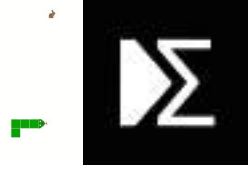


Playing Snake with Q Learning

Paul Mora Sancho

Agenda



1 Q Learning Introduction

2 Q Tables

3 Deep Learning

4 Human vs. Machine

Agenda



1 Q Learning Introduction

2 Q Tables

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Let us consider an example



States

Dressed
Up as...

Observation



Actions

Going
to...

Observation



How do we know what to do when dressed in a certain way?



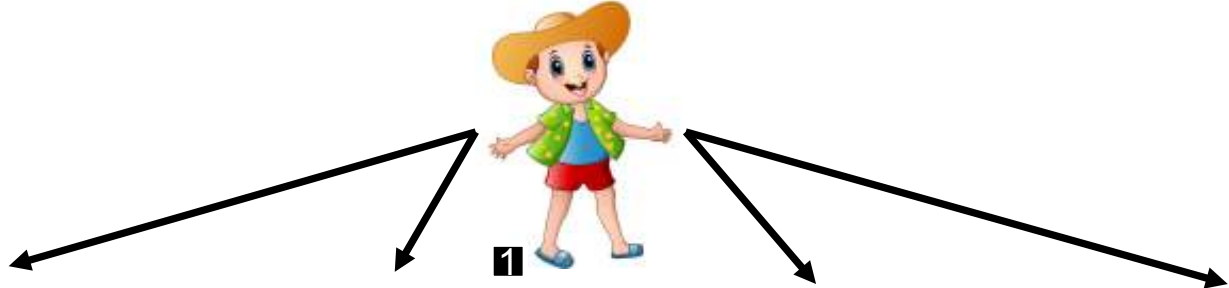
The Oracle predicts our reward for an action

State

Action

Predict

Q Values



Medium

High

Low

Low Medium

Agenda



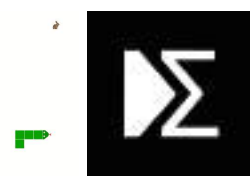
1 Q Learning Introduction

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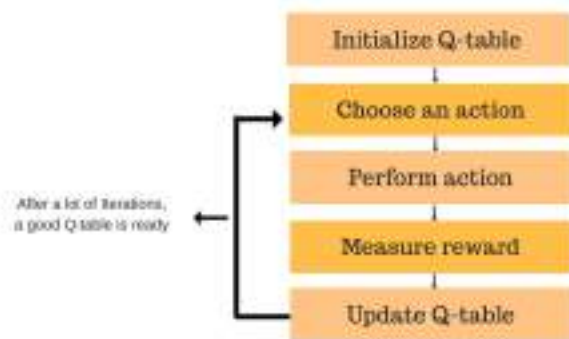
Q Tables



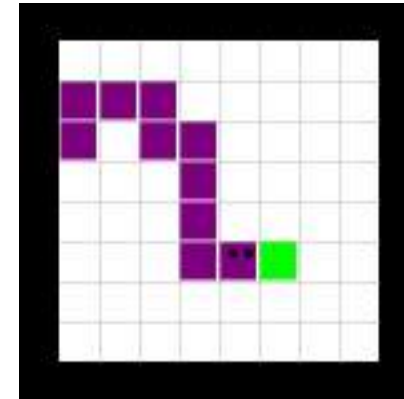
General Information

- **Value based** algorithm in reinforcement learning
- Fancy word for a **lookup table**
- Calculating **maximum future reward**
- **Iterative process**, as Q-Table needs improvement
- Makes use of **Bellman equation**
- **Initial values** of Q-Tables **are zero**, but there are **multiple** approaches → Optimal intrinsic values

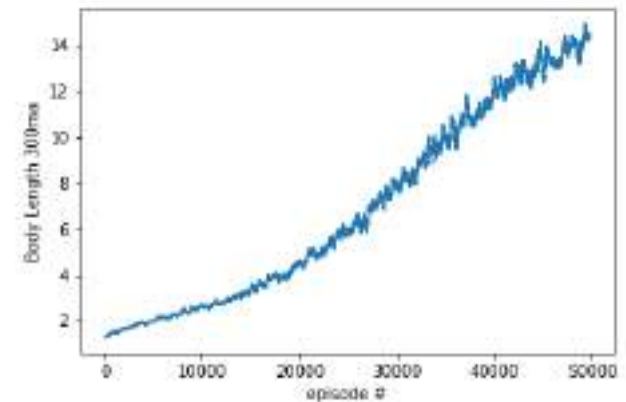
Workings overview



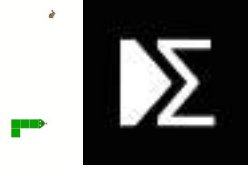
Performance Preview



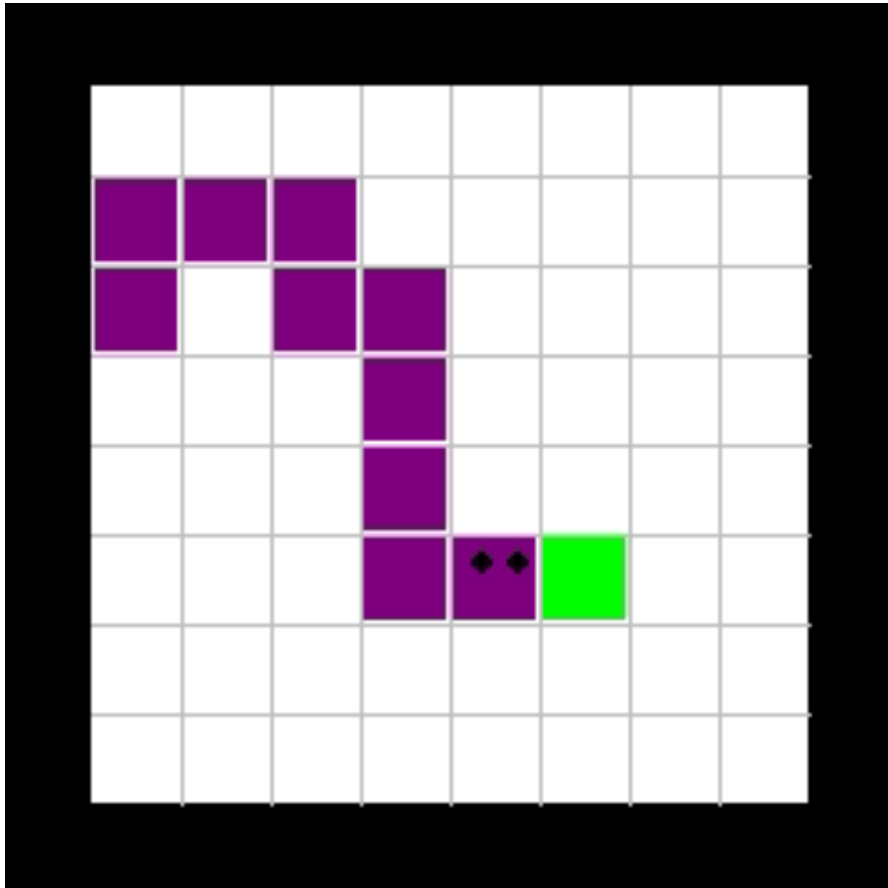
Reward Function



Q Tables - Example

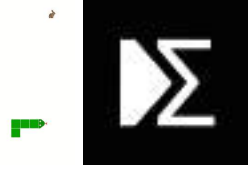


Situation

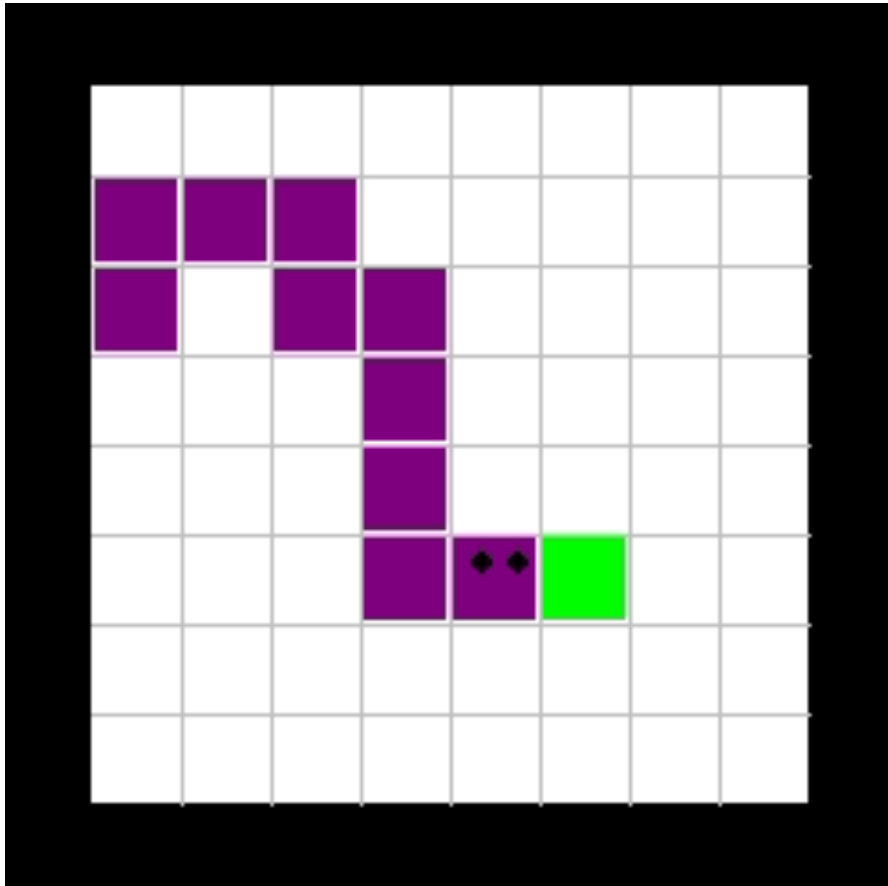


Procedure

Q Tables - Example



Situation



Procedure

Danger Variables				Snack Variables	
Up	Down	Left	Right	Angle	Distance
0	0	1	0	90	1

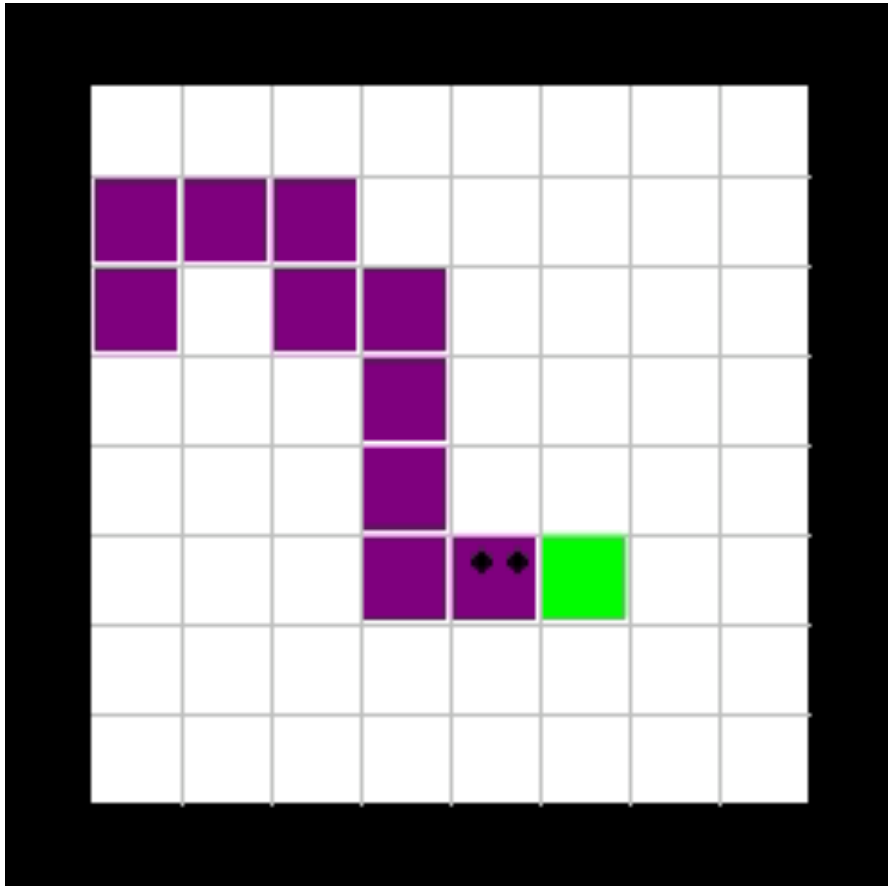
↓ Try different actions given this state

$$Q(s,a) = r + \gamma(\max(Q(s',a')))$$



Q Tables - Example

Situation



Procedure

Danger Variables				Snack Variables	
Up	Down	Left	Right	Angle	Distance
0	0	1	0	90	1

↓ Try different actions given this state

$$Q(s,a) = r + \gamma(\max(Q(s',a')))$$

↓ Calculate Q Values

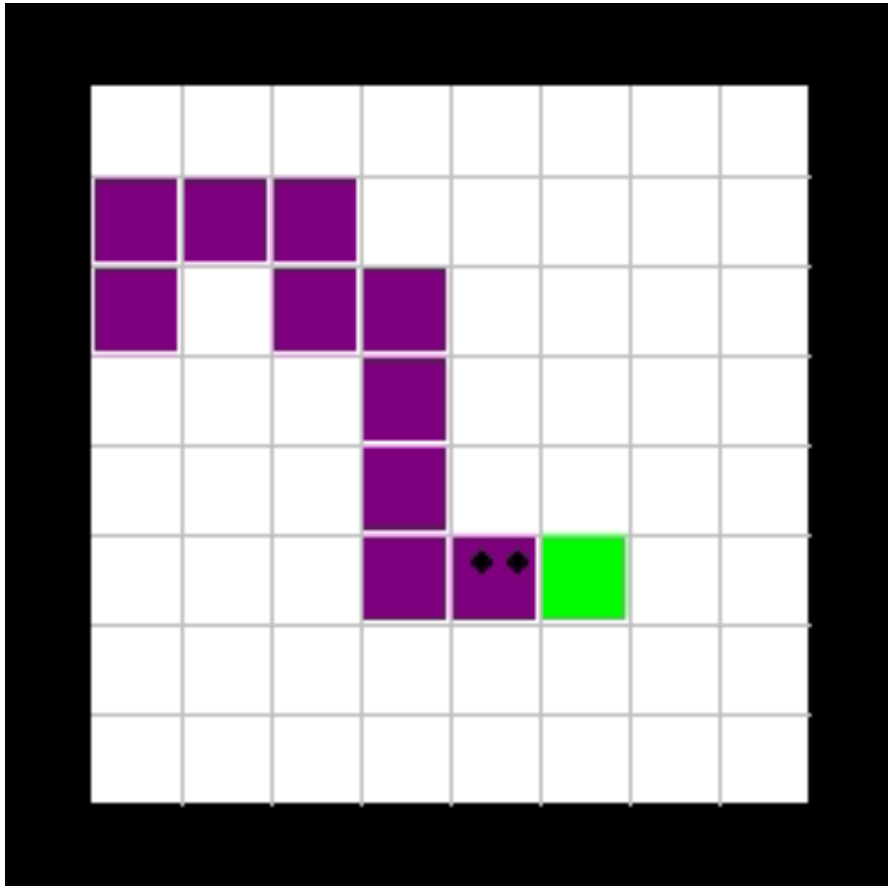
Q Values

Up	Down	Left	Right
0.86201	0.87409	-1	1



Q Tables - Example

Situation



Procedure

Danger Variables				Snack Variables	
Up	Down	Left	Right	Angle	Distance
0	0	1	0	90	1

↓ Try different actions given this state

$$Q(s,a) = r + \gamma(\max(Q(s',a')))$$

↓ Calculate Q Values

Q Values			
Up	Down	Left	Right
0.86201	0.87409	-1	1

↓ Taking the highest Q Value

Right
1

Agenda



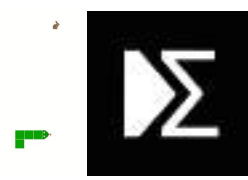
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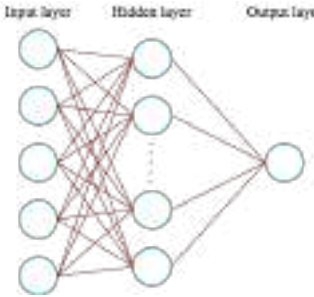
Deep Learning



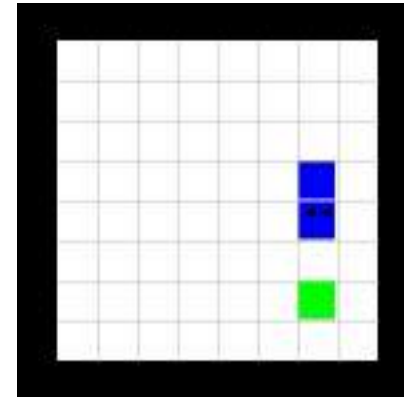
General Information

- **Model based** approach
- Goal is that algorithm **predicts** whether a movement in a certain direction gets the snake **closer to the apple**
- Data is gathered by **purely random movements** in the beginning and then **trains in epochs**
- **Trade-off** between too many variables and state information

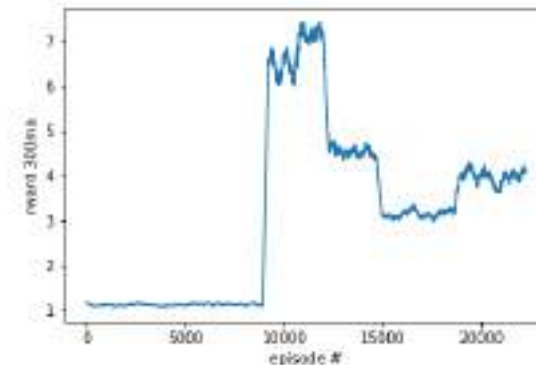
Input & Output Variables

- Danger proximity variables
 - Apple location information
 - Movement
- 
- 1: Getting closer to the apple
 - 0: Getting further from the apple
 - -1: Dying

Performance Preview



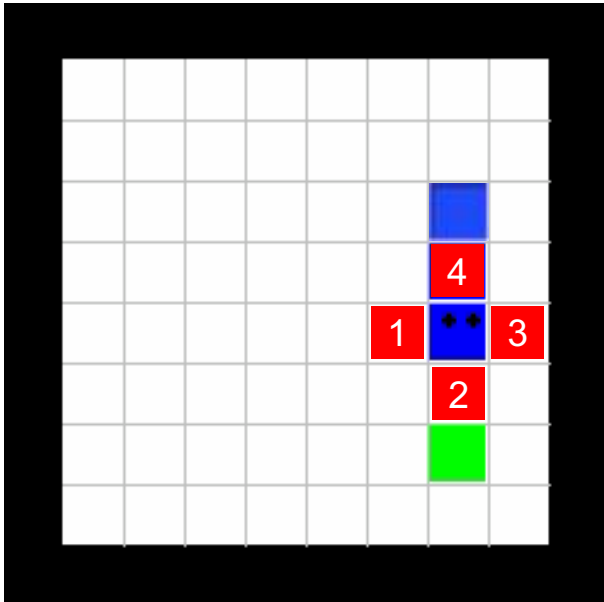
Reward Function





Q Tables - Example

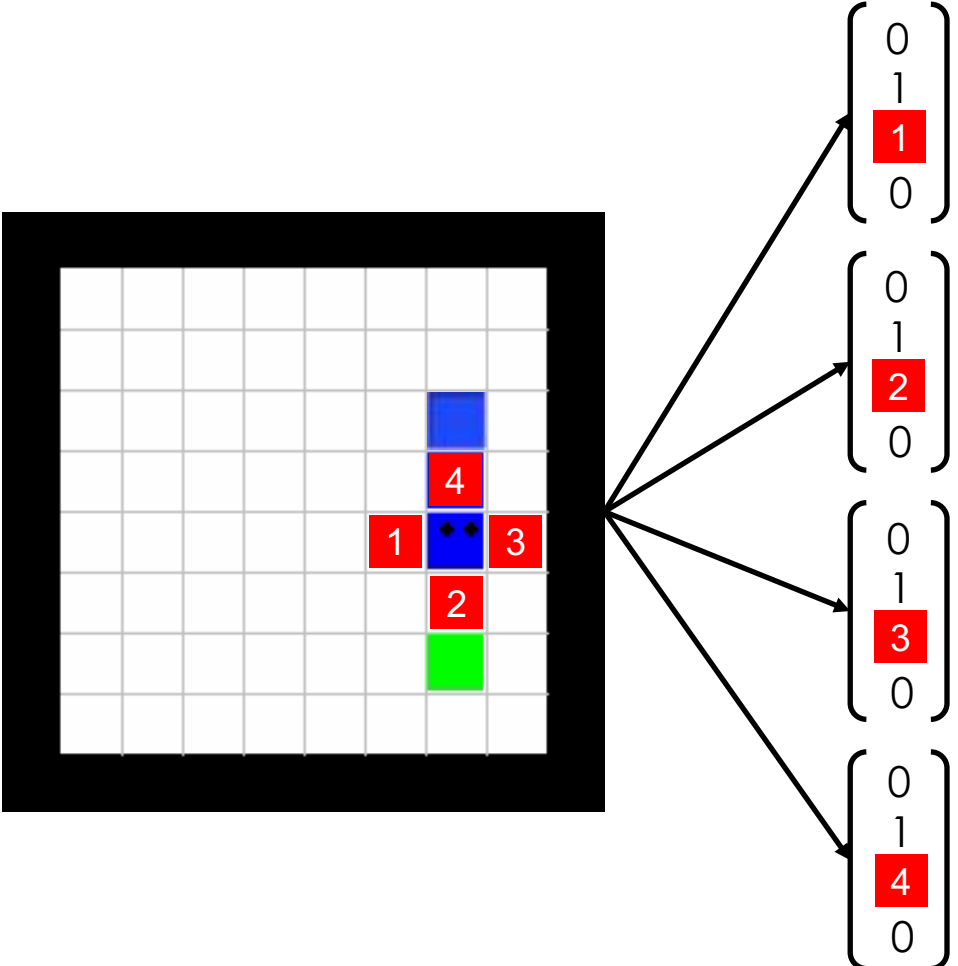
Situation Input of DL Model Output Action





Q Tables - Example

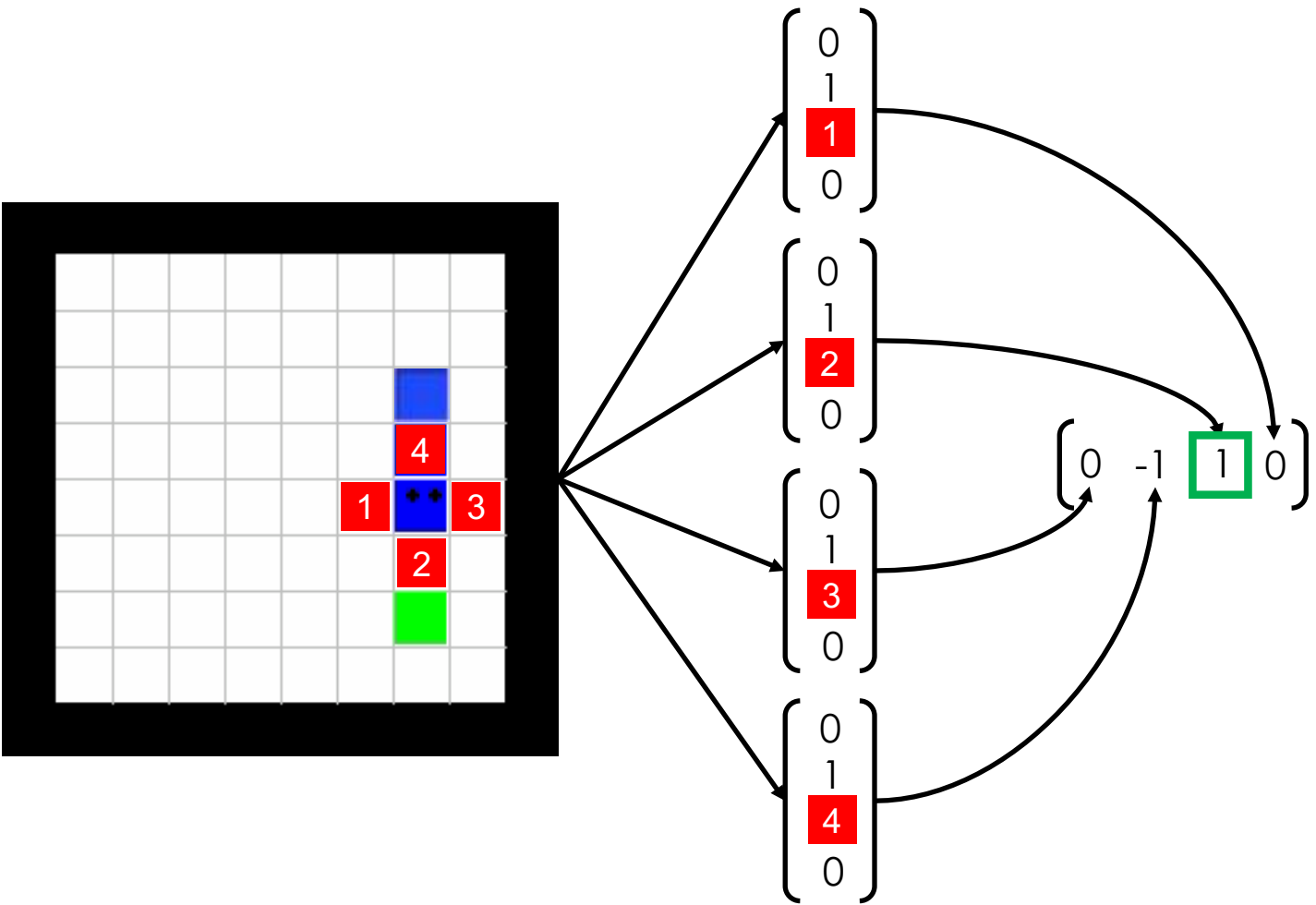
Situation _____ Input of DL Model _____ Output _____ Action _____

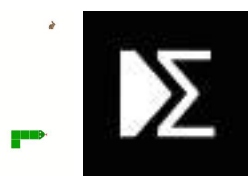




Q Tables - Example

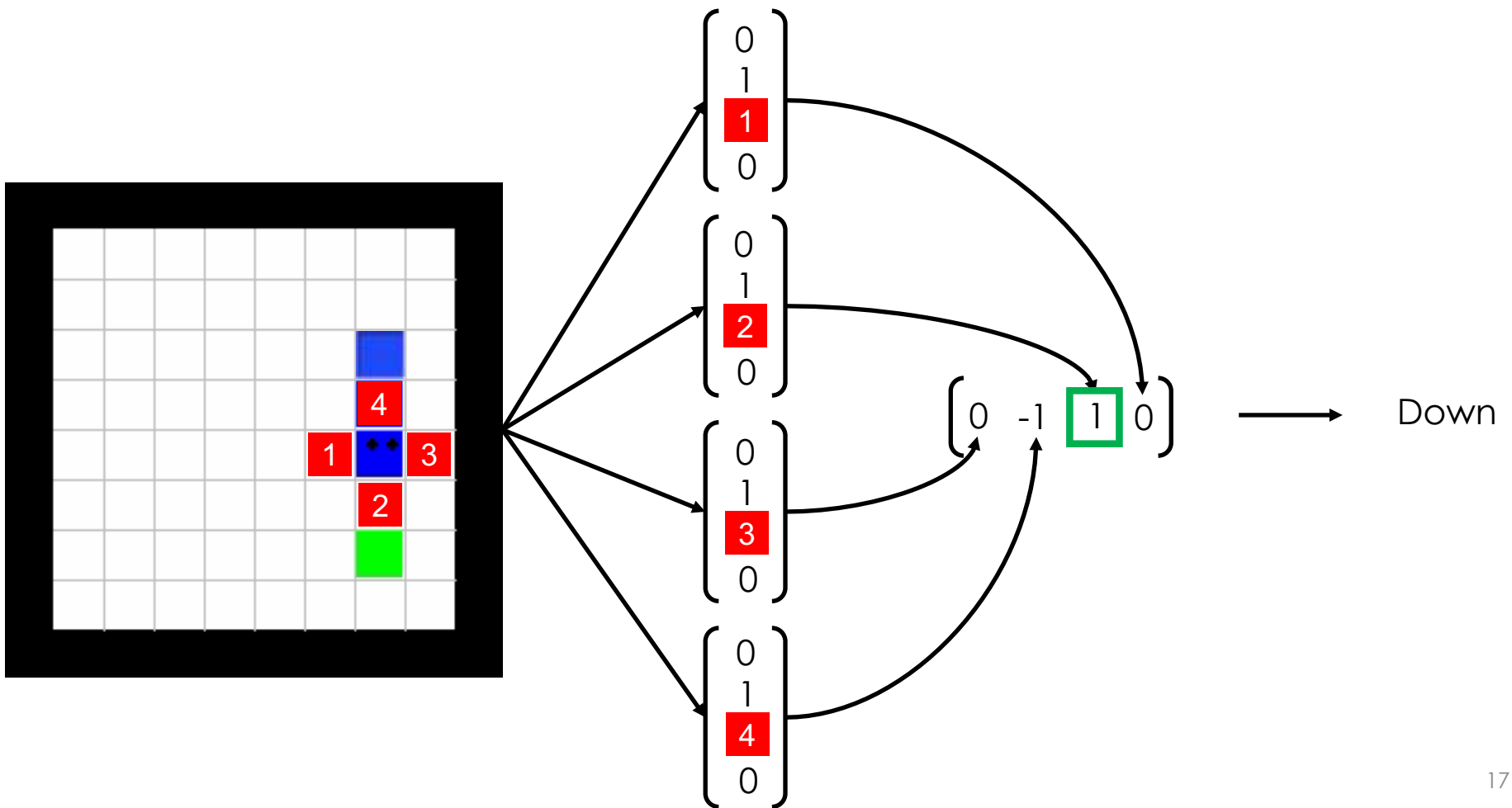
Situation _____ Input of DL Model _____ Output _____ Action _____

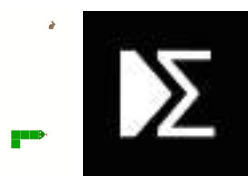




Q Tables - Example

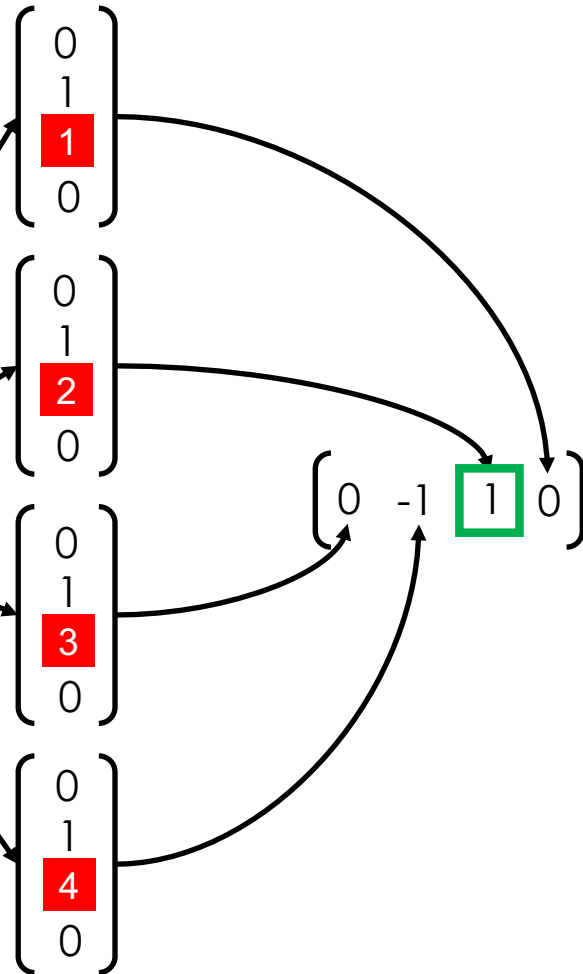
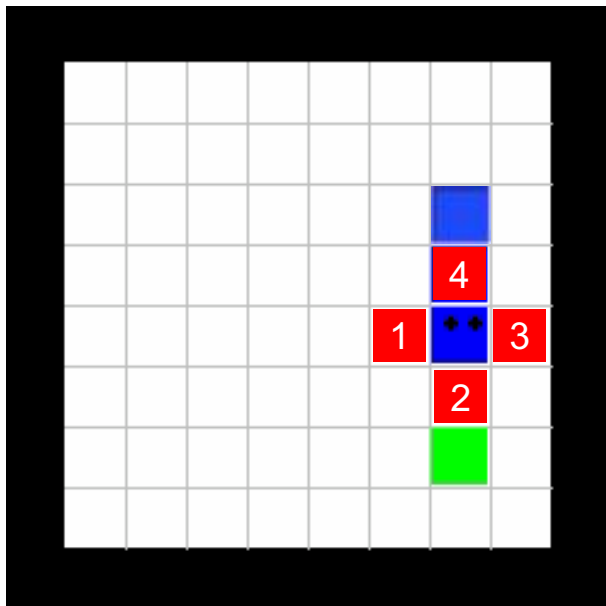
Situation Input of DL Model Output Action





Q Tables - Example

Situation _____ Input of DL Model _____ Output _____ Action _____



→ Down

Agenda



1 Q Learning Introduction

2 Q Tables

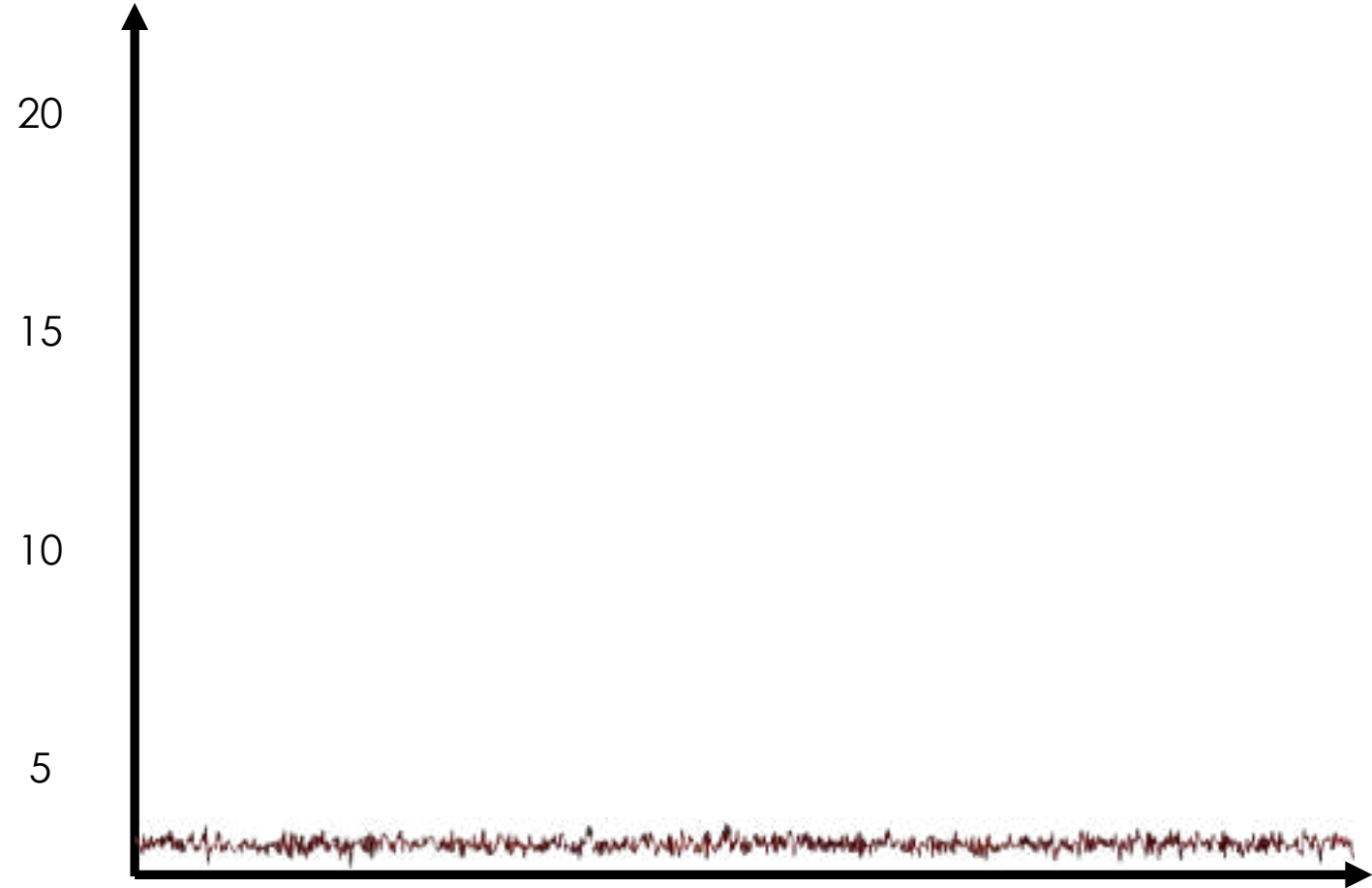
3 Deep Learning

4 Human vs. Machine



The results of the fight human vs. machine

Graphical Representation



Algorithm/ Person

Random Policy

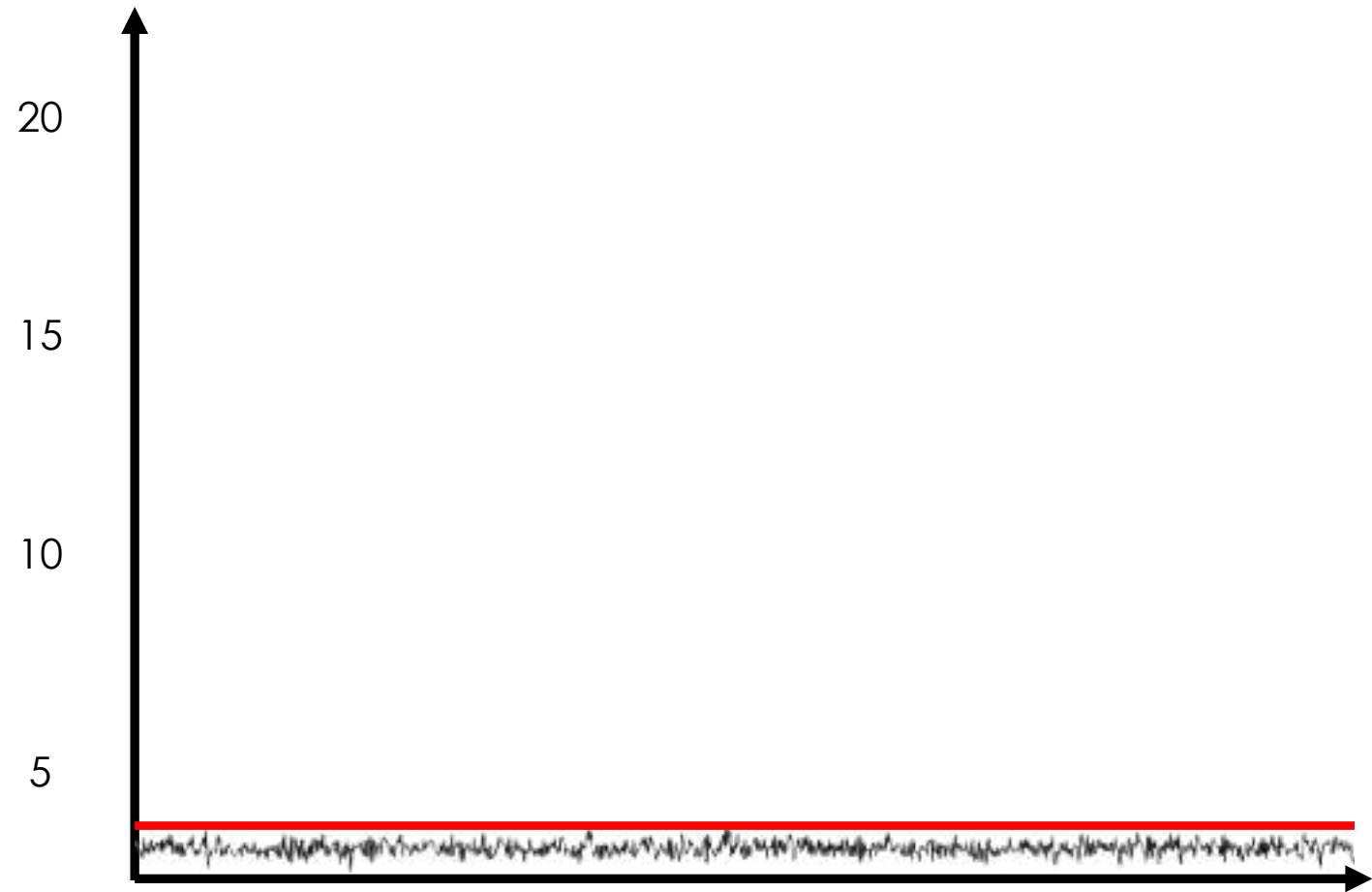
Score

1.5



The results of the fight human vs. machine

Graphical Representation

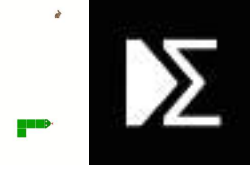


Algorithm/ Person

Samson

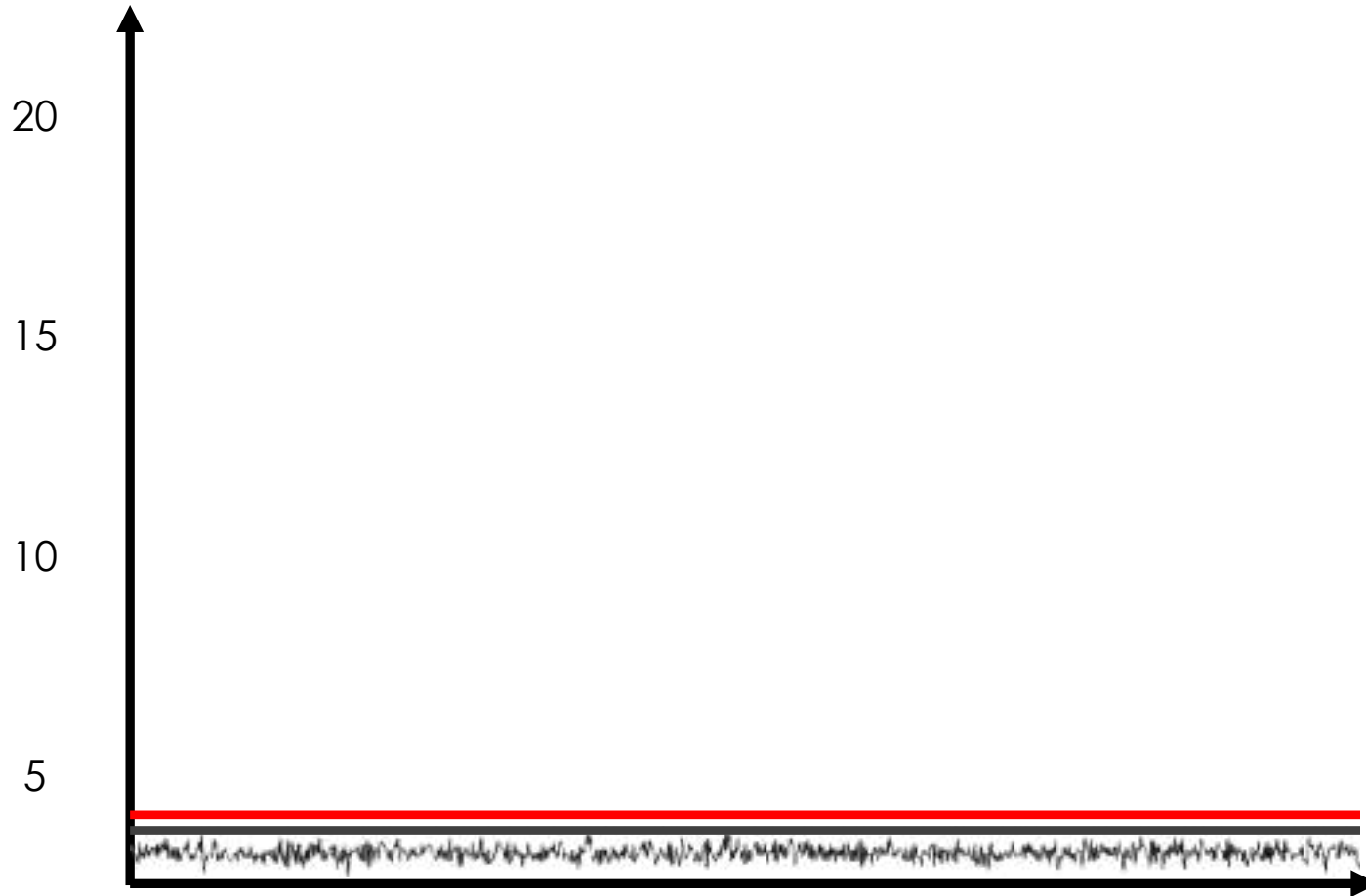
Score

3.5



The results of the fight human vs. machine

Graphical Representation



Algorithm/ Person

Aarun

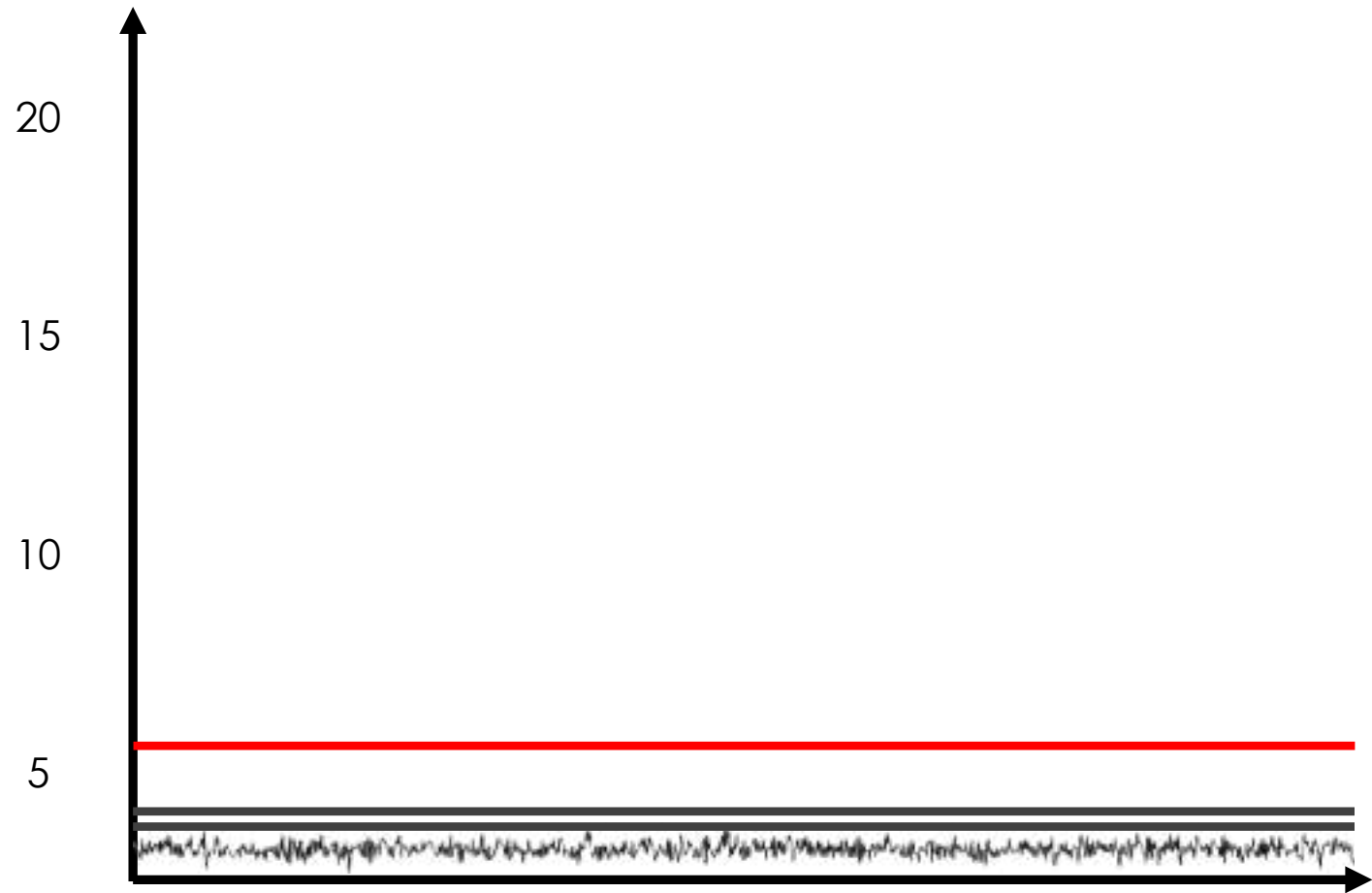
Score

3.7



The results of the fight human vs. machine

Graphical Representation



Algorithm/ Person

Rachel

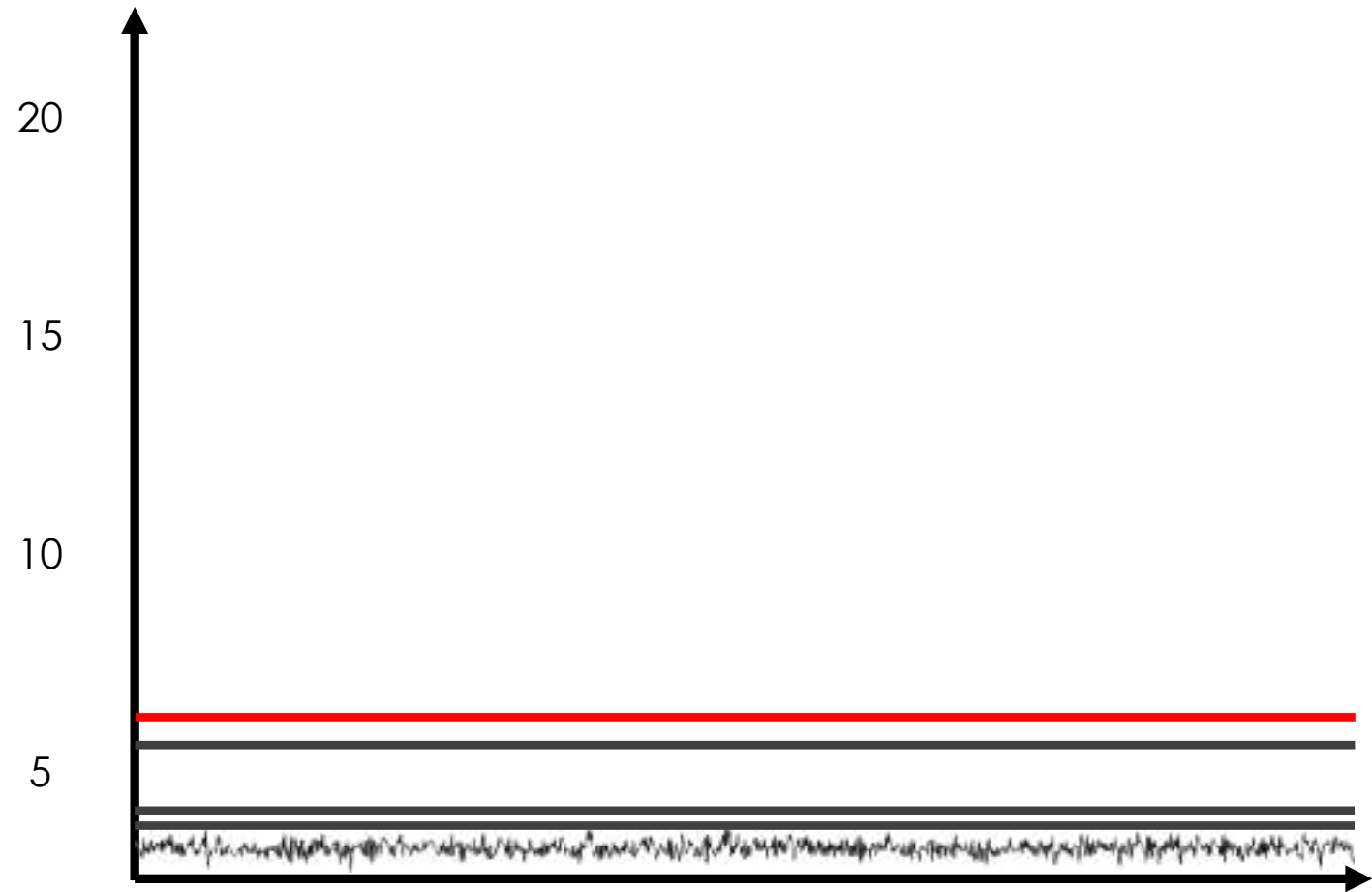
Score

5.1



The results of the fight human vs. machine

Graphical Representation



Algorithm/ Person

Dino

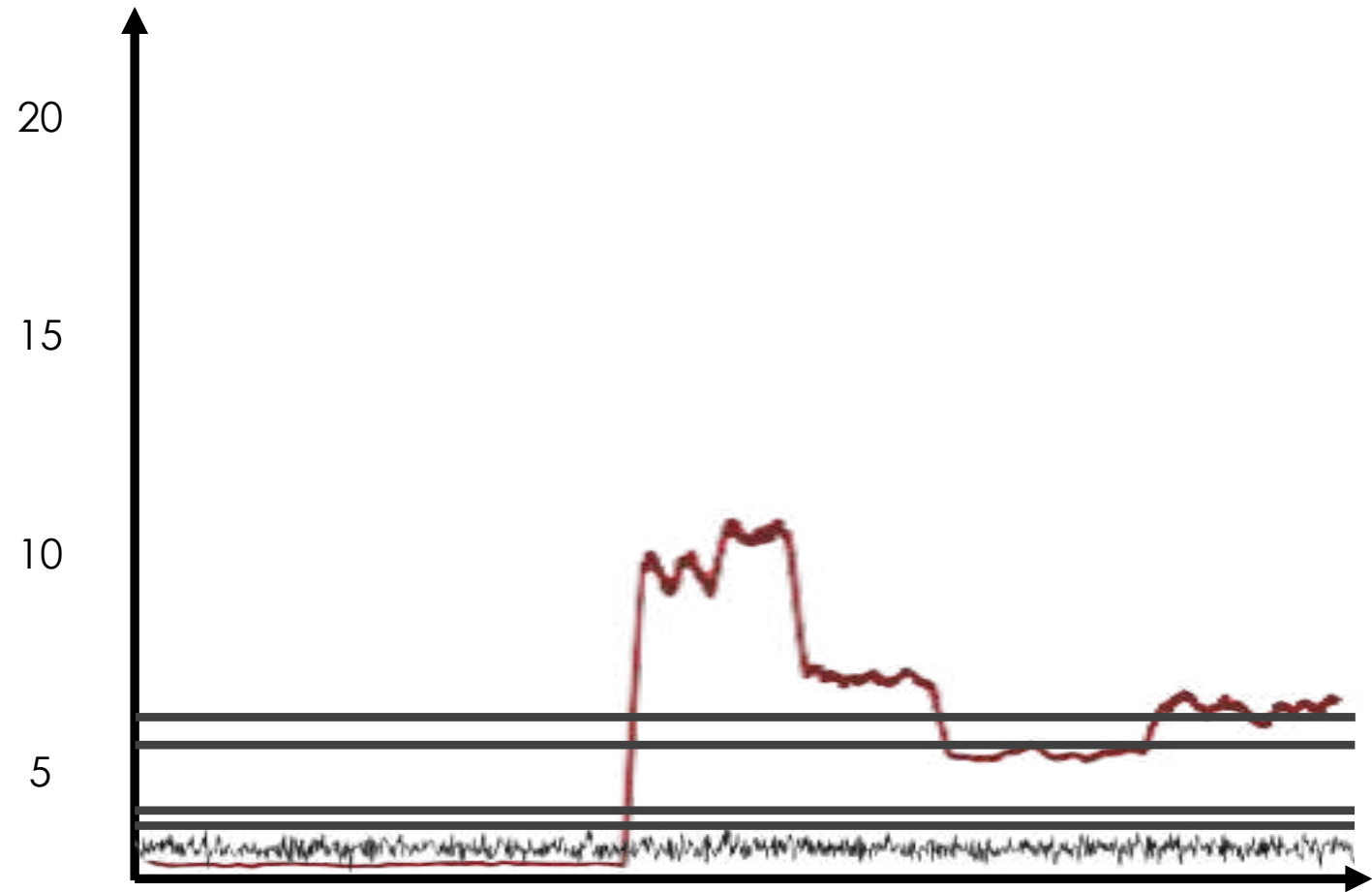
Score

6.9



The results of the fight human vs. machine

Graphical Representation



Algorithm/ Person

Deep Learning
(100k)

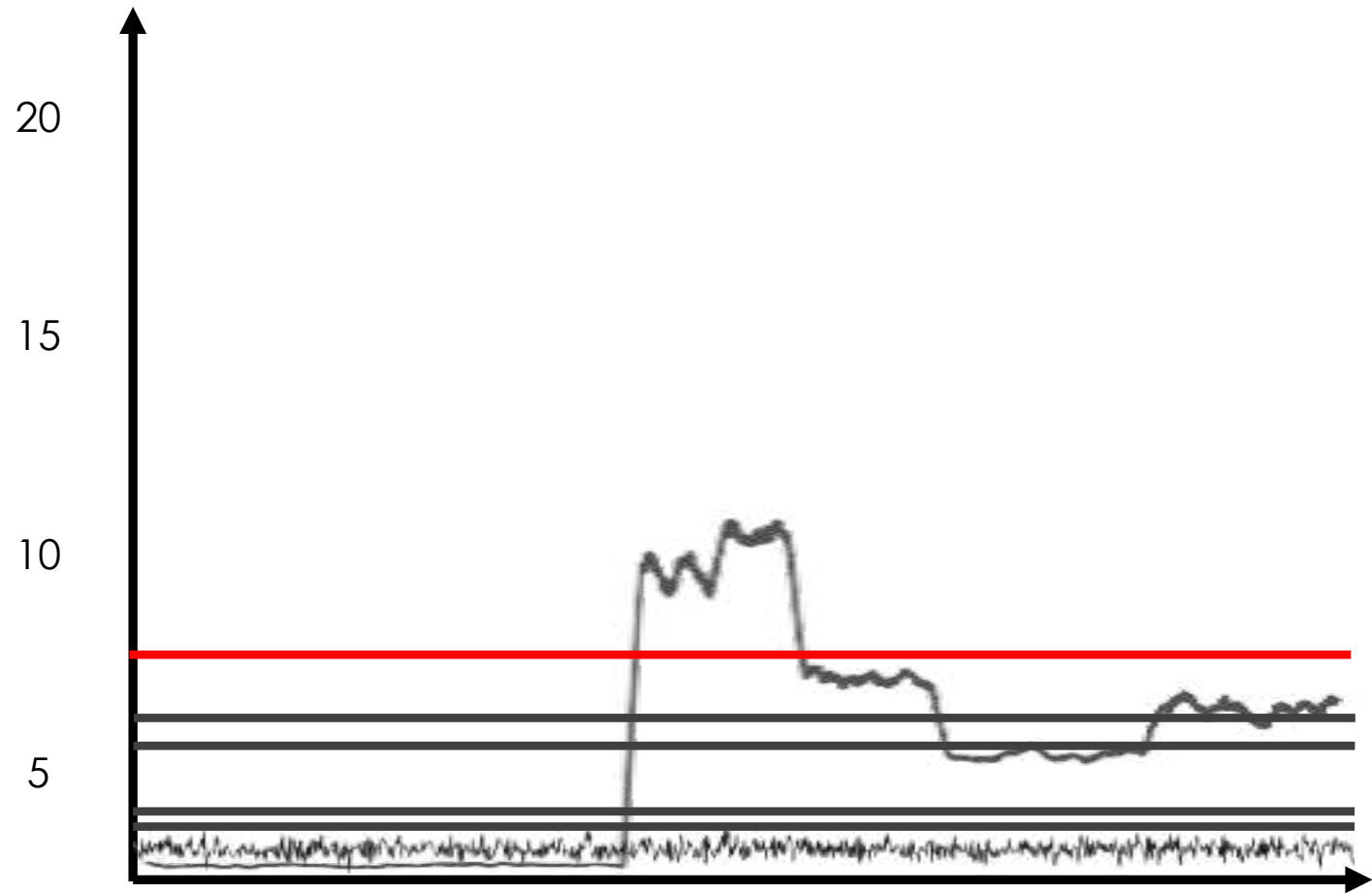
Score

7.2



The results of the fight human vs. machine

Graphical Representation



Algorithm/ Person

Stathis

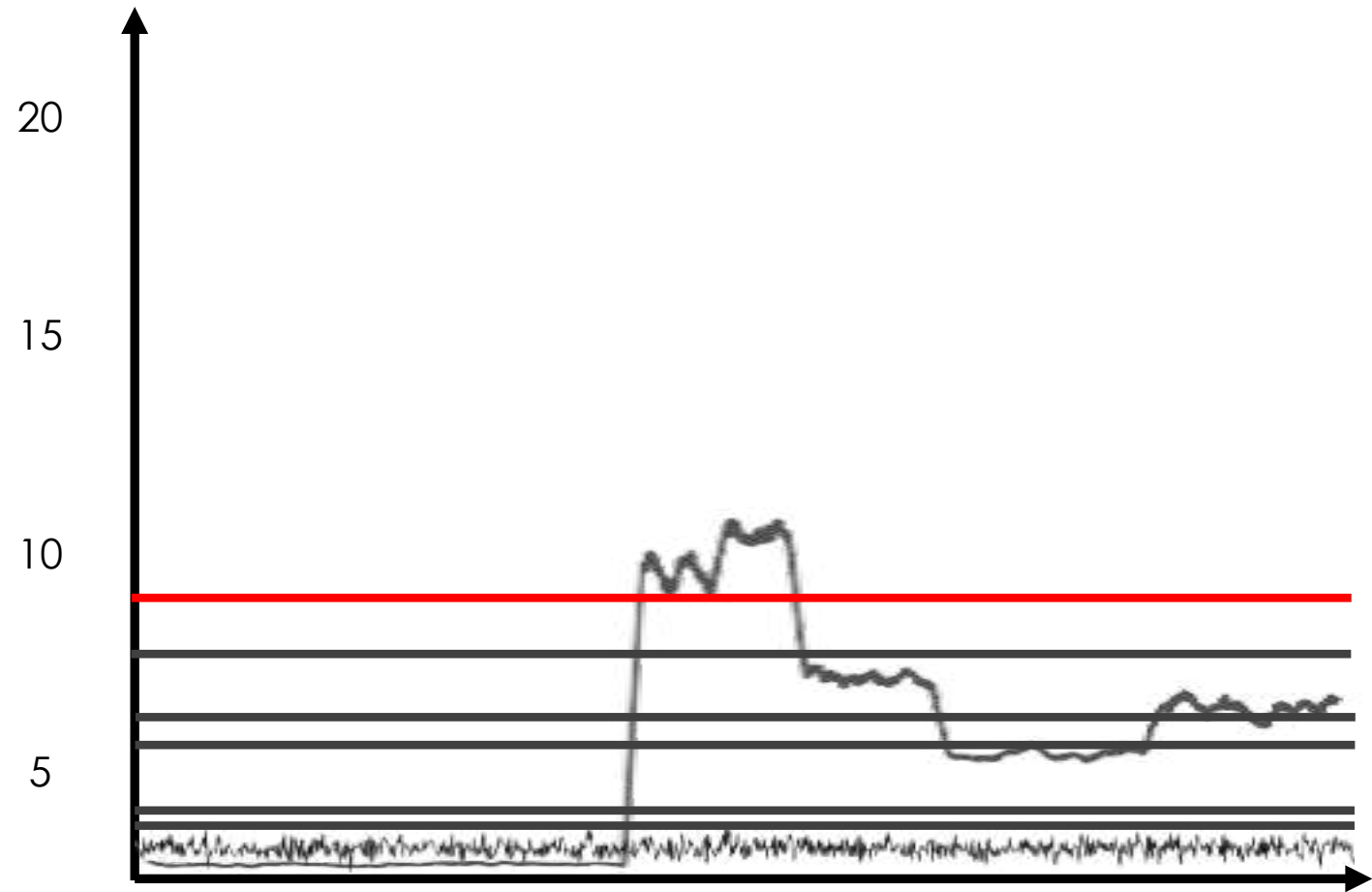
Score

8.2



The results of the fight human vs. machine

Graphical Representation



Algorithm/ Person

Peter

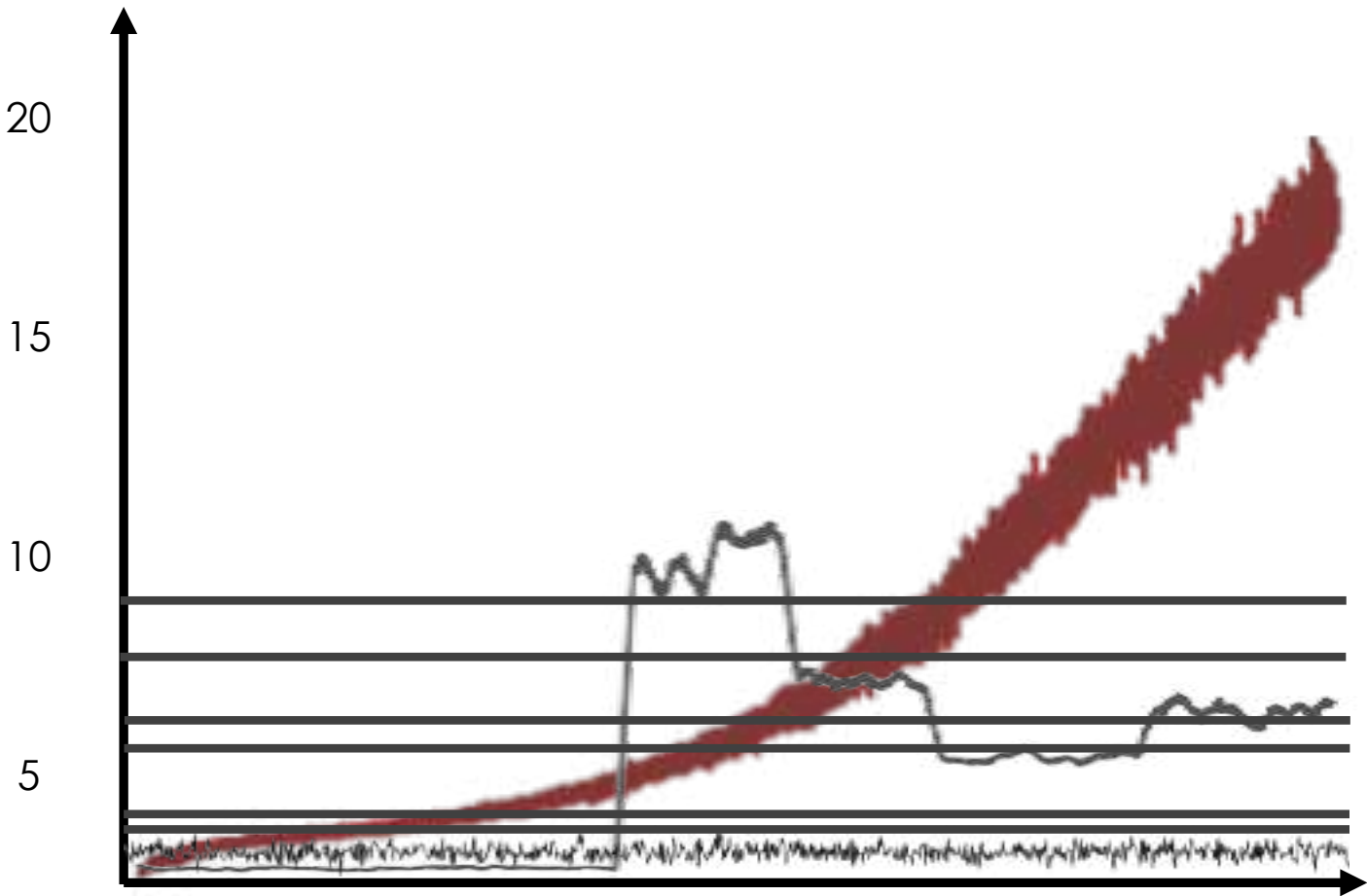
Score

8.7



The results of the fight human vs. machine

Graphical Representation



Algorithm/ Person

Q Tables
(200k)

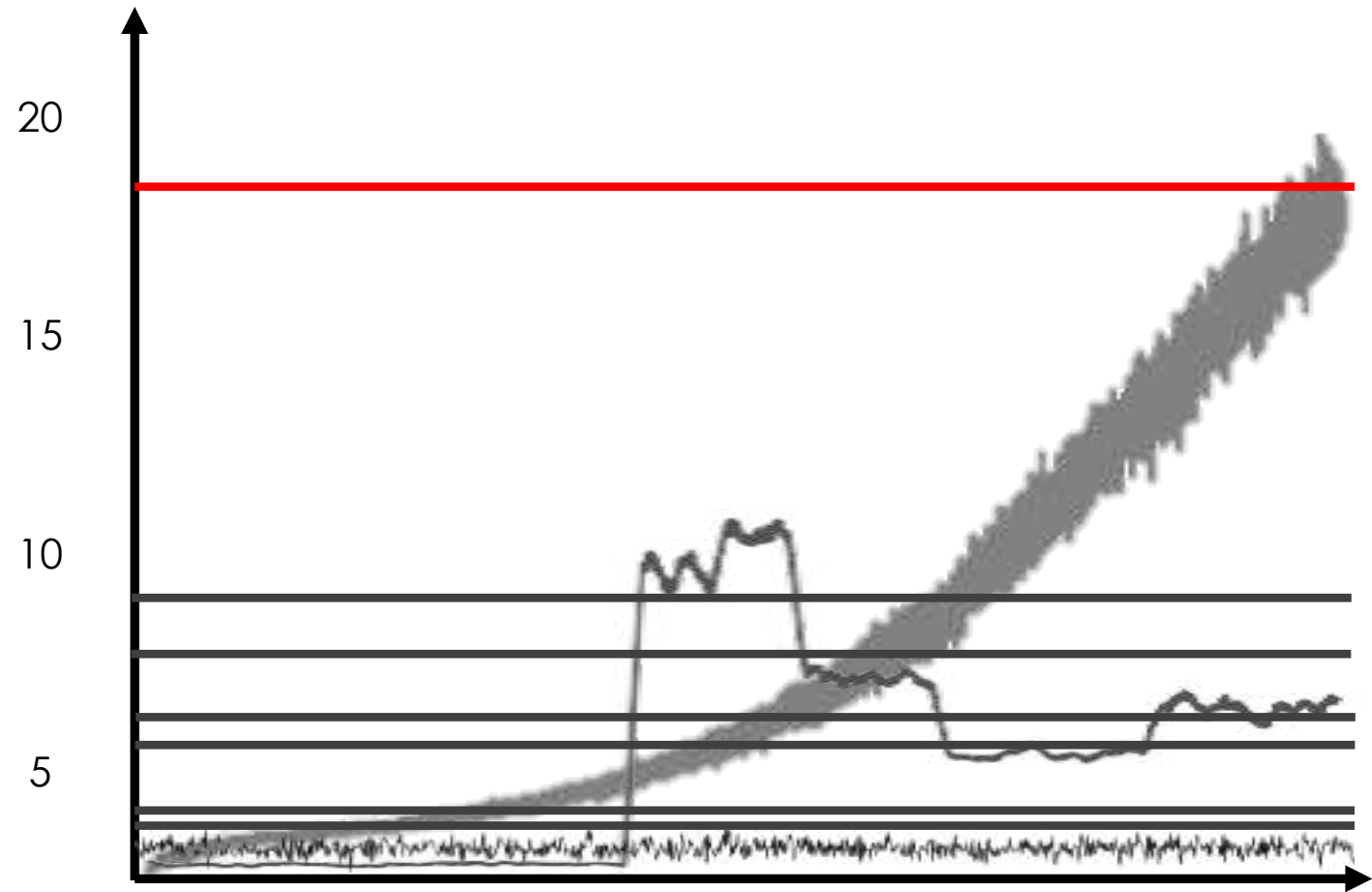
Score

17.6



The results of the fight human vs. machine

Graphical Representation



Algorithm/ Person

Stas

Score

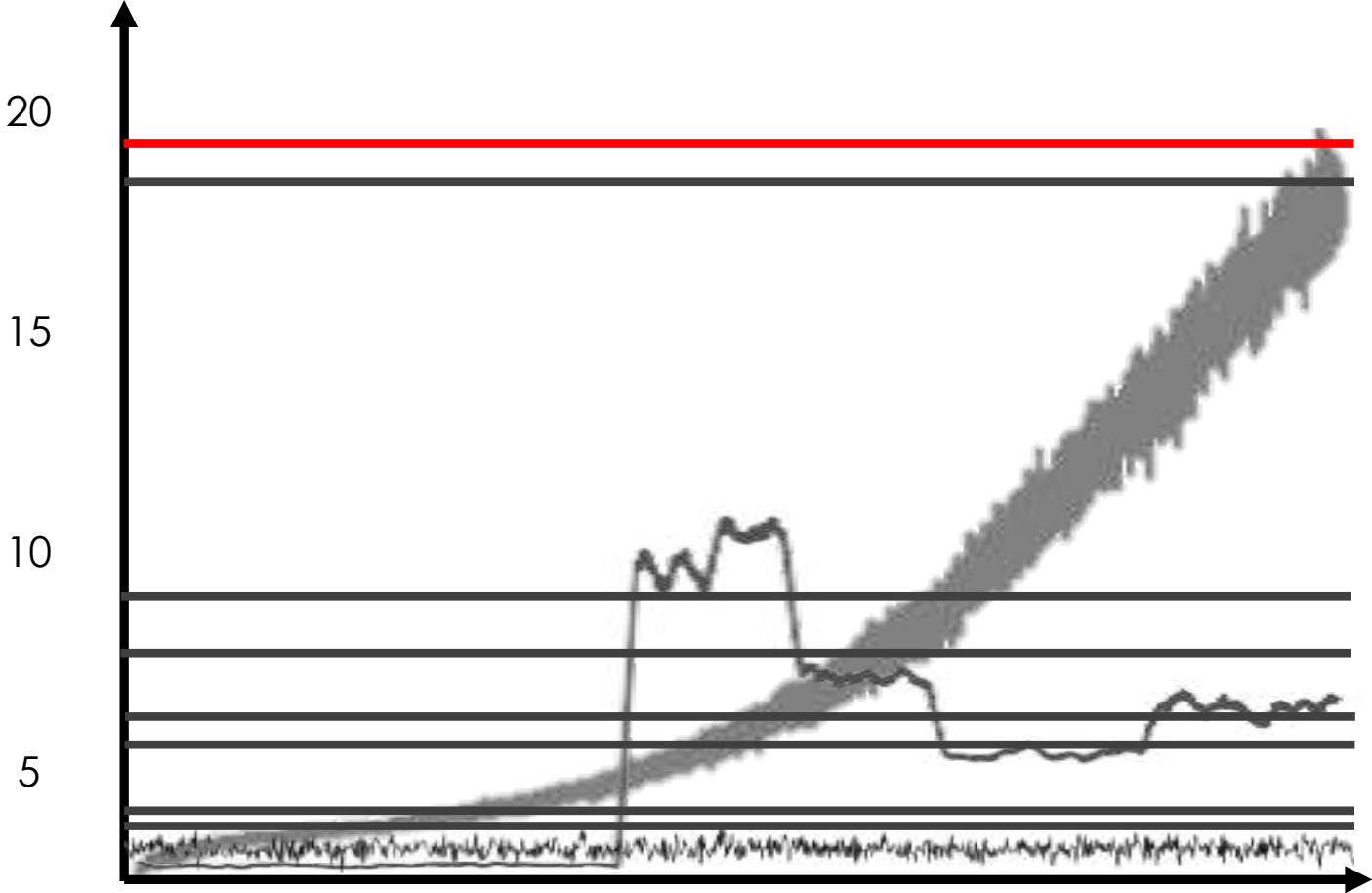
18.2



The results of the fight human vs. machine

Graphical Representation

Algorithm/ Person



Adam

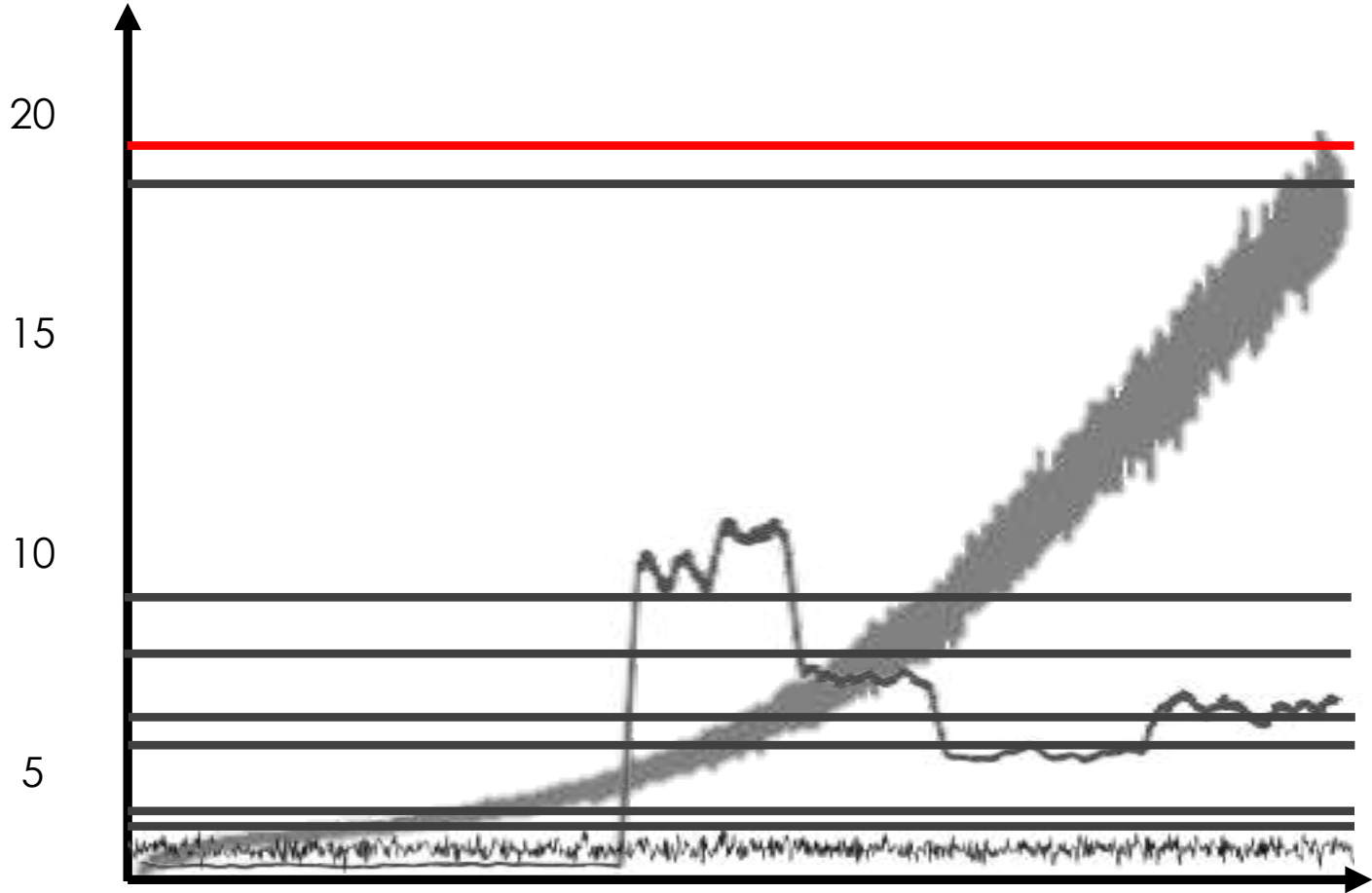
Score

19.2



The results of the fight human vs. machine

Graphical Representation



Algorithm/ Person

Adam

Score

19.2

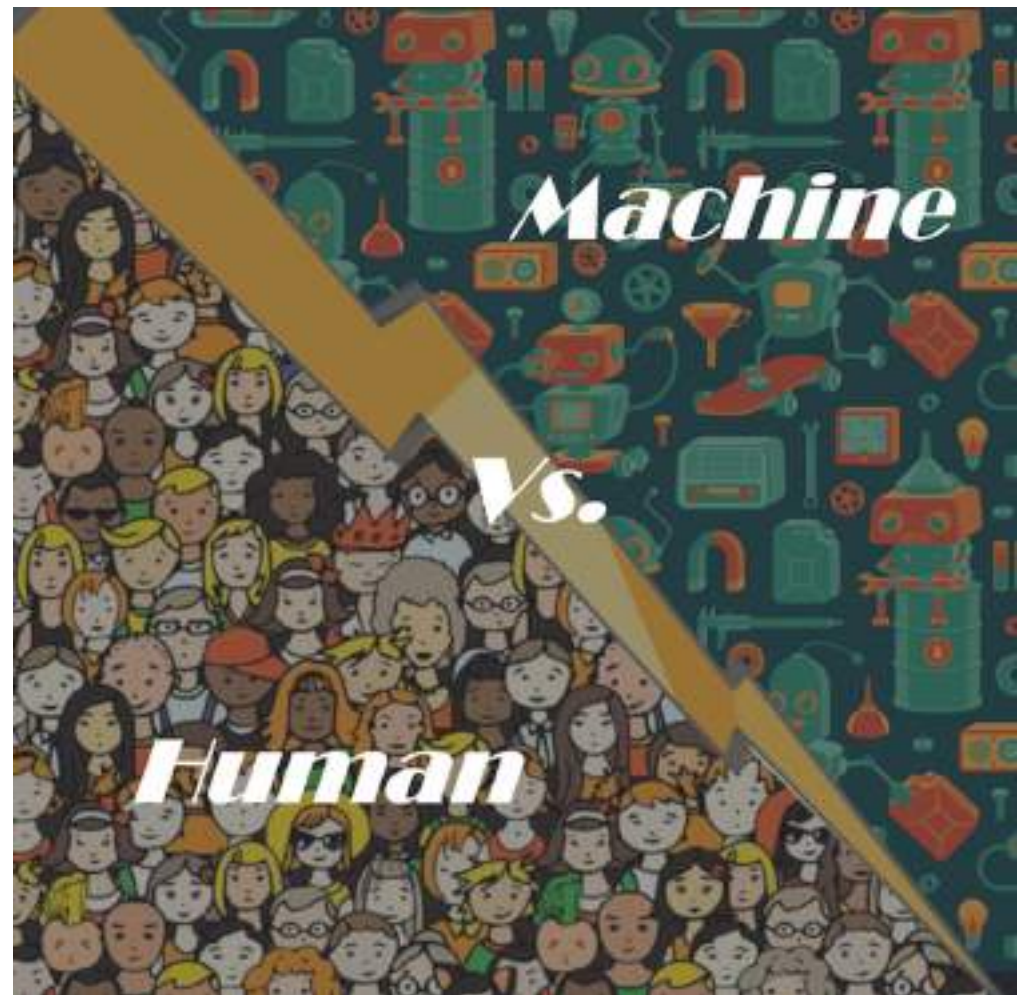
Thank You

Email: paulmora@t-online.de

LinkedIn: [Paul Michael Mora Sancho](#)



The Game
played is...



The rules are...

1. Eat the green bunnies
2. The relevant score is Food/
Death Average
3. 60 Seconds time limit

