

# Danger of no-regret learning

	L	R
U	4 4	3 0
D	0 0	2 1

U dominant

(U, L) Nash

row player: what should I do

Stackelberg equilibrium

choose strategy player 1 (row)

know opponent will best respond

maximize your value

mixed strategy:  $x > \frac{1}{2}$  D &  $1-x$  U

best response  $\notin R$

more generally: leader select

random strategy  $\alpha_i$  &  $s_i \in S$

assumes other players play Nash

of the resulting game maximizing his value

Stackelberg value = supremum

2 person game:

$$\alpha_s \geq 0 \quad s \in S_1 \quad \sum_s \alpha_s = 1$$

second player  $z^* = \arg \max_z \sum_s \alpha_s u_2(s, z)$

$$\sup_{\alpha} \sum_s \alpha_s u_1(s, z^*)$$

Claim: 2 person 0-sum

Stackelberg value = Nash value

A payoff matrix

your strategy  $x$  (payoff  $Ax$  options)

argmax  $Ax$

choose  $x$  to maximize this

Recall  $x$  is Nash.

---

Suppose you play  $\alpha_s \geq 0$  so that

$$z^* = \arg \min_z \sum_s \alpha_s u_2(s, z)$$

is unique

no-regret player:

expected value for any strategy  $z$

after  $T$  times

$$T \cdot \sum_s \alpha_s u_2(s, z)$$

$T$  is large enough to that  
 error in expectation + error of regret  
 smaller than  $T \cdot \text{gap between argmin}$   
 & next  
 $\Rightarrow$  no-regret player must play  $\geq^*$

---

Example 2.

	L	M	R
V	0, $\varepsilon$	-2, -1	-2, 0
D	0, -1	-2, 1	<b>2, 0</b>

(U, L) Nash

( $\frac{1}{2}, \frac{1}{2}$ , R)

↗  
 leader

Stackelberg value = 0  
 cannot play D with prob  $> \frac{1}{2}$

if opponent is mean-based no-regret learner

Learner strategy: overall time  $T$

U  $T/2$  times  $\sim$  best response L  
 payoff for leader  $\sim 0$

switch to D  $x$  times then his  
 historic values

$$L: \quad \varepsilon \frac{T}{2} - x, \quad M: -\frac{T}{2} + x$$

$$R: 0$$

after  $\frac{\varepsilon T}{2}$  additional steps

follow the leader chooses  $R$

$$\text{leader's value} \sim \frac{T}{2}(1-\varepsilon) \cdot 2$$