# GSOE9210 Engineering Decisions

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**Engineering Decisions** 

# Mixed strategies

- What are mixed strategies?
  - Mixture plots
- 2 Calculations with mixtures
- Mixing many strategies
  - Mixed strategies and dominance

### Outline

- 1 What are mixed strategies?
  - Mixture plots
- 2 Calculations with mixtures
- 3 Mixing many strategies
  - Mixed strategies and dominance

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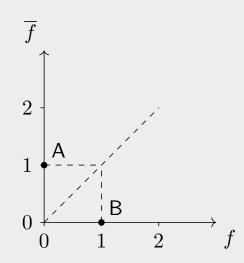
What are mixed strategies?

# Mixed strategies

River problem (continued):

- Action C is weakly dominated by B; ignore it
- Value and regret tables:

Regret plot:



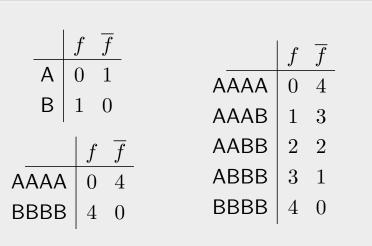
Original values: fuel saved

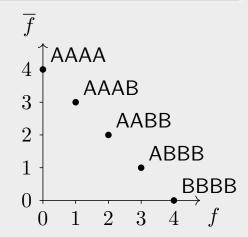
Regret: extra fuel used in a state

## Mixed strategies

#### Example (Multi-decision strategies)

Suppose four packages have to be delivered urgently to C today. Each package is transported on a separate motor-boat.





 Strategy AAAB: three trips via A and one via B; One extra litre used if f (due to  $1 \times \mathsf{B}$ ) and three if  $\overline{f}$  ( $3 \times \mathsf{A}$ )

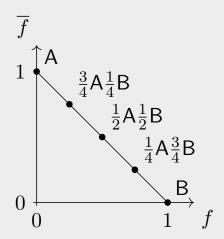
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What are mixed strategies?

### Mixed strategies

Average, per trip, over many trips:

	$\int f$	$\overline{f}$
Α	0	1
$\frac{3}{4}A\frac{1}{4}B$ $\frac{1}{2}A\frac{1}{2}B$ $\frac{1}{4}A\frac{3}{4}B$ B	$\begin{array}{c} \frac{1}{4} \\ \frac{1}{2} \\ \frac{3}{4} \end{array}$	$\frac{3}{4}$ $\frac{1}{2}$ $\frac{1}{4}$



### Definition (Mixed strategy)

A mixed strategy (or mixture) is a strategy in which the basic strategies are distributed in proportions. A strategy in which the entire proportion is from one basic strategy is called a pure strategy.

## Mixed strategies

In general:

- For basic strategies  $\mathcal{A} = \{a_1, \dots, a_k\}$ , mixed strategies determined by mixtures  $(\mu_{a_1}, \dots, \mu_{a_k})$  of basic strategies
- Value of mixed strategy  $M(\mu_{a_1}, \dots, \mu_{a_k})$  in state  $s \in \mathcal{S}$  is expected value of basic strategies:

$$V(M,s) = \mu_{a_1} v(a_1, s) + \dots + \mu_{a_k} v(a_k, s)$$
$$= \sum_{a \in \mathcal{A}} \mu_a v(a, s).$$

where

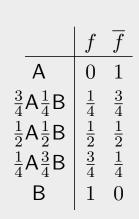
$$\sum_{a\in\mathcal{A}}\mu_a=1\quad\text{and}\quad\mu_a\geqslant 0$$

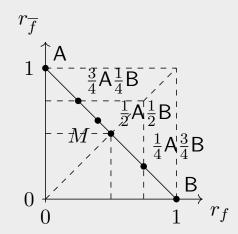
 Think of mixtures as many independent decisions in a single unknown state

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What are mixed strategies?

### Mixed strategies



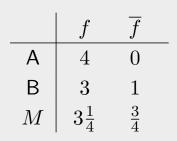


- Mixtures of A and B lie on line segment AB
- Position of mixture M determined by mixture parameter  $\mu_{\mathsf{A}}$   $(0\leqslant \mu_{\mathsf{A}}\leqslant 1)$ ; i.e., if  $M=M(\mu_{\mathsf{A}})$  then M is  $\mu_{\mathsf{A}}$  of the way from B to A; e.g.,  $\frac{3}{4}\mathsf{A}\frac{1}{4}\mathsf{B}=M(\frac{3}{4})$

Question: which is the miniMax Regret mixed strategy?

# Mixed strategies: mixture plots

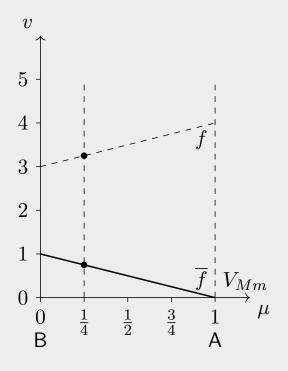
For the river problem with  $\mu_A = \mu$ :



$$m_1 = 4\mu + 3(1 - \mu) = 3 + \mu$$
  
 $m_2 = 0\mu + 1(1 - \mu) = 1 - \mu$ 

#### Exercise

Which is the *Maximin* mixed strategy?



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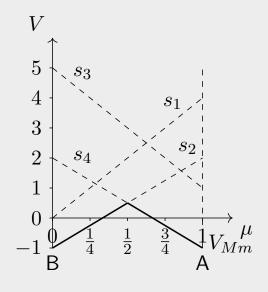
What are mixed strategies?

Mixture plots

### Mixed strategies: many states

Consider a problem with four states, two basic strategies, and mixtures, M, where  $\mu_A = \mu$ :

Maximin values for mixed strategies  $M(\mu)$  lie on solid line. Maximin mixed strategy  $M^*$  given by  $\mu^* = \frac{1}{2}$  which maximises Maximin values; i.e.,  $V_{Mm}(M^*) = \frac{1}{2}$ .



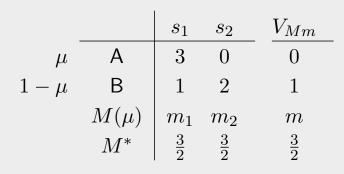
### Outline

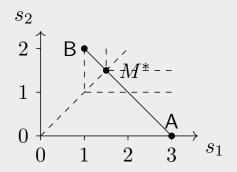
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#### Calculations with mixtures

# Mixed strategies: Maximin





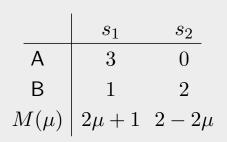
- Mixtures defined by mixture parameter  $\mu$  ( $0 \le \mu \le 1$ ):  $M(\mu) = (2\mu + 1, 2 2\mu)$ ; i.e.,  $m_1 = 2\mu + 1$ ,  $m_2 = 2 2\mu$
- Point  $M^*$  corresponds to mixture  $M(\frac{1}{4}) = \frac{1}{4}\mathsf{A}\frac{3}{4}\mathsf{B}$

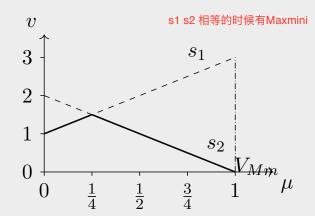
#### Exercise

Derive a general expression for a mixture  $M(\mu)$  of two actions A and B.

# Mixed strategies: mixture plot

Consider mixtures M, where  $\mu_A = \mu$ :





- Maximin values  $(V_{Mm})$  for mixed strategies  $M(\mu)$  lie on solid line
- Maximin mixed strategy  $M^*$  maximises Maximin value
- Maximin value maximised for  $\mu^* = \frac{1}{4}$ ; i.e.,  $V_{Mm}(M^*) = \frac{3}{2}$

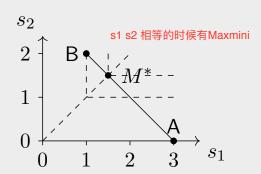
#### **Exercises**

Verify algebraically the value of  $\mu^*$  above.

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#### Calculations with mixtures

## Mixed strategies: Maximin



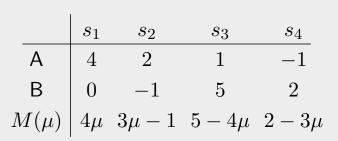
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#### Exercise

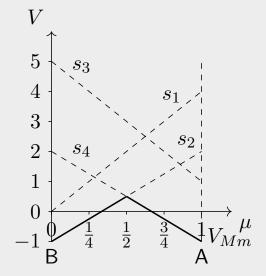
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### Mixed strategies: many states

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Maximin values for mixed strategies  $M(\mu)$  lie on solid line. Maximin mixed strategy  $M^*$  given by  $\mu^* = \frac{1}{2}$  which maximises Maximin values; i.e.,  $V_{Mm}(M^*) = \frac{1}{2}$ .



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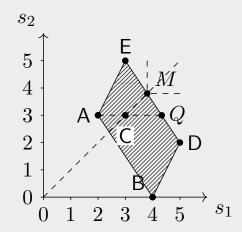
Mixing many strategies

### Outline

- What are mixed strategies?Mixture plots
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# Mixed strategies: many basic strategies

$s_1$	$s_2$
2	3
4	0
3	3
5	2
3	5
	2 4 3 5



- Can mix more than two strategies: e.g.,  $C = \mu_A A \mu_E E \mu_D D$
- Mixtures lie inside (or on boundary) of shaded region. Why?

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#### Exercise

M

Which is the Maximin mixed strategy? What is its value?

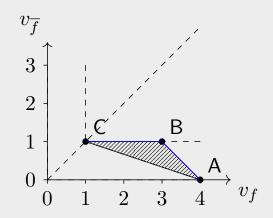
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Mixing many strategies

### Mixed strategies

The River decision problem:

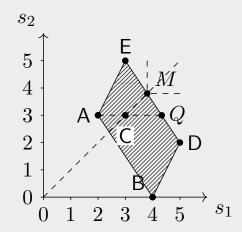


#### **Exercises**

- Are AC mixtures ever better than BC mixtures? AB mixtures?
   Others?
- Which mixtures are admissible (not dominated)?
- Determine the Maximin mixed strategy? What is its value?

# Mixed strategies: many basic strategies

	$s_1$	$s_2$
Α	2	3
В	4	0
C	3	3
D	5	2
Ε	3	5



- Can mix more than two strategies: e.g.,  $C = \mu_A A \mu_E E \mu_D D$
- Mixtures lie inside (or on boundary) of shaded region. Why?

#### Exercise

Which is the Maximin mixed strategy? What is its value?

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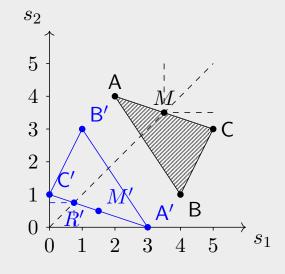
Mixing many strategies

## Mixed strategies: miniMax Regret

Consider the regret for the decision problem below:

	$s_1$	$s_2$
Α	2	4
В	4	1
C	5	3
M	$m_1$	$m_2$

Note: miniMax Regret mixed action R' doesn't correspond to Maximin mixed action M.

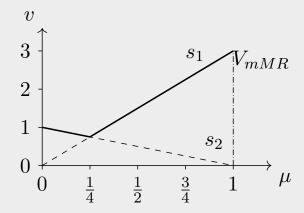


#### Exercise

Determine the miniMax Regret mixed strategy. What is its value?

## Mixed strategies: regret mixture plot

Consider mixtures M, where  $\mu_A = \mu$ :



- ullet miniMax Regret values for mixed strategies  $M(\mu)$  lie on solid line
- miniMax Regret mixed strategy  $M^*$  is mixture that minimises miniMax Regret value
- miniMax Regret value maximised for  $\mu^* = \frac{1}{4}$ ; i.e.,  $V_{mMR}(M^*) = \frac{3}{4}$

#### **Exercises**

Verify algebraically the value of  $\mu^*$  above.

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Mixing many strategies

Mixed strategies and dominance

#### Generalised dominance

#### Definition (Strict dominance)

Strategy A *strictly dominates* B iff every outcome of A is more preferred than the corresponding outcome of B.

#### Definition (Weak dominance)

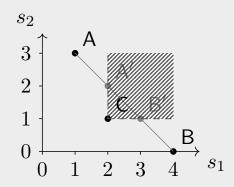
Strategy A weakly dominates B iff every outcome of A is no less preferred than the corresponding outcome of B, and some outcome is more preferred.

#### Exercise

Which strategies in the decision table shown are dominated?

## Mixed strategies: dominance

	$s_1$	$s_2$
Α	1	3
В	4	0
-C	2	1



- No pure strategies dominated by other pure strategies
- However, C is dominated by all mixed strategies on A'B'
- C isn't admissible among mixed strategies

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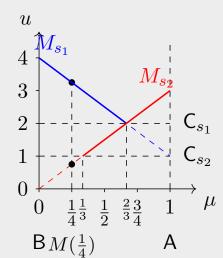
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Mixing many strategies

Mixed strategies and dominance

## Mixed strategies: dominance

	$s_1$	$s_2$
Α	1	3
В	4	0
C	2	1
M	$4-3\mu$	$3\mu$



Let 
$$M_{\mathsf{AB}}(\mu) = \mu \mathsf{A} + (1-\mu)\mathsf{B}; \textit{ i.e.,}$$
 
$$M(\mu) = (M_{s_1}(\mu), M_{s_2}(\mu))$$
 
$$= (4-3\mu, 3\mu)$$

For example,

$$M(\frac{1}{4}) = (3\frac{1}{4}, \frac{3}{4})$$

- Dominance requires:  $4 3\mu \geqslant 2$ ; i.e.,  $\mu \leqslant \frac{2}{3}$
- Similarly:  $3\mu \geqslant 1$ ; *i.e.*,  $\mu \geqslant \frac{1}{3}$ .
- C dominated when both conditions hold: i.e., when  $\frac{1}{3} \leqslant \mu \leqslant \frac{2}{3}$

# Summary: mixed strategies

- Mixed strategies as combinations of pure strategies
- Interpreting mixed strategies are multiple decisions for a single situation
- Visualising and plotting mixtures: mixture plots
- Mixtures and dominance

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