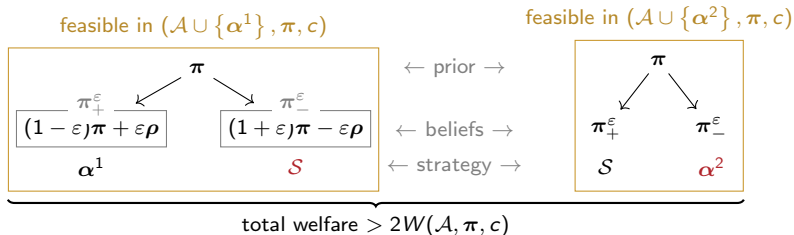
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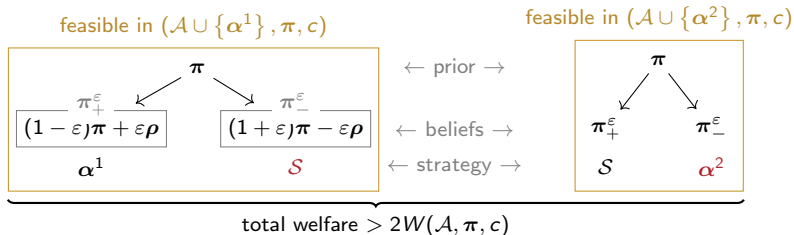
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# Proof Sketch: Uniqueness

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- By ③, total welfare is  $> 2W(\mathcal{A}, \pi, c)$  for small  $\varepsilon$ .
- Now switch contingency plans without affecting total welfare.
- Hence  $W(\mathcal{A} \cup \{\alpha^k\}, \pi, c) > W(\mathcal{A}, \pi, c)$  for at least one  $k$ .

Ignorance Equivalence:  $W(\{\alpha\}, \pi, c) = W(\mathcal{A}, \pi, c) = W(\mathcal{A} \cup \{\alpha\}, \pi, c)$

- Suppose  $\alpha$  beats  $\mathcal{S}$  under some posterior,  $\rho \cdot \alpha = \rho \cdot \mathbf{a}^{\mathcal{S}} - c(\mathcal{S}, \rho) + \Delta$  with  $\Delta > 0$ .

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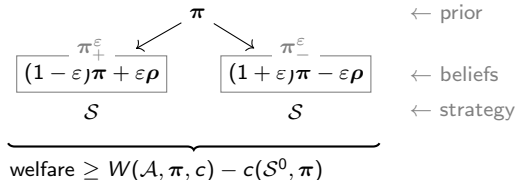
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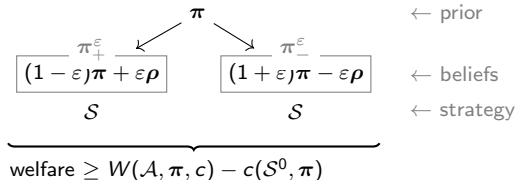


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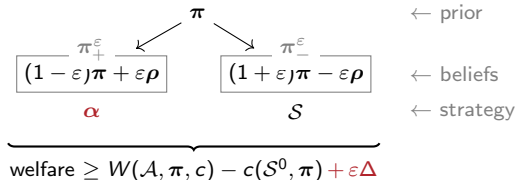


- Implement  $\alpha$  when advantageous.

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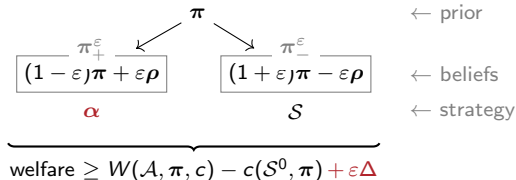


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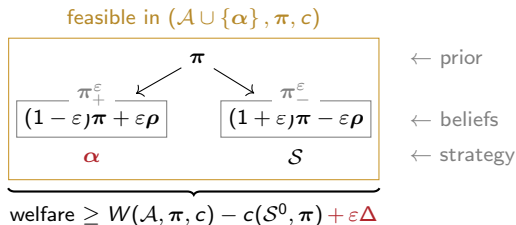
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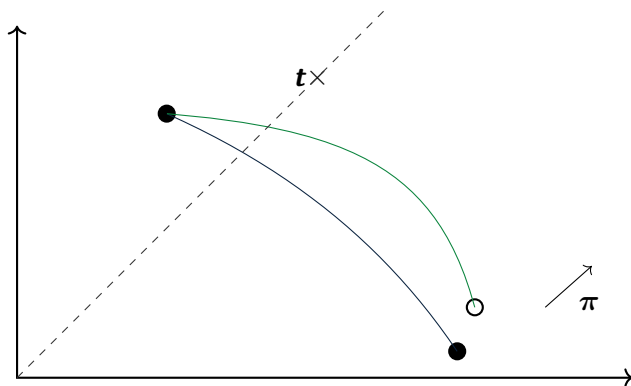
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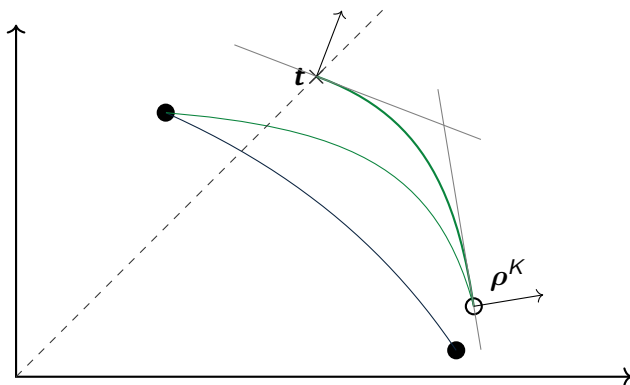
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# Unverifiable states (2)

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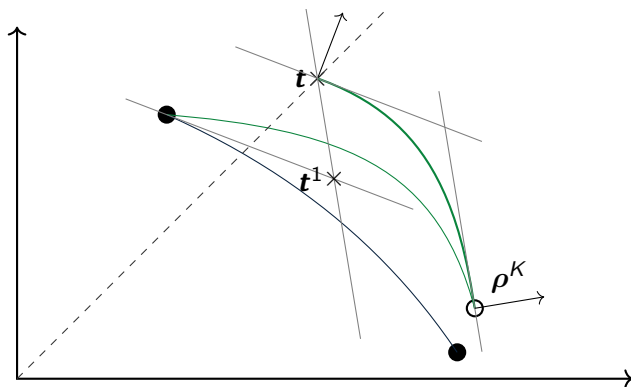


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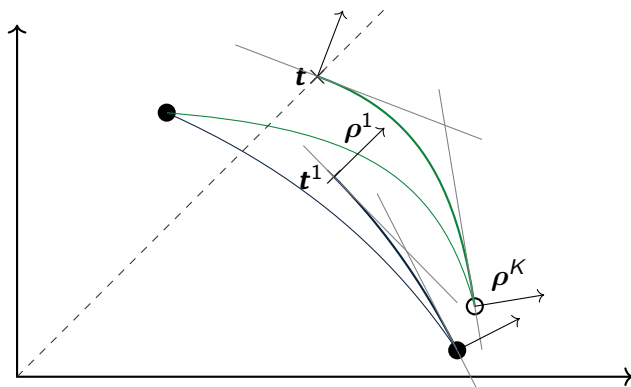
The learning-proof menu  $\overline{\mathcal{A}^K \cup \{t\}}$  determines under which posterior  $\rho^K$  Agent K accepts.

For a particular transfer  $t$ ,



Given Agent  $K$ 's strategy, offer  $t$  is payoff-equivalent to certain trade at  $t^1$ .

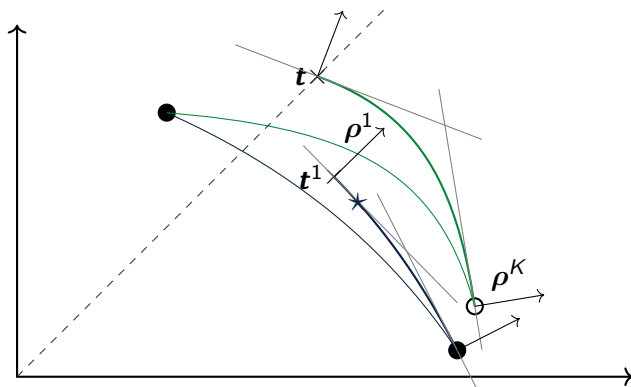
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The learning-proof menu  $\overline{\mathcal{A}^1 \cup \{t^1\}}$  determines under which posterior  $\rho^1$  Agent 1 offers.

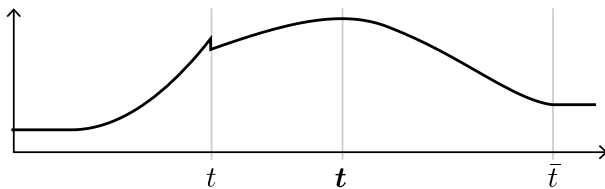


For a particular transfer  $t$ ,



The ignorance equivalent of  $(\mathcal{A}^1 \cup \{t^1\}, \pi, c^1)$  determines Agent 1's payoff.

Using this construction, we can determine Agent 1's payoff for any constant transfer,



where

- $\underline{t}$  maximal transfer that Agent K accepts unconditionally,
- $\bar{t}$  maximal transfer that Agent K rejects unconditionally,
- $t$  the one plotted previously, apparently optimal.

**Finding:** The equilibrium TIOLI offer from Agent 1 involves partial trade and pre-trade learning by both.