



FORMAÇÃO INTELIGÊNCIA ARTIFICIAL E MACHINE LEARNING

JOGO DA VELHA COM REINFORCEMENT LEARNING

PARTE I

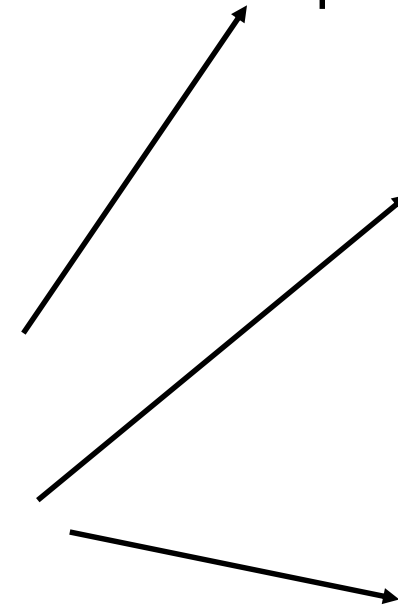
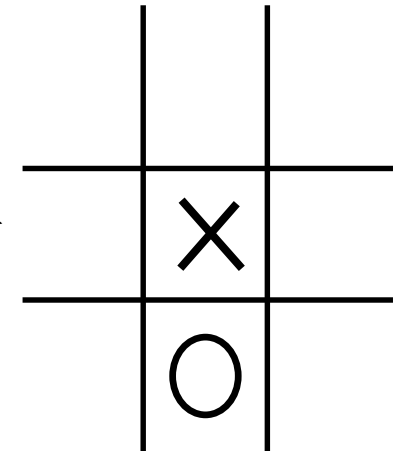
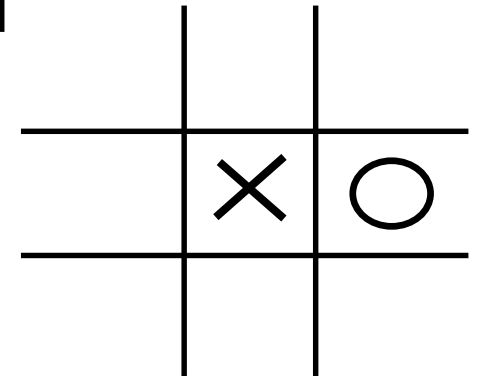
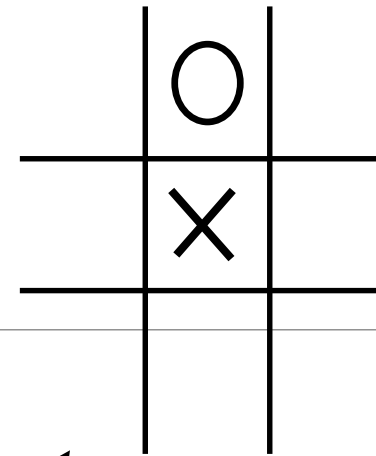
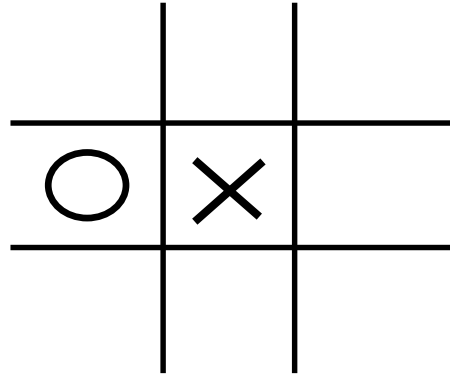
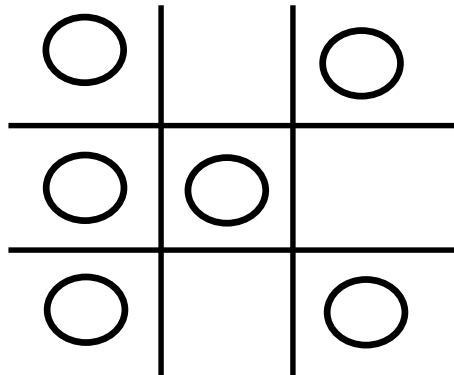
Prof. Fernando Amaral – Todos os Direitos Reservados

Tic Tac Toe

➤ Estados: $3^9 = 19,683$ <- posições ilegais

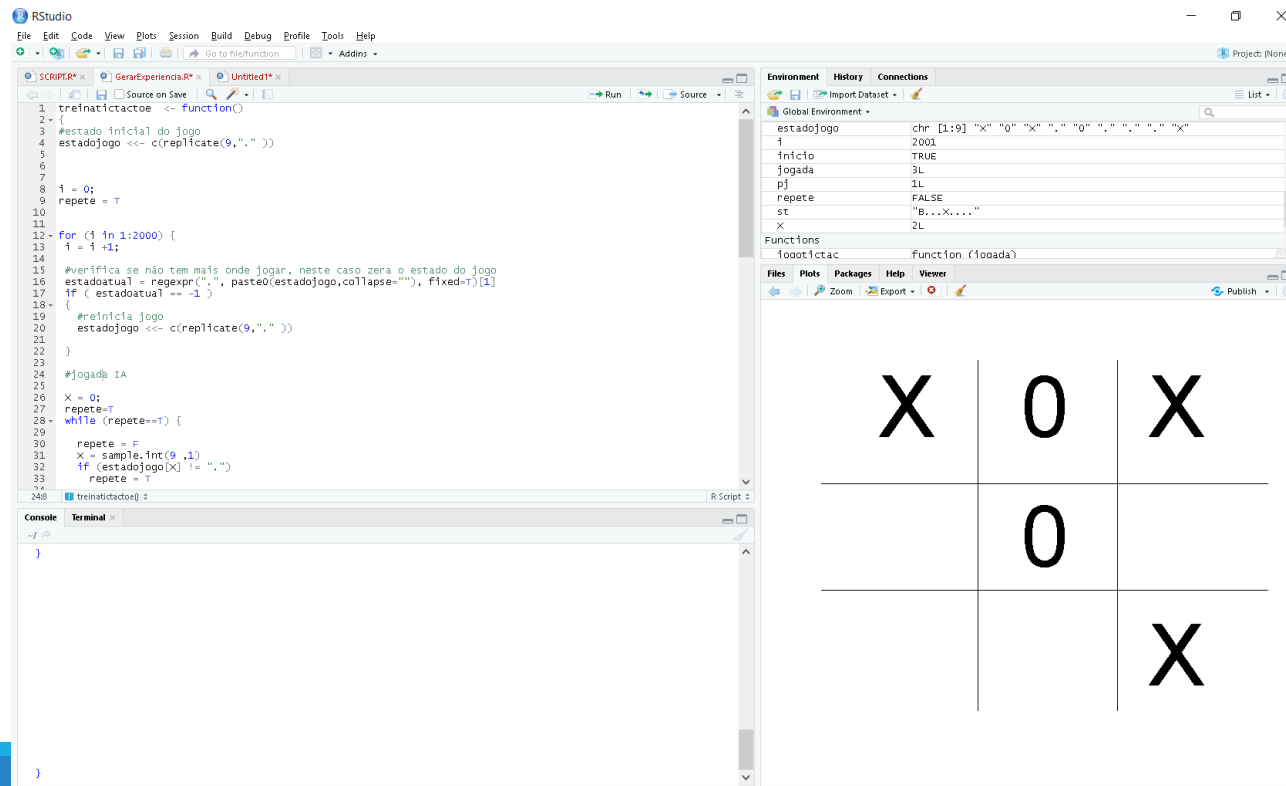
➤ 5,478 <- posições legais

➤ 765 <- rotação e reflexão



Objetivo

- Criar aplicação no R para jogar TTT contra um agente de IA
- O agente vai utilizar Polices de um modelo criado com Reinforcement Learning

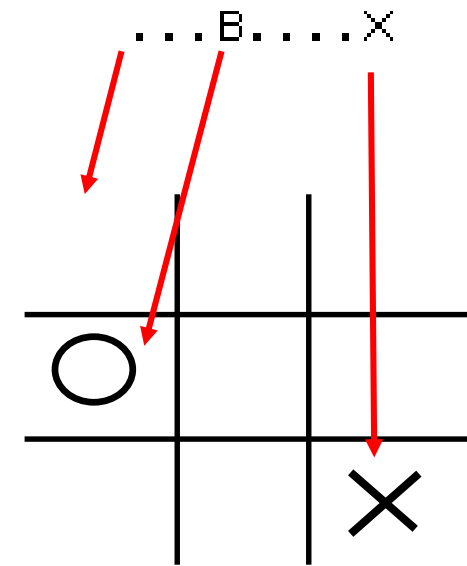


Pacote ReinforcementLearning

➤Tictactoe (406541)

(tictactoe)

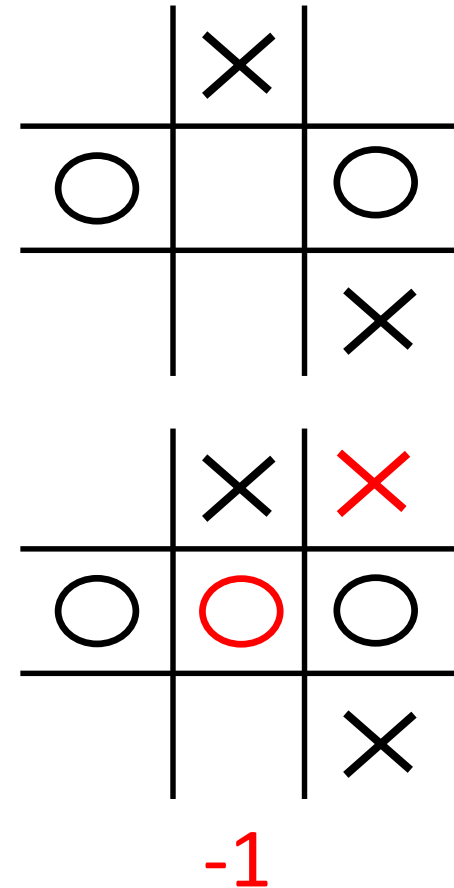
State	Action	NextState	Reward
.....	c9	...B....X	0
...B....X	c2	.X.B.B..X	0
.X.B.B..X	c3	.XXBBB..X	-1
.....	c8	.B.....X.	0
.B.....X.	c7	.BB...XX.	0
.BB...XX.	c9	.BB...XXX	1



Pacote ReinforcementLearning

(tictactoe)

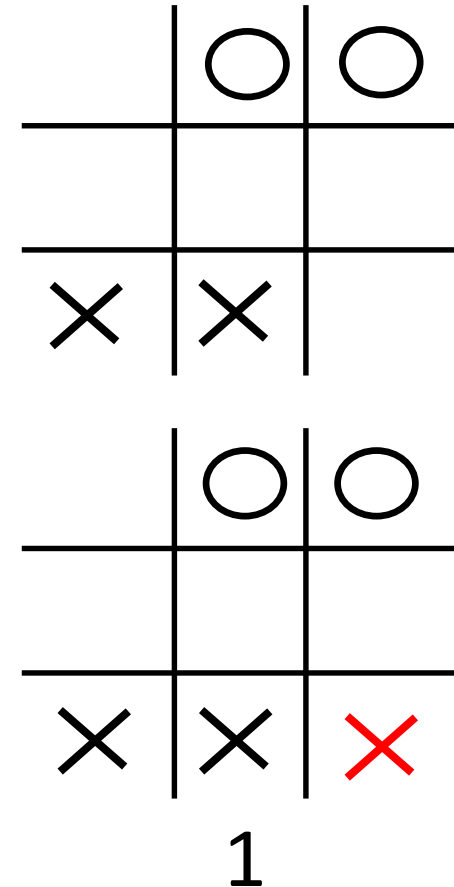
State	Action	NextState	Reward
.....	c9	...B....X	0
...B....X	c2	.X.B.B..X	0
.X.B.B..X	c3	.XXBBB..X	-1
.....	c8	.B.....X.	0
.B.....X.	c7	.BB...XX.	0
.BB...XX.	c9	.BB...XXX	1



Pacote ReinforcementLearning

(tictactoe)

State	Action	NextState	Reward
.....	c9	...B....X	0
...B....X	c2	.X.B.B..X	0
.X.B.B..X	c3	.XXBBBB..X	-1
.....	c8	.B....X.	0
.B....X.	c7	.BB...XX.	0
<u>.BB...XX.</u>	<u>c9</u>	<u>.BB...XXX</u>	<u>1</u>



Modelo – Opção 1: Criar modelo

```
install.packages("ReinforcementLearning")
```

```
library(ReinforcementLearning)
```

```
control <- list(alpha = 0.2, gamma = 0.4, epsilon = 0.1)
```

```
modelottt <- ReinforcementLearning(tictactoe, s = "State", a = "Action", r = "Reward",  
                                   s_new = "NextState", iter = 2, control = control)
```



Modelo – Opção 2: Carregar Modelo

➤ Arquivo modelottt no material do curso

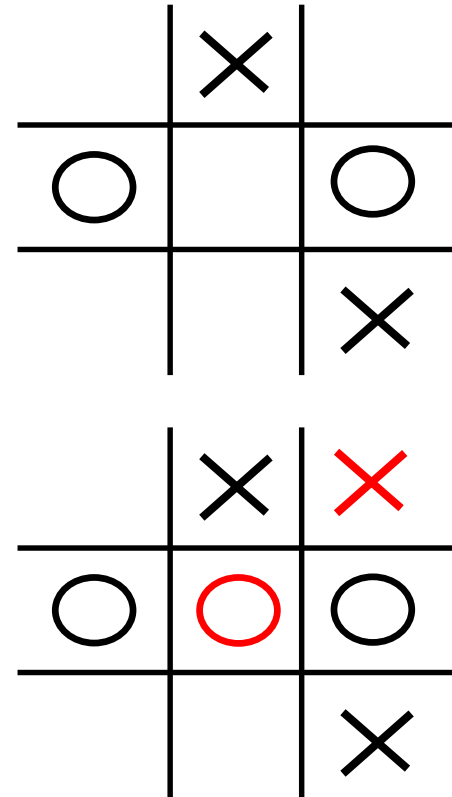
```
load(file.choose())
```



Consultado o Modelo

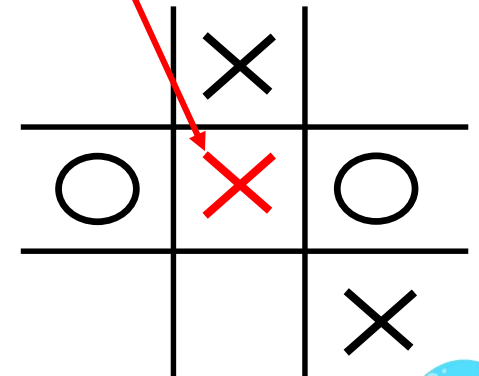
```
> tail(tictactoe)
```

	State	Action	NextState	Reward
406536	c9	...B....X	0
406537	...B....X	c2	.X.B.B..X	0
406538	<u>.X.B.B..X</u>	c3	<u>.XXBBB..X</u>	-1
406539	c8	.B....X.	0
406540	.B....X.	c7	.BB...XX.	0
406541	.BB...XX.	c9	.BB...XXX	1



-1

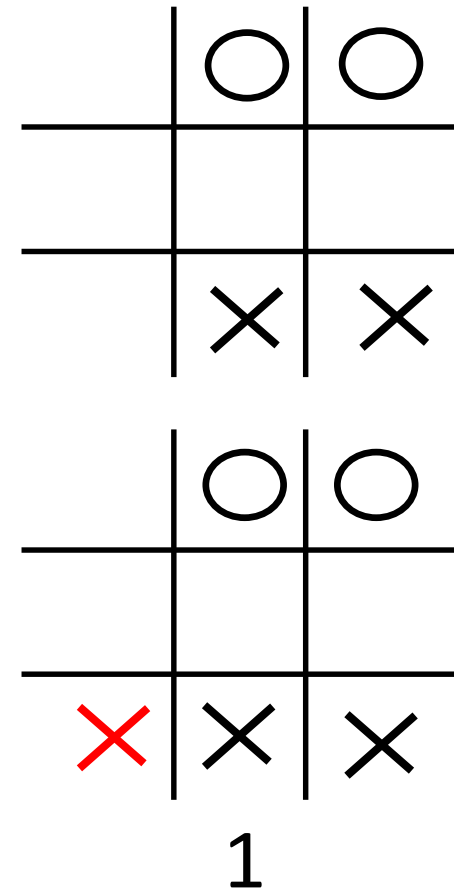
```
> modelottt$Policy[".X.B.B..X"]  
.X.B.B..X  
"c5"
```



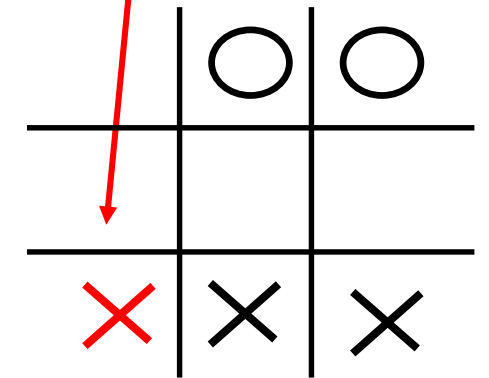
Consultado o Modelo

```
> tail(tictactoe)
```

	State	Action	NextState	Reward
406536	c9	...B....X	0
406537	...B....X	c2	.X.B.B..X	0
406538	.X.B.B..X	c3	.XXBBB..X	-1
406539	c8	.B....X.	0
406540	.B....X.	c7	.BB...XX.	0
406541	.BB...XX.	c9	.BB...XXX	1



```
> modelottt$Policy[".BB...XX."]  
.BB...XX.  
"c9"
```



Consultado o Modelo: Possibilidades

➤ Encontrar politica

```
> modelottt$Policy[".BB...XX."]  
.BB...XX.  
"c9"
```

➤ Encontrar uma politica e ela ser ilegal

```
> modelottt$Policy["XBxBBXX.B"]  
XBxBBXX.B  
"c1"
```

➤ Não encontrar uma politica

```
> modelottt$Policy[".X.B....."]  
<NA>  
NA
```

