

Aprendizado por Reforço

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HEKIMA

Big Data Analytics As a Service

THIAGO CARDOSO

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Bacharel e Mestre em
Ciência da Computação

CTO & Co-founder

@ hekima



Soluções customizadas de Big Data Analytics

HEKIMA

A Hekima é uma empresa de
*Big Data e Inteligência
Artificial.*

Simplificamos a complexidade
das aplicações de Big Data em
soluções ready to use.



GREAT
PLACE
TO
WORK®



eNDEAVOR
PROMESSAS

AWARDS
PARTNERS
COMMUNITIES

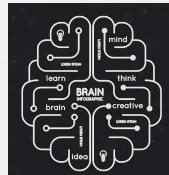
San Pedro
valley

FIR CAPITAL

amazon
webservices | Partner Network
TECHNOLOGY PARTNER

U
Udemy

[Curso Data Science](#)



[Hekima developers blog](#)

BIG DATA
BUSINESS
BY HEKIMA

[Big Data Business](#)

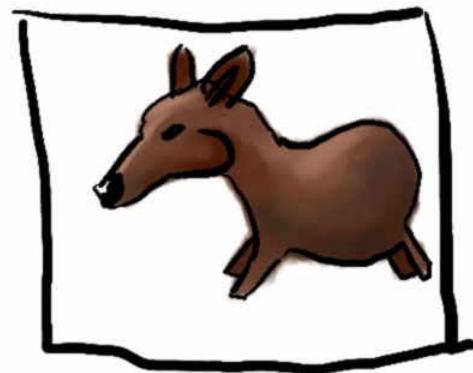
Alguns problemas são difíceis de serem
traduzidos em programas



CARRO

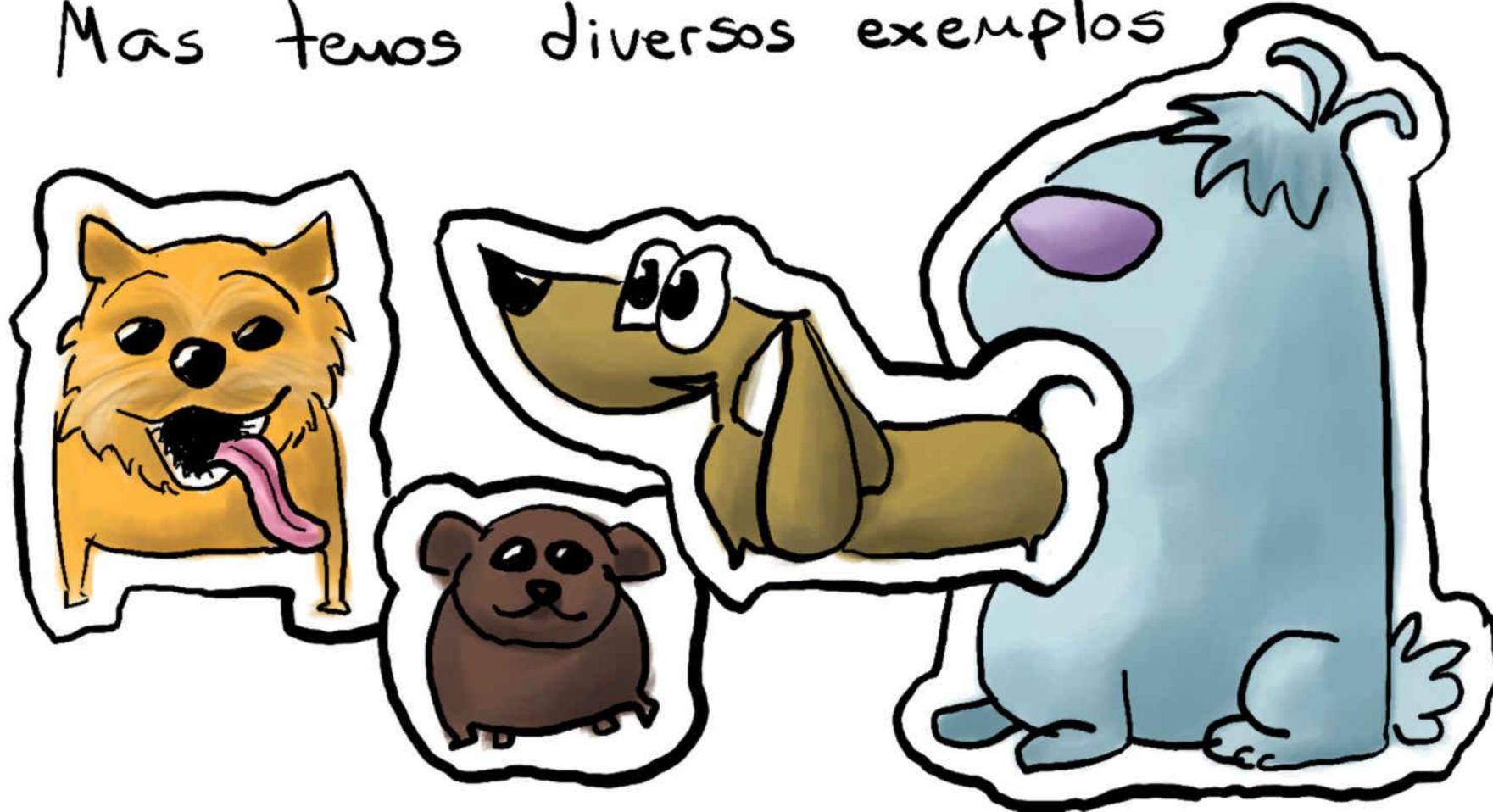


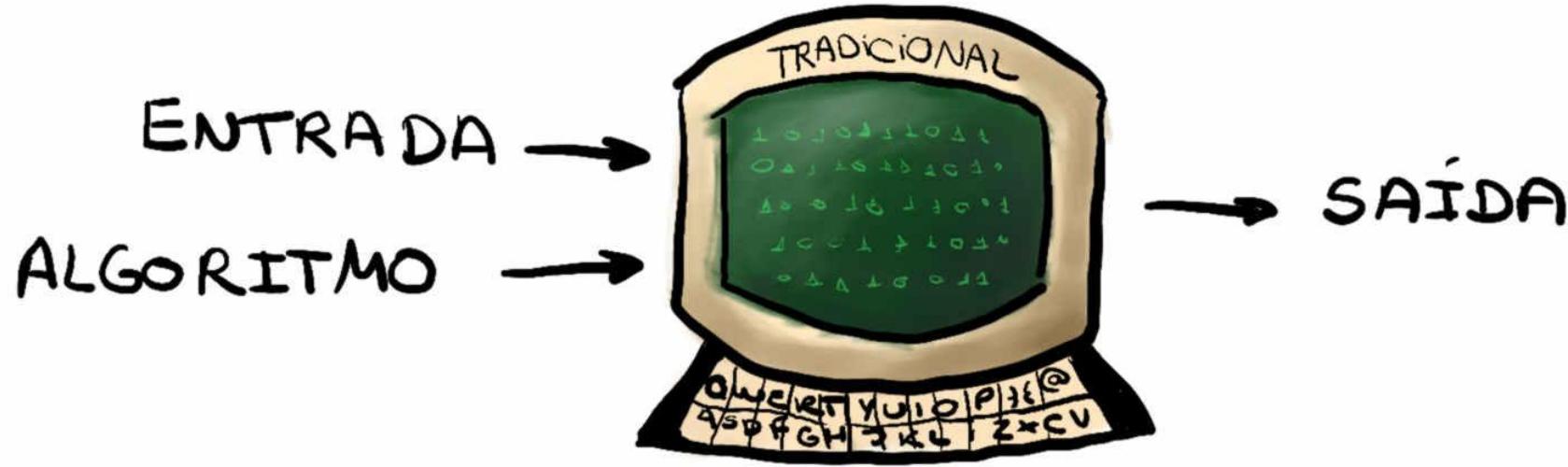
AVIÃO

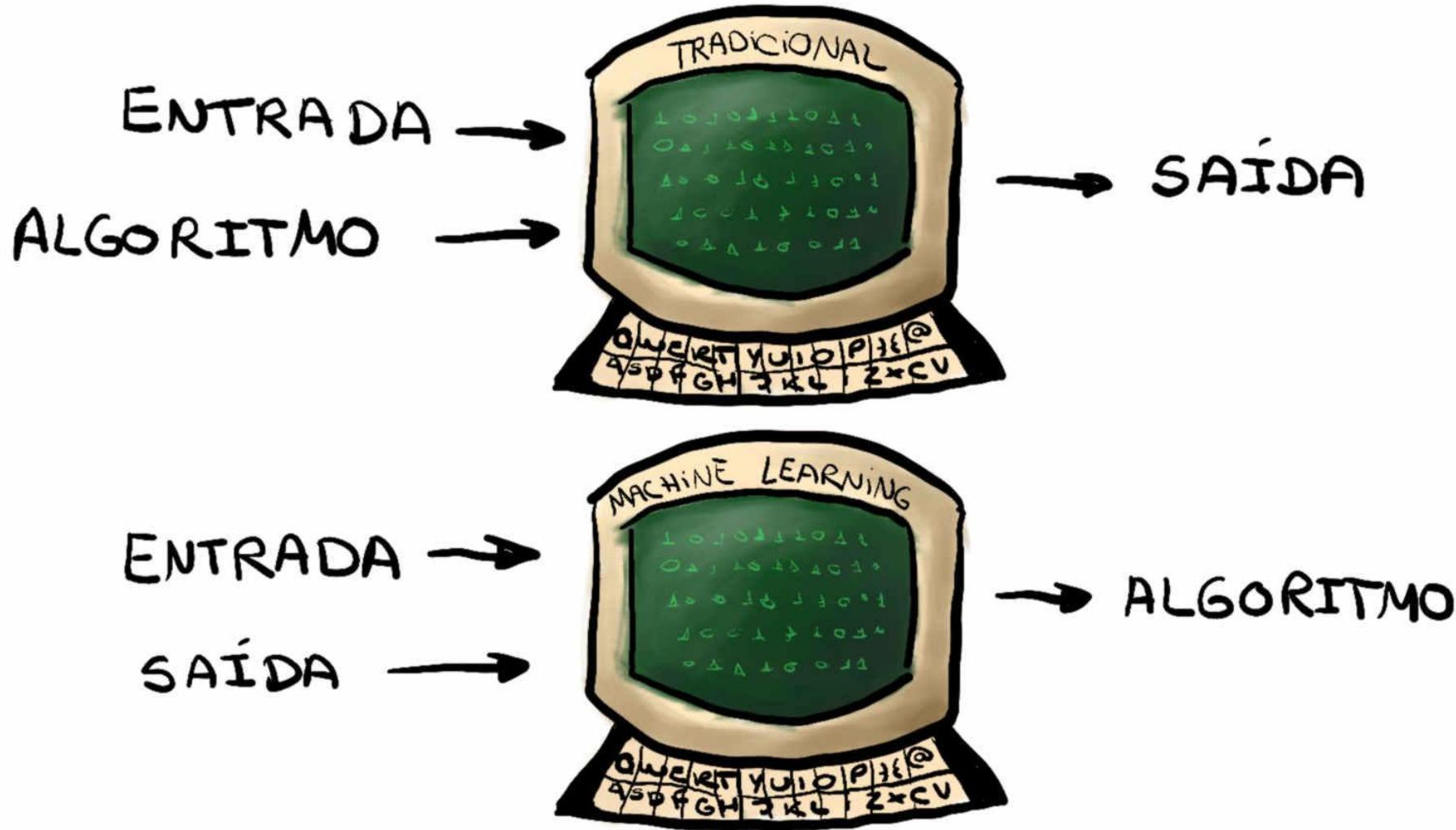


CACHORRO

Mas tenos diversos ejemplos







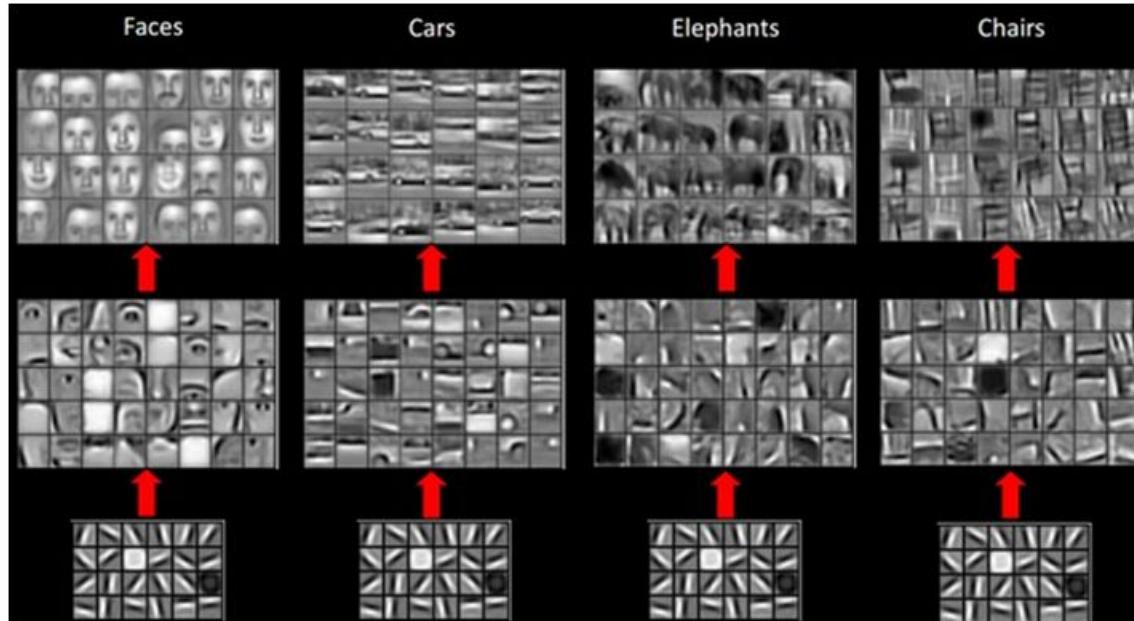
“

Big Data is
not actually
about the
DATA



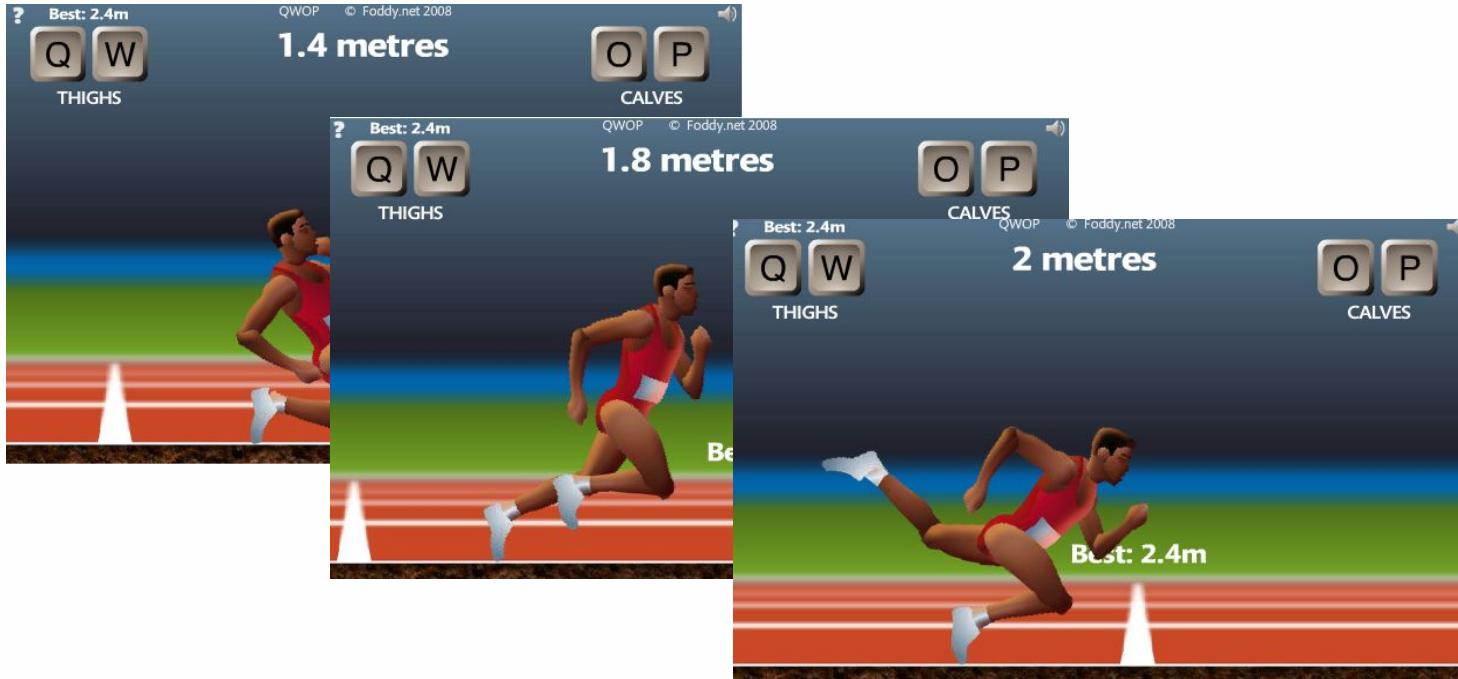
Gary King. Director Inst. for Quantitative Social
Science de Harvard

Big Data nos permite aprender modelos



COMPLEXOS

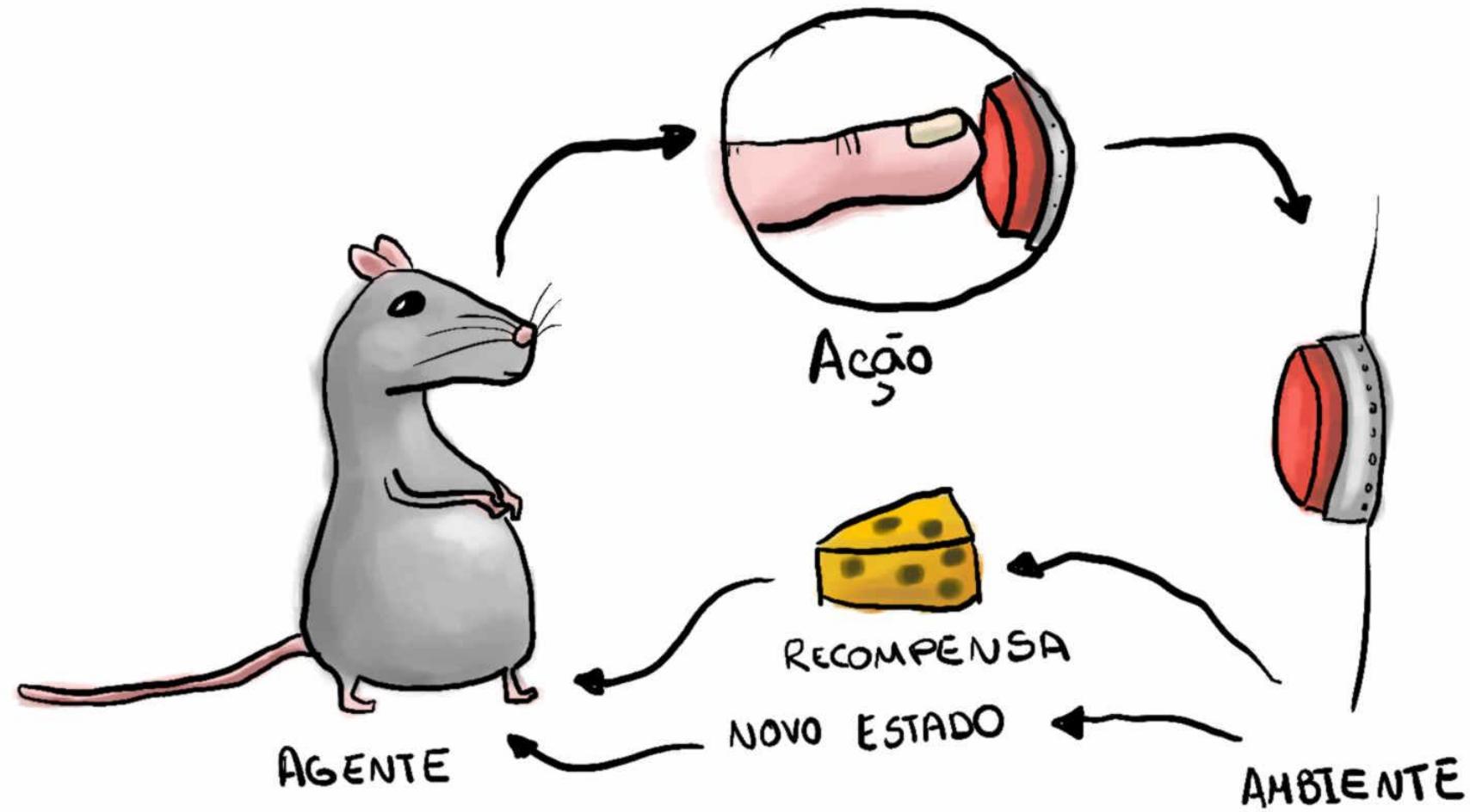
Em algumas aplicações temos grandes quantidades de dados sem ocupar GBs



Reinforcement

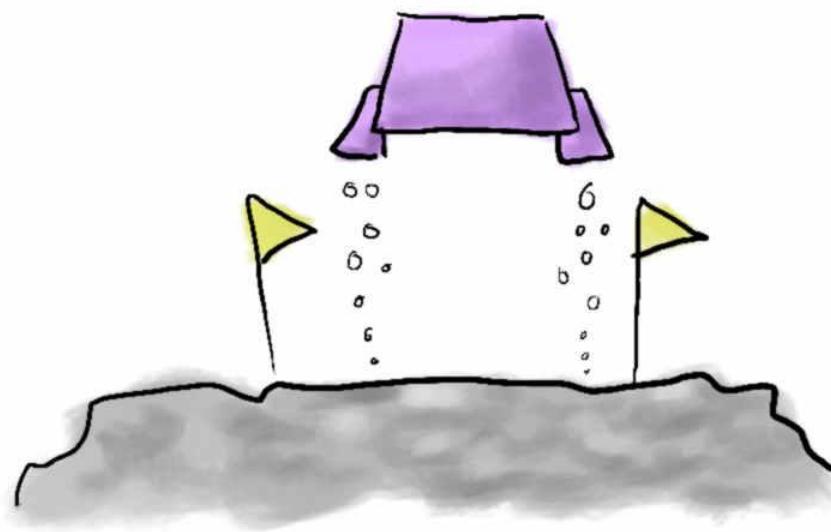


Learning



Alguns problemas de exemplo:

LUNAR LANDER



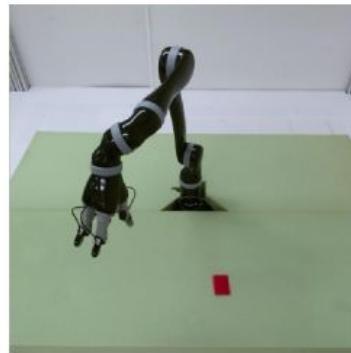
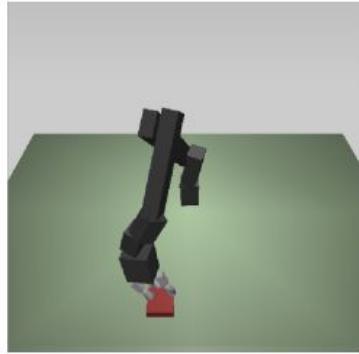
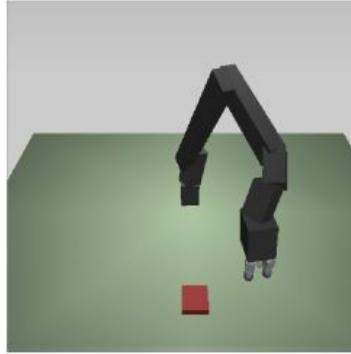
CARTPOLE

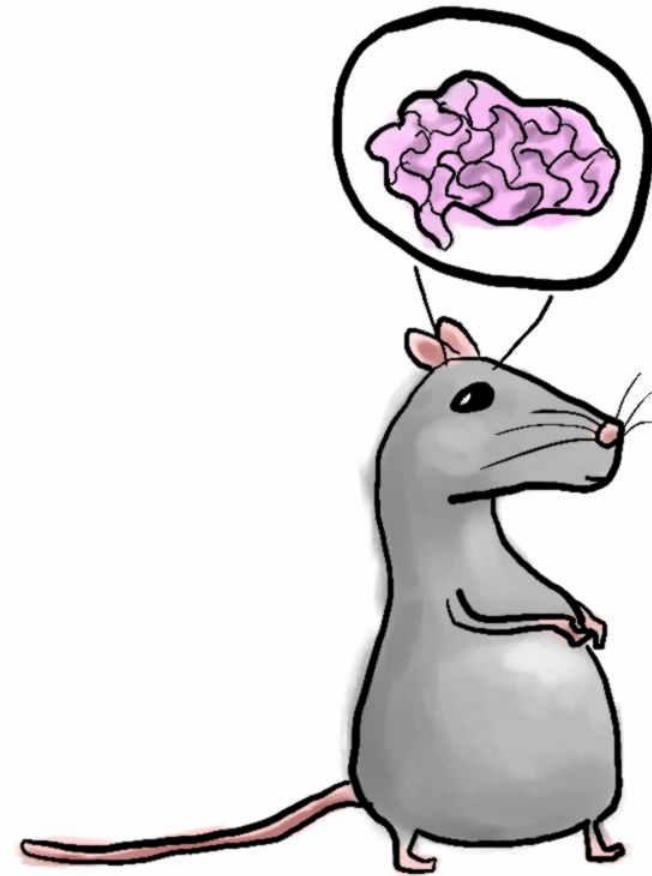




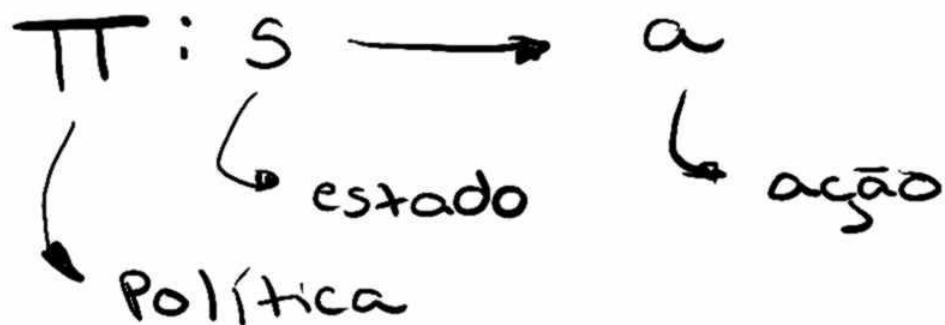
I KNOW
KUNG FU

sim-to-Real Robot
Learning from Pixels
with Progressive Nets





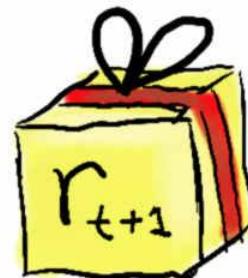
Qual ação devo escolher
no atual estado





VOU EXECUTAR A AÇÃO
QUE IRÁ ME EMPURRAR
PARA FRENTE !

valor
esperado
ação t =



Valor esperado da ação t =



$$r_{t+1} + r_{t+2} + r_{t+3} + r_{t+4} + r_{t+5} + \dots$$

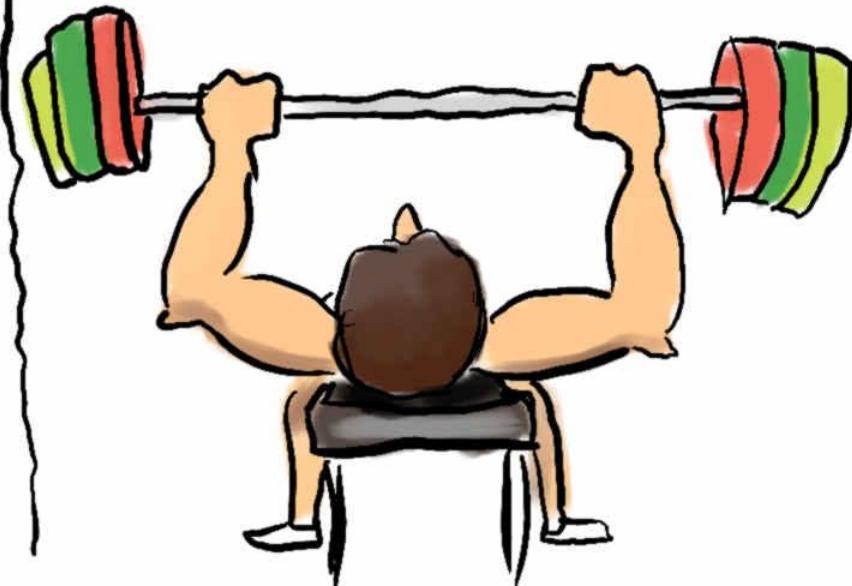
Parecido com a vida:

- TEMPO
- INTERAÇÃO
- RECOMPENSA
- Exploração

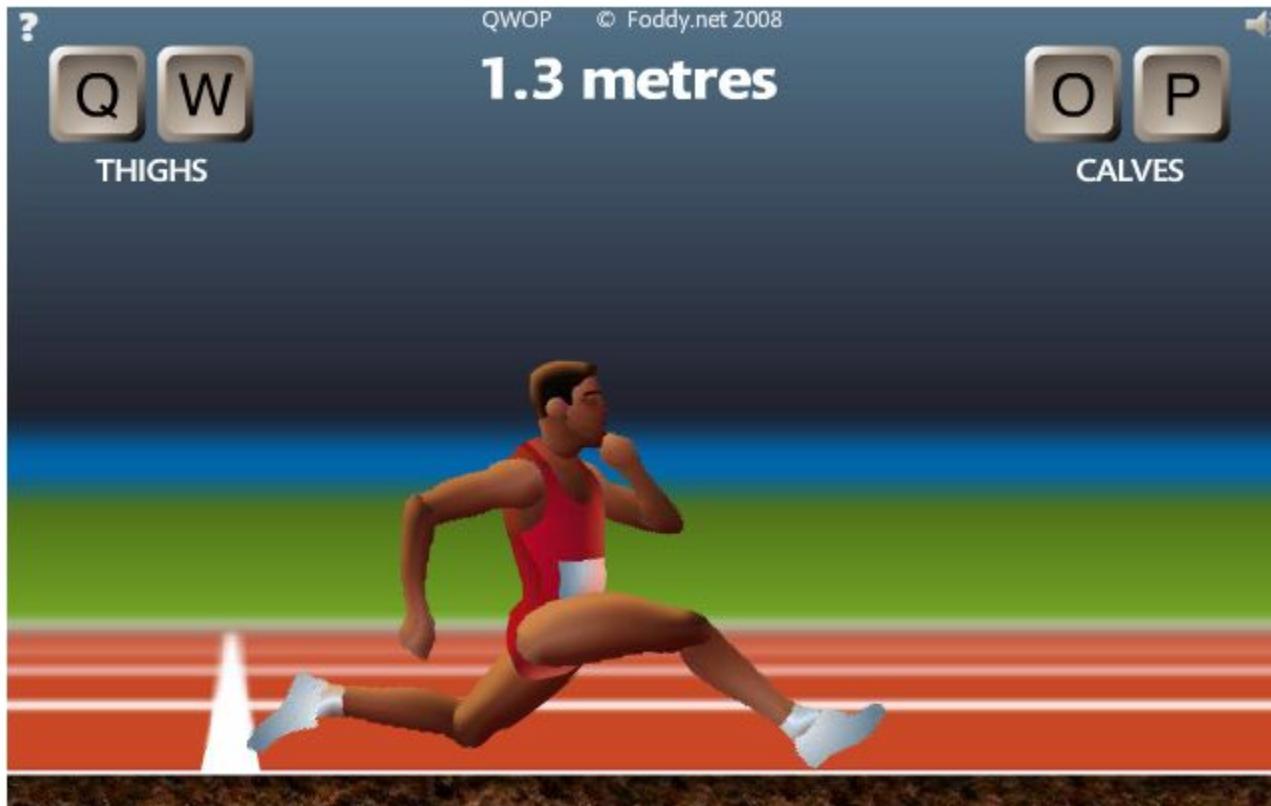
E até os mesmos dilemas:

RECOMPENSA DE
CURTO PRAZO

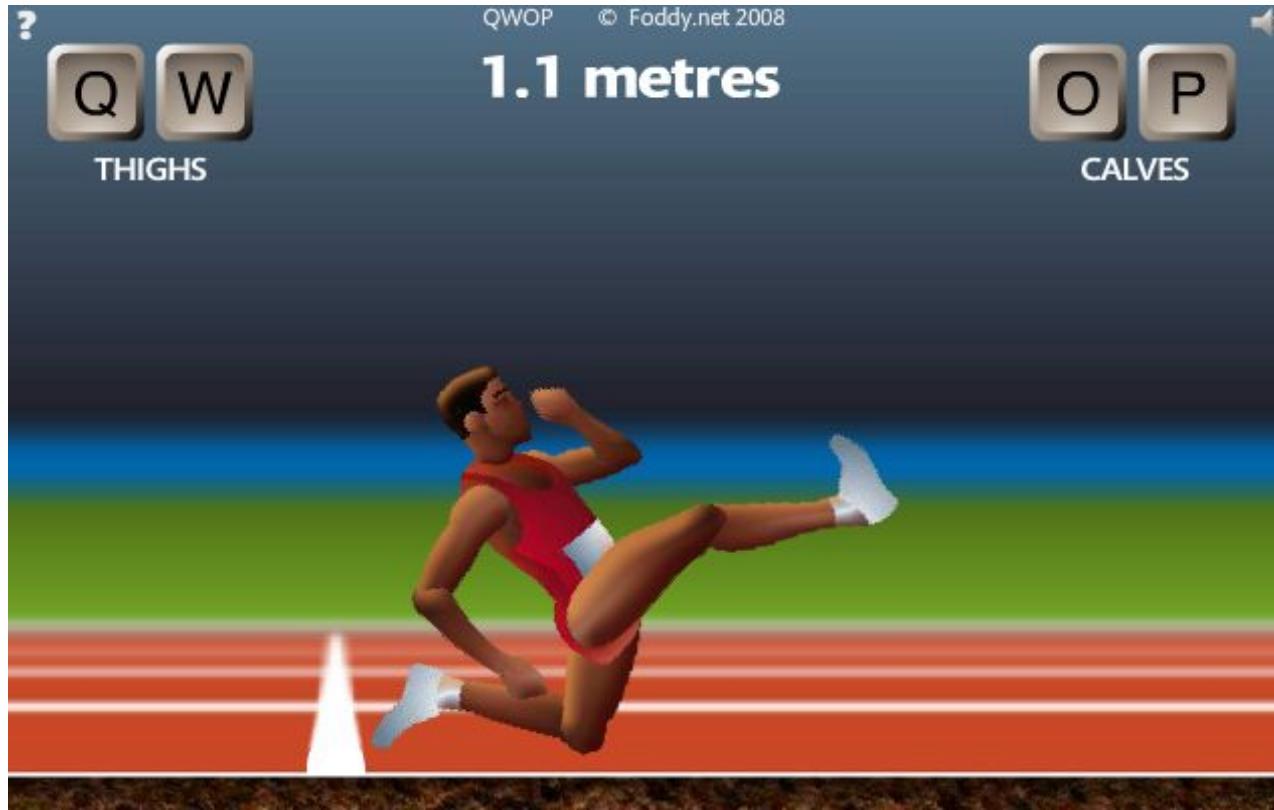
RECOMPENSA DE
LONGO PRAZO



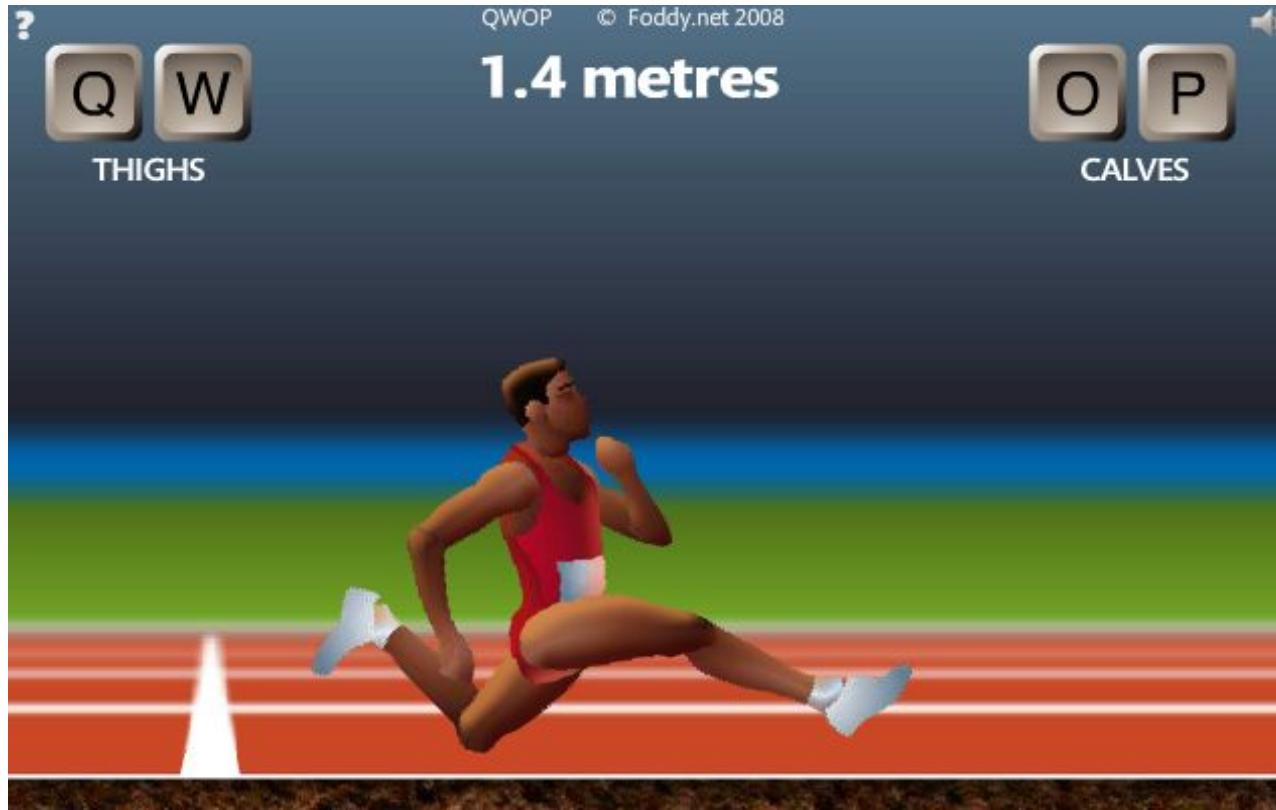
EXPLORATION VS EXPLOITATION



EXPLORATION VS EXPLOITATION



EXPLORATION VS EXPLOITATION



Como usar RL em
problemas reais ?



DeepMind

- Diversos sensores espalhados pelo data center
- IA controla 120 variáveis (ex. cooler)
- 40% de redução nos custos de arrefecimento



AlphaGo vs Lee Se-dol

Google's AlphaGo AI beats Lee Se-dol again to win Go series 4-1

By [Sam Byford](#) on March 15, 2016 05:00 am [Email](#) [@345triangle](#)



THE LATEST HEADLINES



Sigur Rós are streaming a drive around



Finding Dory for biggest d opening for film



Eli Roth is di Death Wish starring Bru

Stanford Autonomous Helicopter



Stationary MakeAGIF.com

Stanford Autonomous Helicopter



Stationary Blinc
MakeAGIF.com

Stanford Autonomous Helicopter



Stationary Blinc
MakeAGIF.com

Stanford Autonomous Helicopter



Stationary Eline
MakeAGIF.com

Stanford Autonomous Helicopter



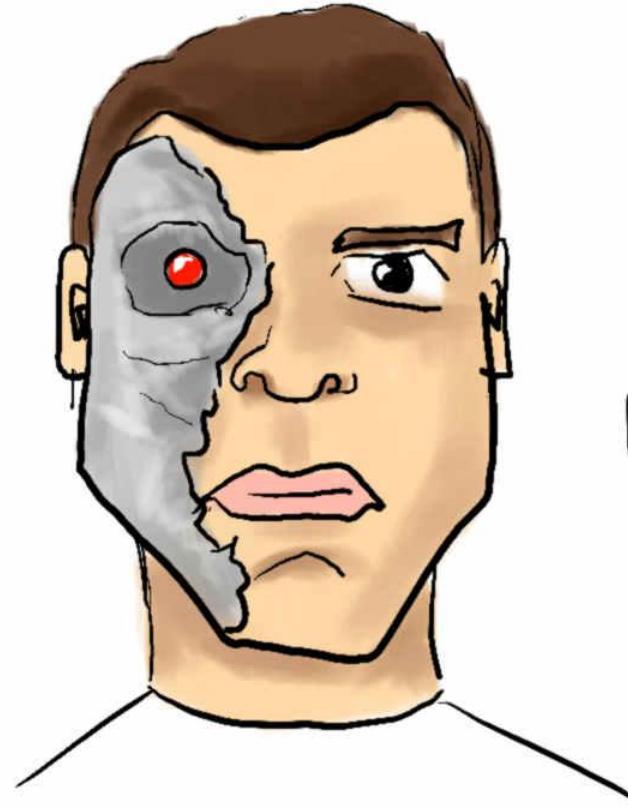
- CONTROLE DE TRÁFEGO AÉREO
- CONTROLE DE MOTORES E REATORES
- INTERFACE CÉREBRO - MÁQUINA
- ASSET MANAGEMENT
- ROBÓTICA
- ADMINISTRAÇÃO DE REDE
- ADMINISTRAÇÃO DE RECURSOS

DOMINAR

RASA

A

HUMANA



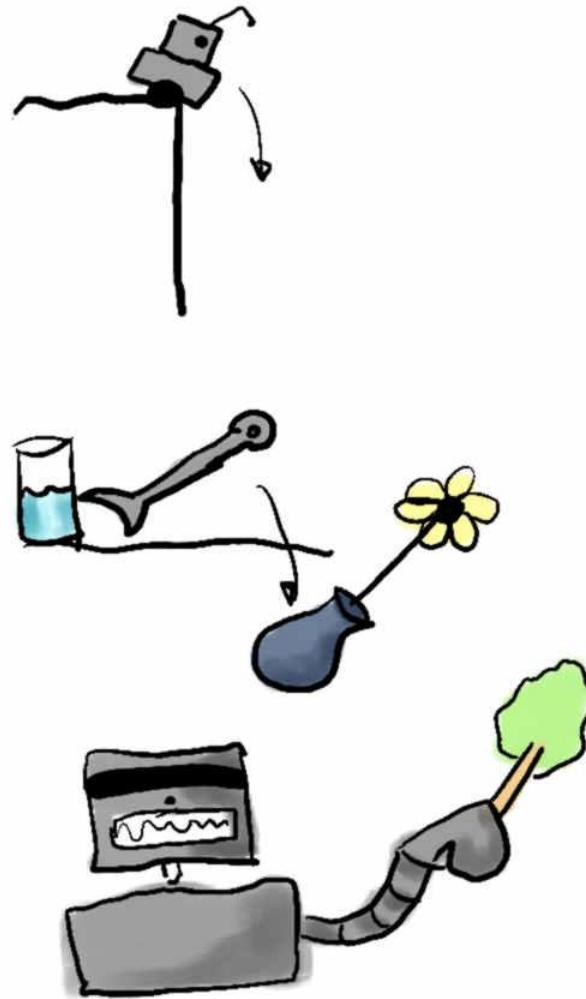
Vai chover, eu preciso de jaqueta?

Não

E de um guarda chuva?

Você gosta de futebol?

- Exploração Segura
- Evitar efeito colateral negativo
- Hacking de recompensa



CONCLUSÕES:

- Alguns problemas podem gerar dados continuamente
- Reinforcement Learning: Agente, Estado, Ação
Recompensa
- Queremos a ação que maximiza todo o
reward futuro
- Diversas oportunidades de pesquisa em
segurança

Obrigado,



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