

# Game AI

## Project 3: Behavior Programming

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# Outline

- *Connect four* for large board
- *Fuzzy-controller* for breakout
- *Self organizing maps*
- *Bayesian imitation learning*

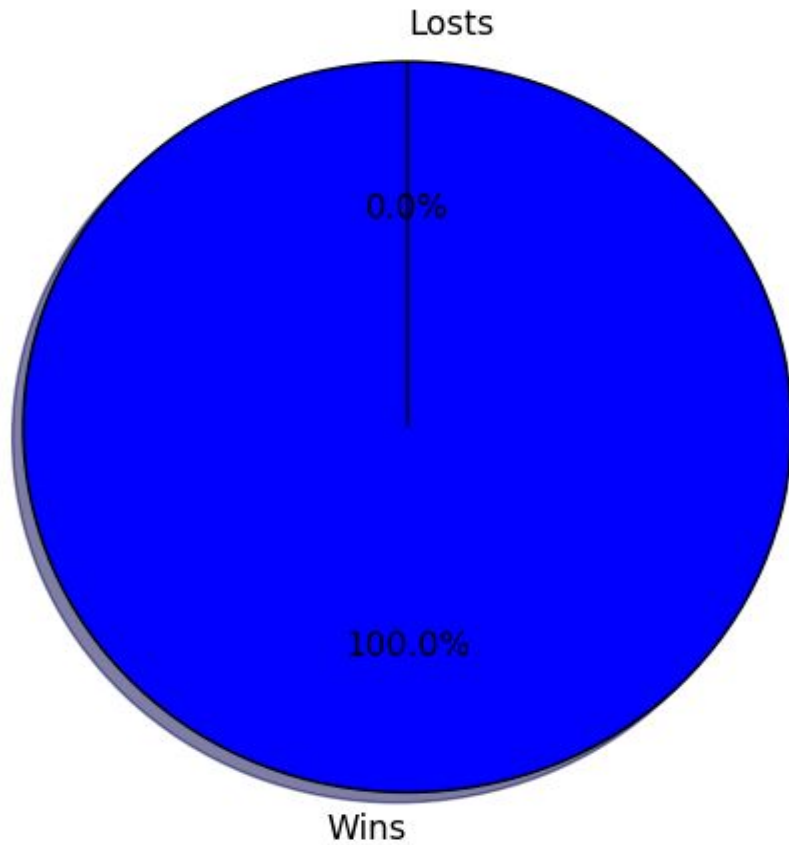


## Task 3.1: Minmax search for connect four 19X19

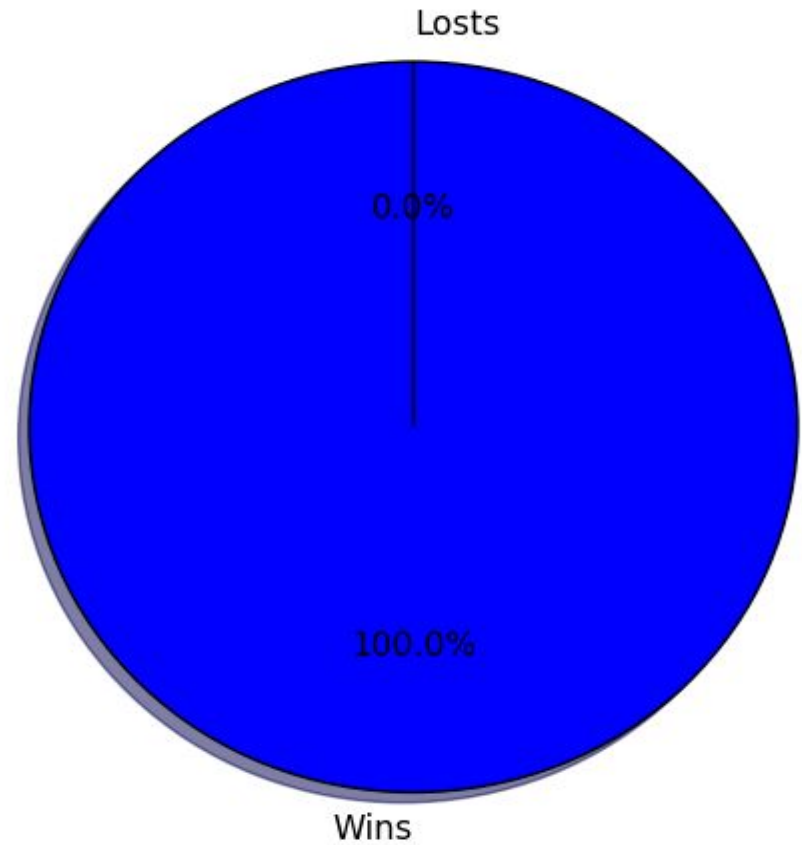
- 1) Implement the depth-restricted search to find the best move**
  - a) Modify the depth-parameter to find the best case
- 2) Gather statistics with resized board (19x19)**
  - a) Win/Loss statistics
  - b) Time statistics
  - c) The number of filled layers
  - d) Depth-parameter statistics

## Task 3.1: Win/Loss statistics

Statistics after 500 games where depth is 1

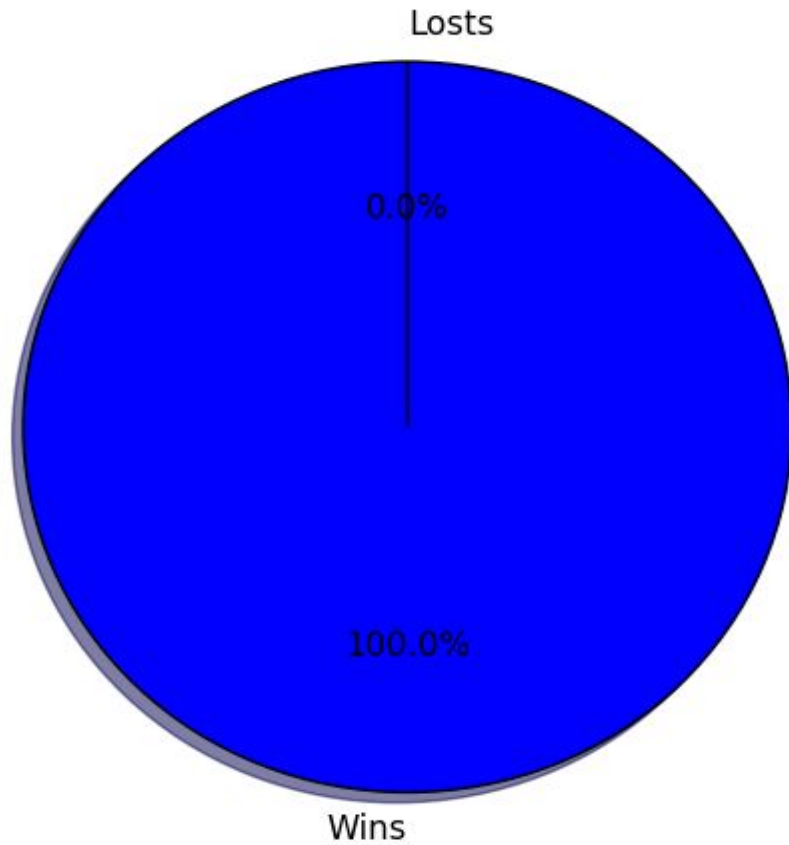


Statistics after 1000 games where depth is 1

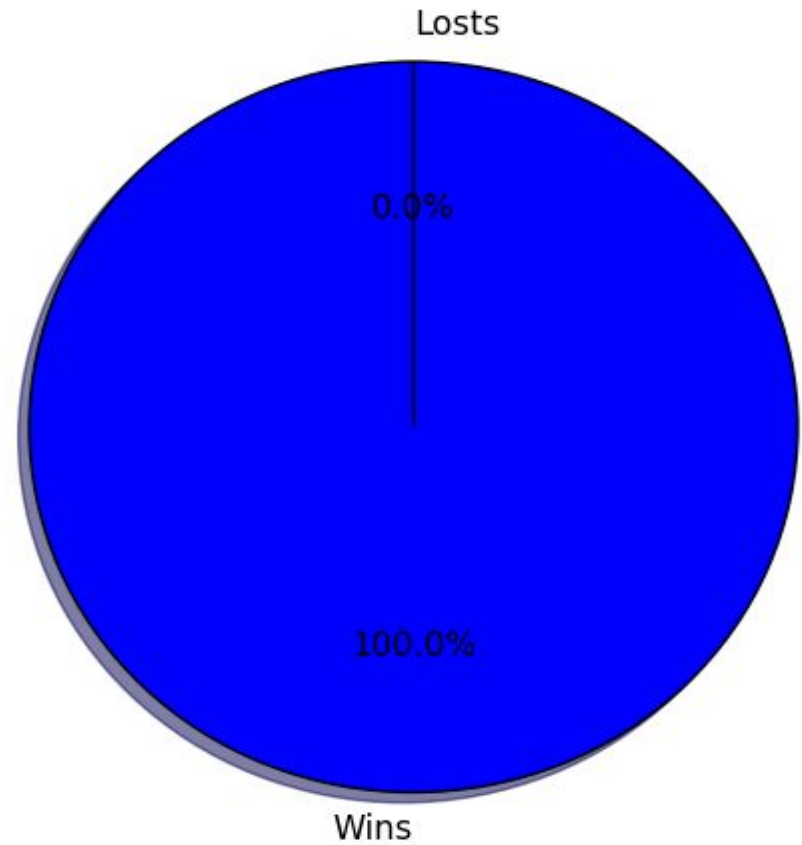


## Task 3.1: Win/Loss statistics

Statistics after 500 games where depth is 2

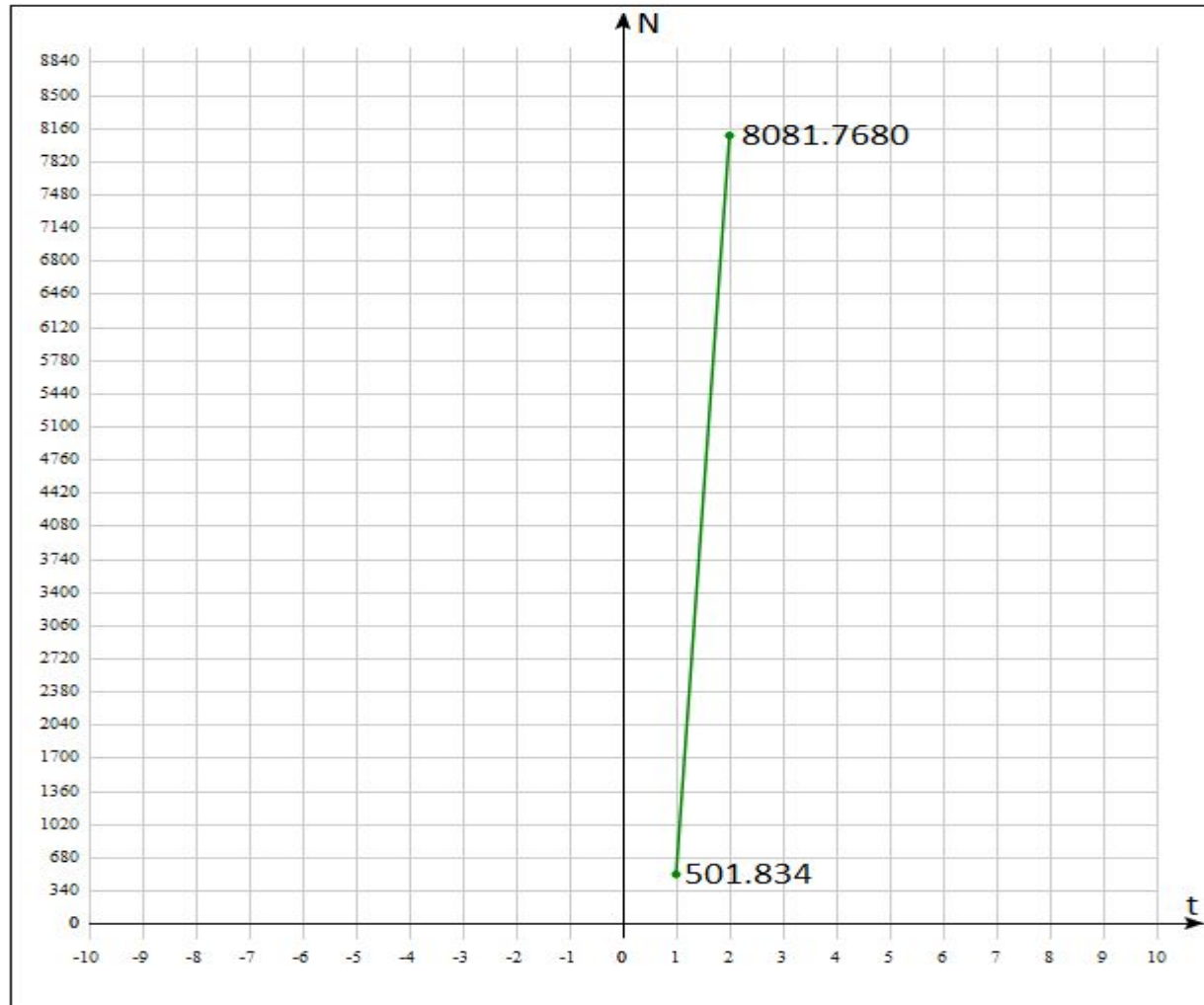


Statistics after 1000 games where depth is 2

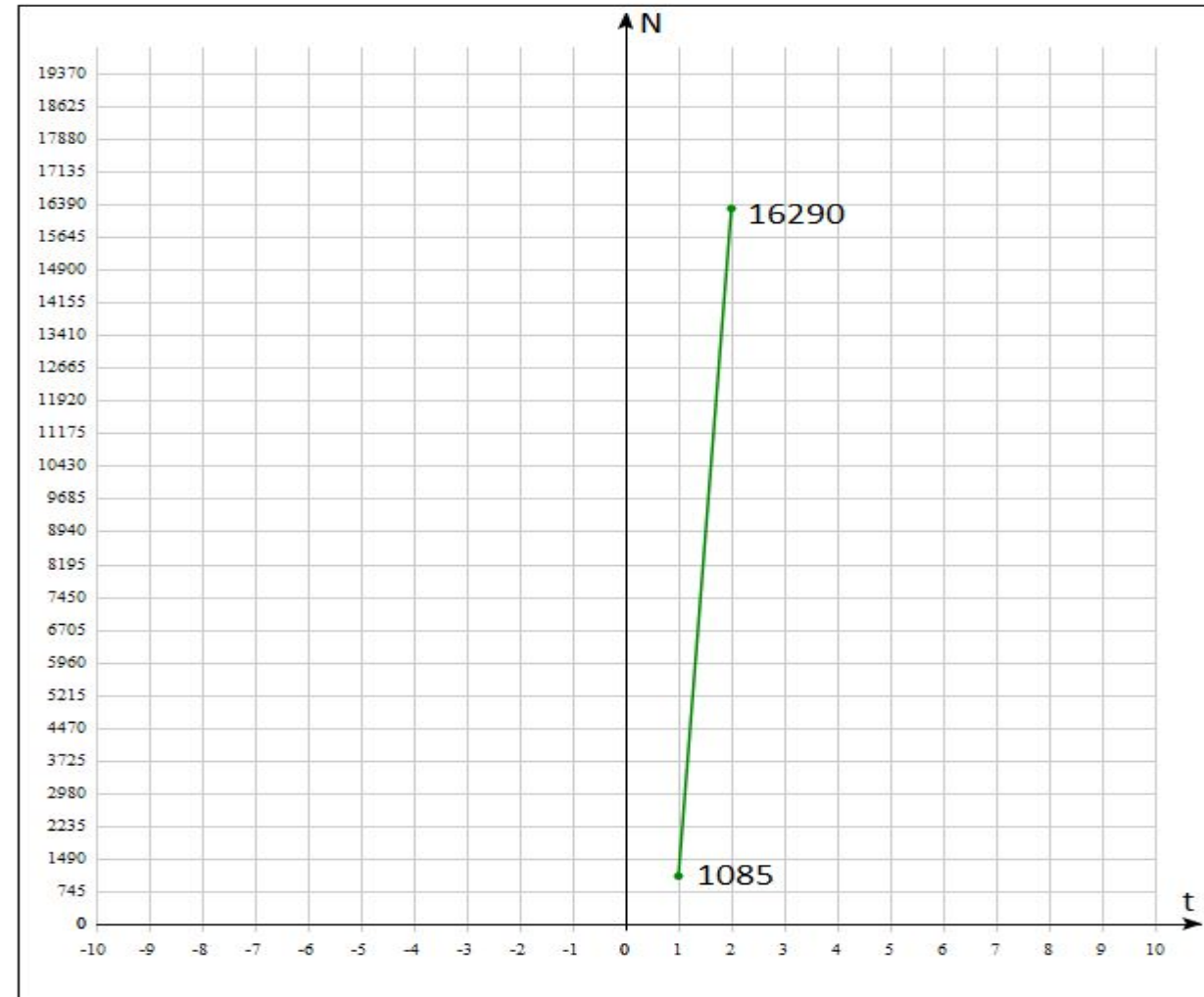


# Task 3.1: Time statistics

**500 samples**



**1000 samples**



# Task 3.1:The number of filled layers

500 Samples depth 1

	0	1	2	3
...				
13		1	1	
14		5	1	
15	416	19	3	
16	444	21	3	
17	466	22	4	2
18	500	80	71	62

1000 Samples depth 1

	0	1	2	3
...				
13		1		
14		12	1	
15	839	37	10	
16	898	40	14	
17	949	49	16	5
18	1000	148	134	112



# Task 3.1:The number of filled layers

500 Samples depth 2

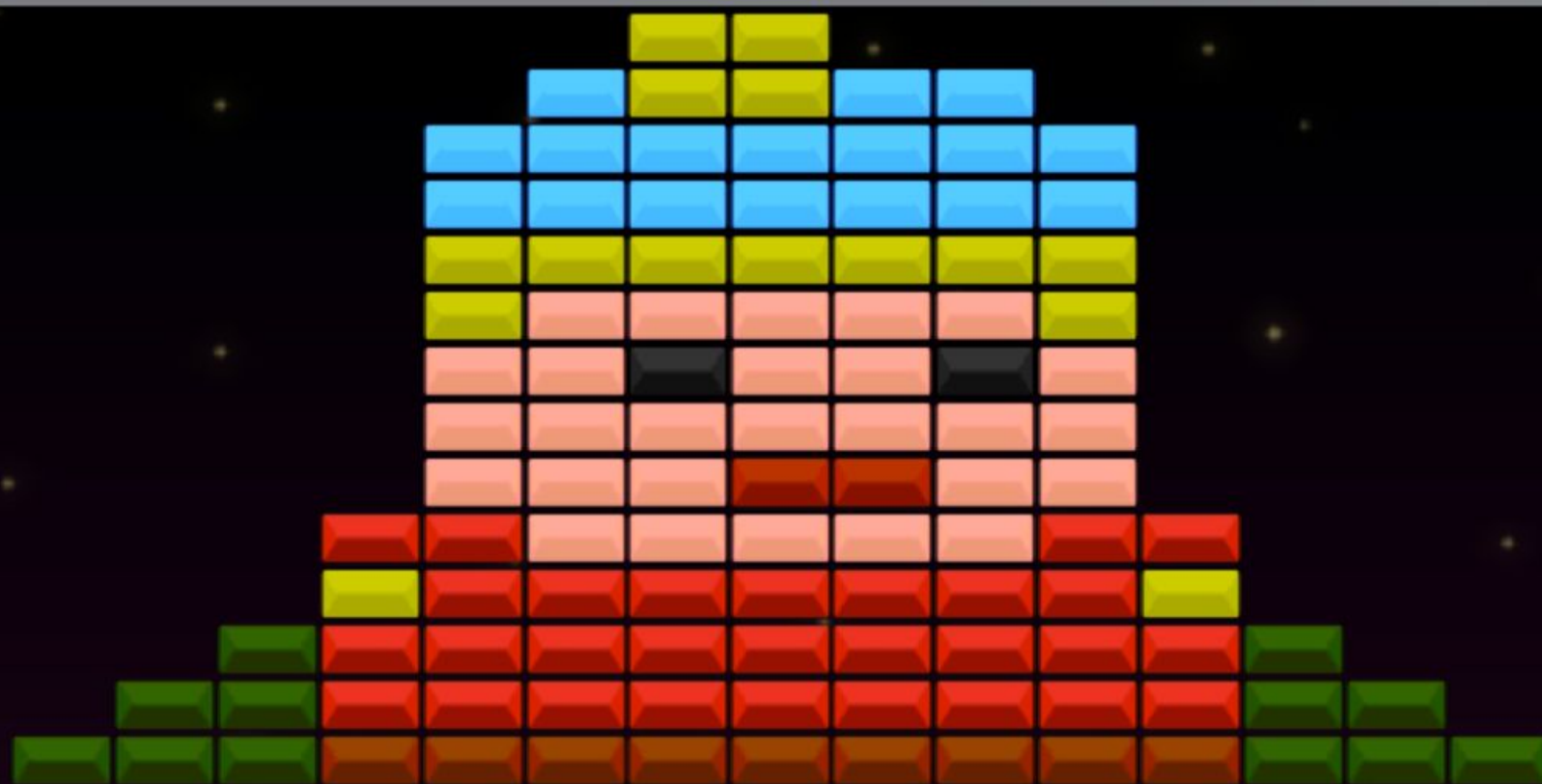
	0	1	2	3
...				
13		3	1	
14		8	1	
15	432	17	2	
16	450	15	2	
17	473	17	1	
18	500	62	57	52

1000 Samples depth 2

	0	1	2	3
...				
13				
14		7		
15	856	30	5	
16	900	30	7	
17	949	34	12	7
18	1000	140	126	104



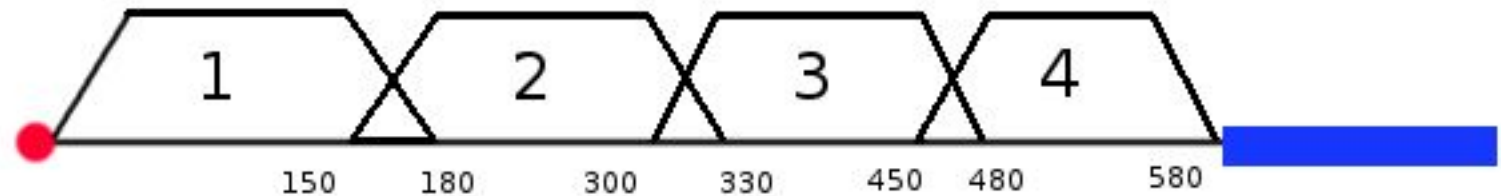
level 19



## Task 3.2: Fuzzy Controller for Breakout

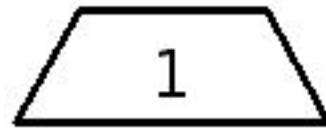
The maximum distance (= 580 units) between the Paddle and the Predictor ball is divided into 4 rules

Distance of Paddle from Predictor



## Task 3.2: Fuzzy Controller for Breakout

The rule set for the divided distance is:



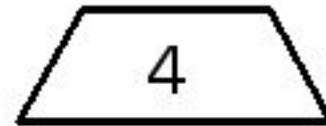
Velocity = 5 units/framecall



Velocity = 10 units/framecall



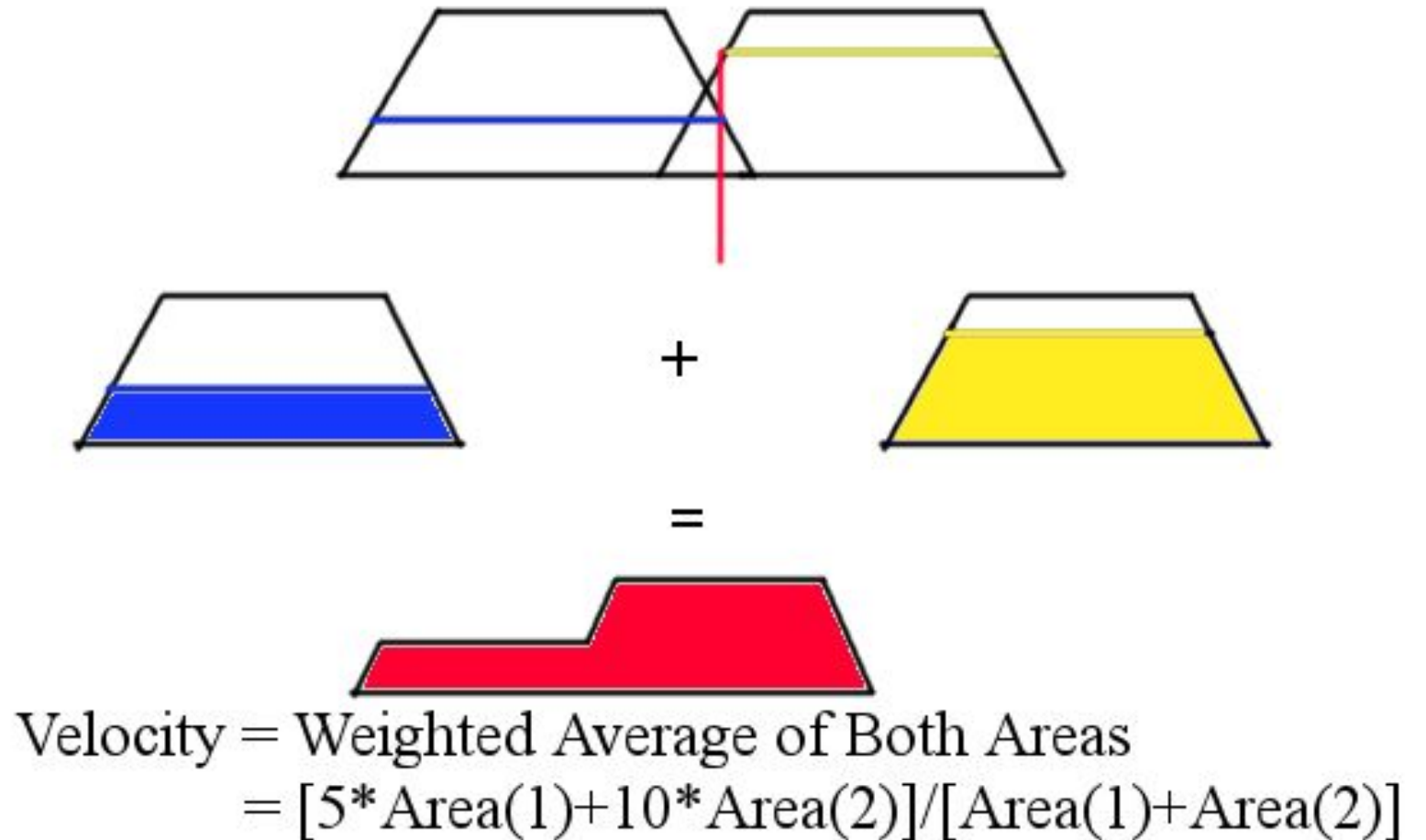
Velocity = 12.5 units/framecall

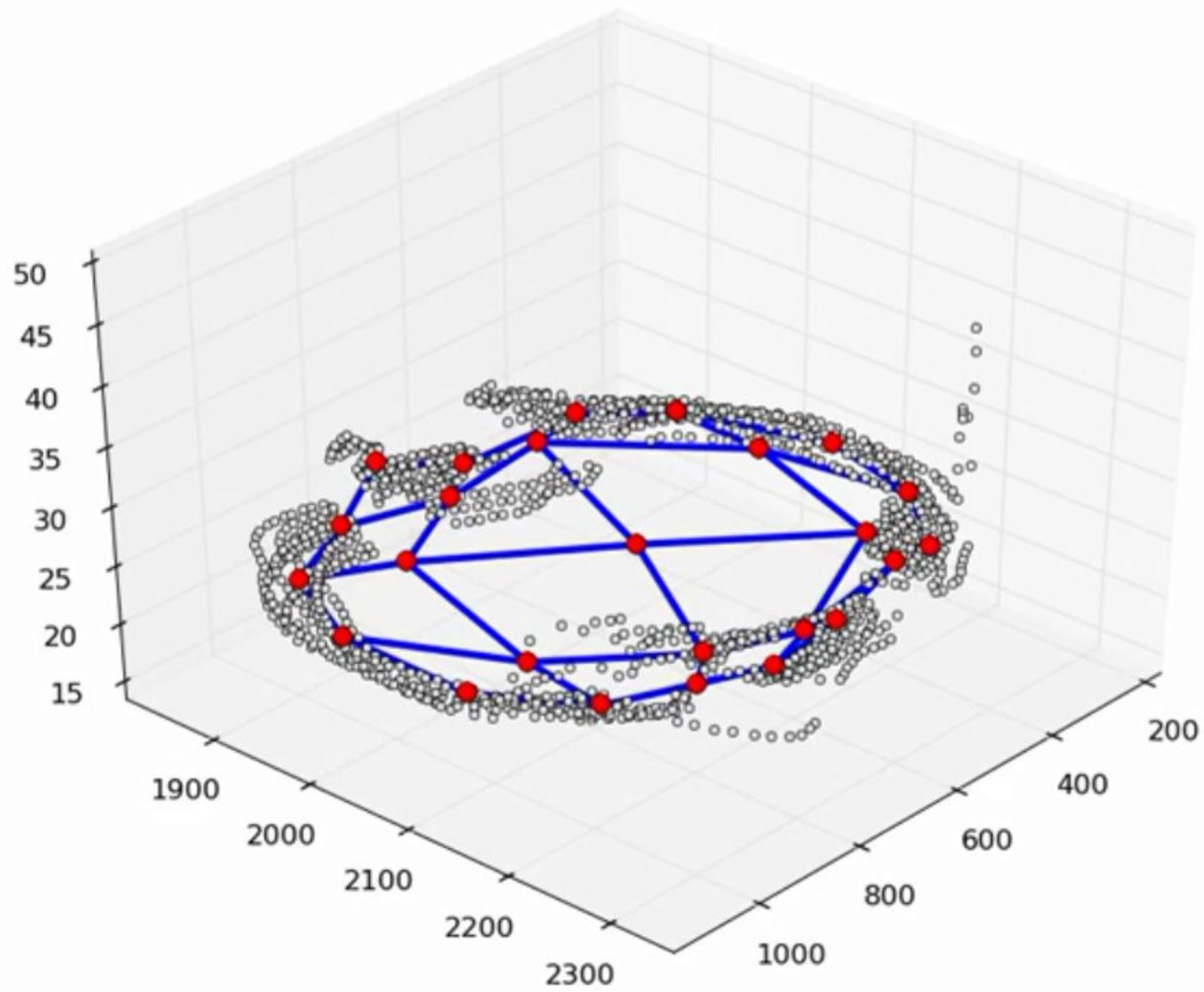


Velocity = 15 units/framecall

## Task 3.2: Fuzzy Controller for Breakout

If the distance between the predictor ball and the paddle leads to two rules firing, then the velocity function is the weighted average:





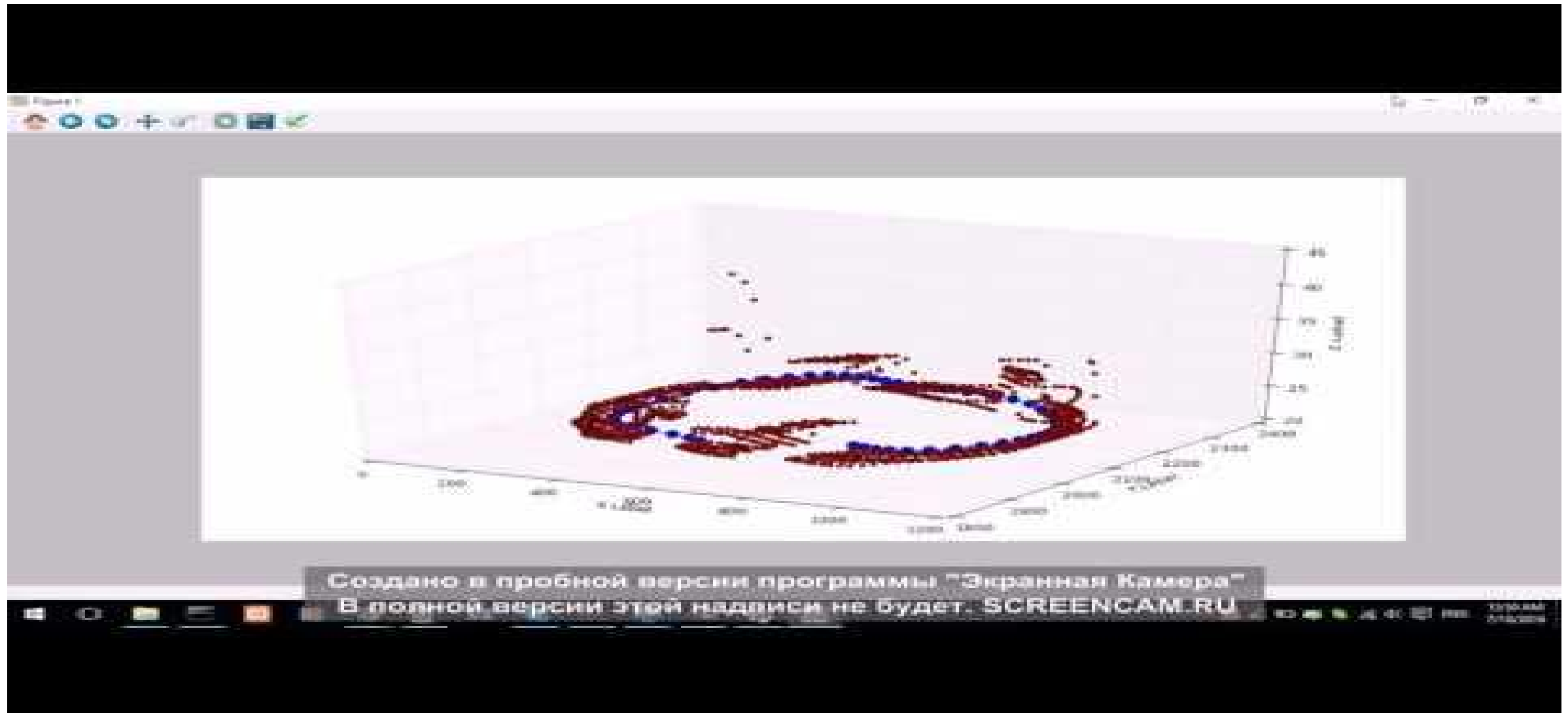
## Task 3.3: Self organizing maps

### 1) Fit self organizing maps to the datasets

#### a) Self organizing map algorithm

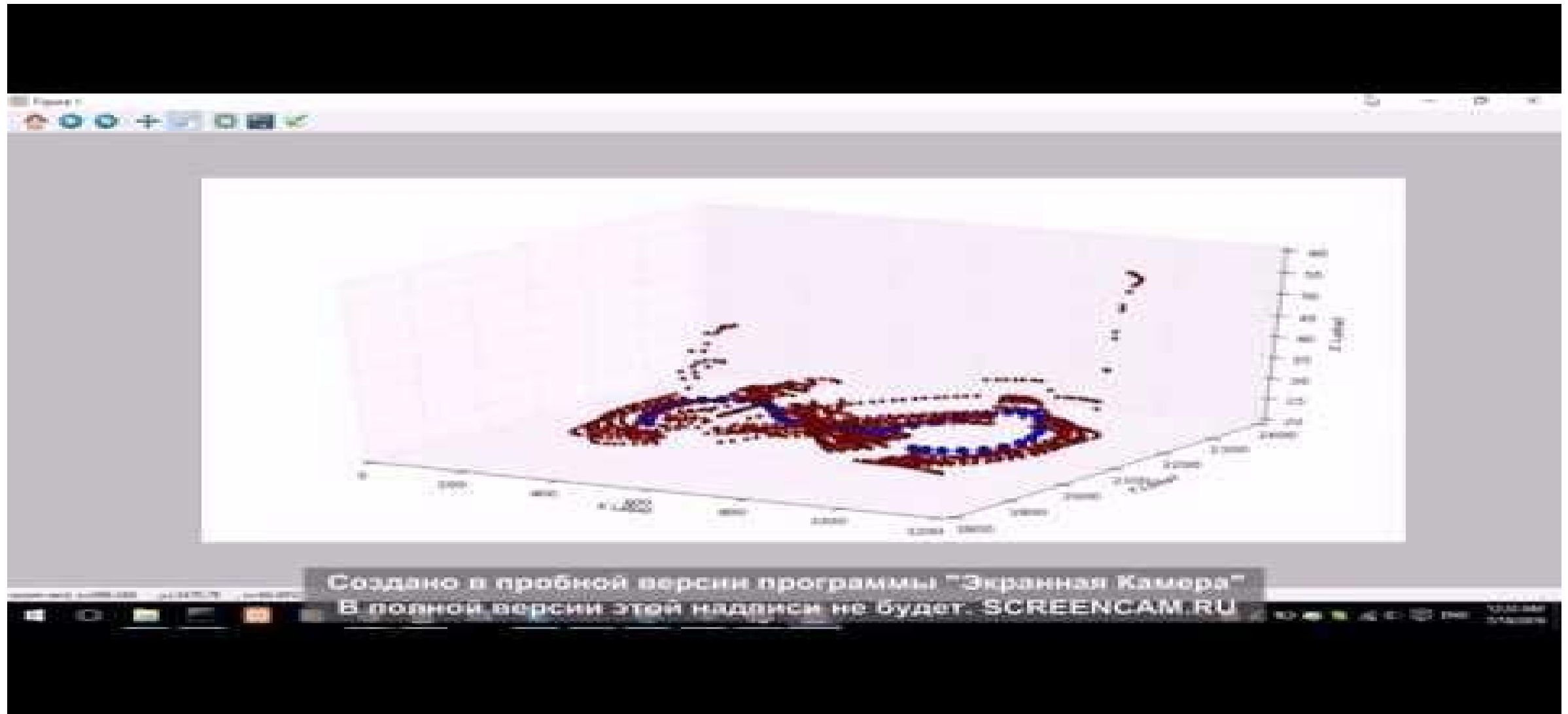
- i) Assign random values to neurons (centers)
- ii) Choose random pattern from dataset
- iii) Find the closest neuron to that pattern(custom metric)
  - (1)  $\text{distance}[\text{winner}] = \text{distance}(\text{neuron}, \text{pattern})$
- iv) Update neurons(centers)
  - (1)  $\text{nrn}[i] += \text{lr}(t) * e^{(\text{dist}(\text{nrn}[i], \text{pat})/2 * \text{sig}(t))} * (\text{pat} - \text{nrn}[i])$
  - (2)  $\text{lr}(t) = 1 - (t/T)$
  - (3)  $\text{sig}(t) = e^{-[t/T]}$

## Task 3.3: Self organizing maps (circle figure)



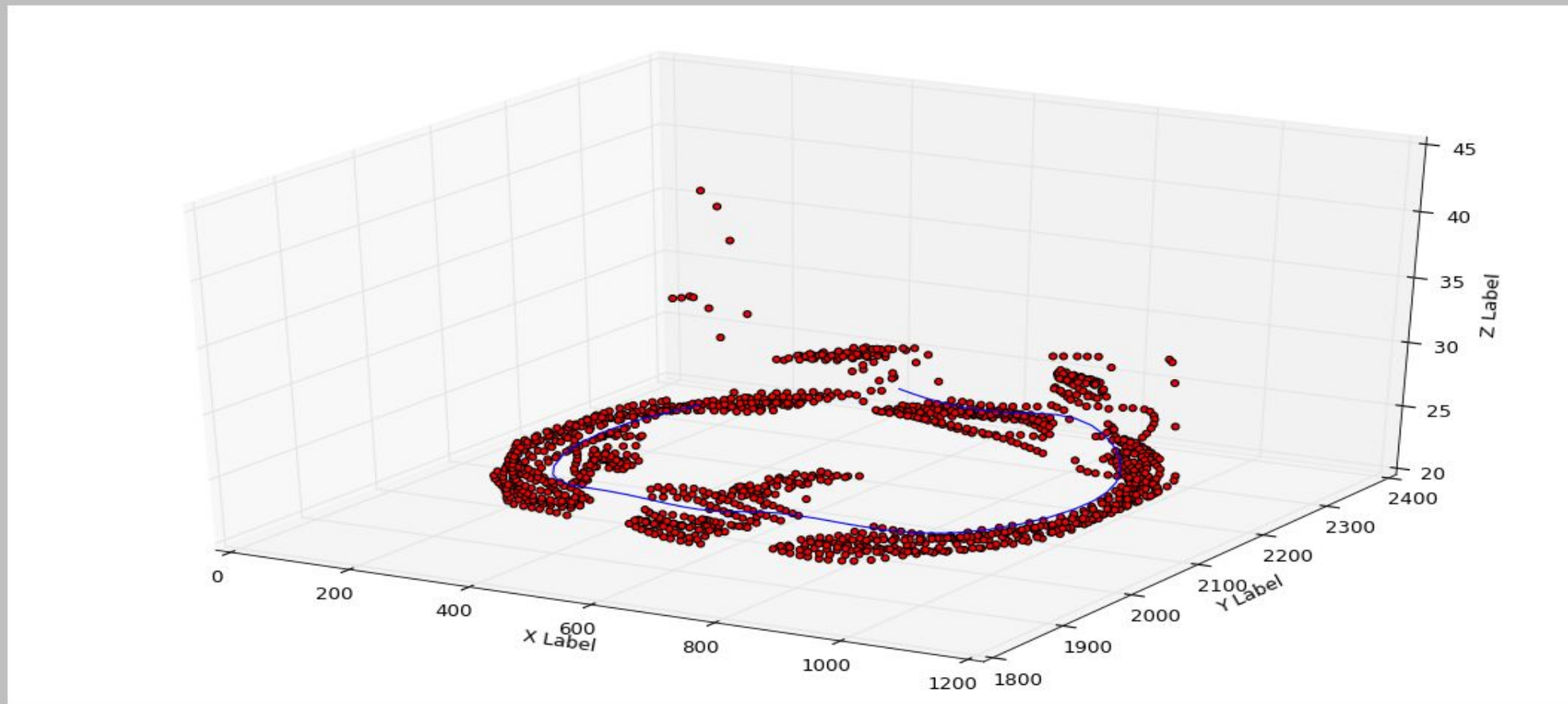


## Task 3.3: Self organizing maps (figure 8)



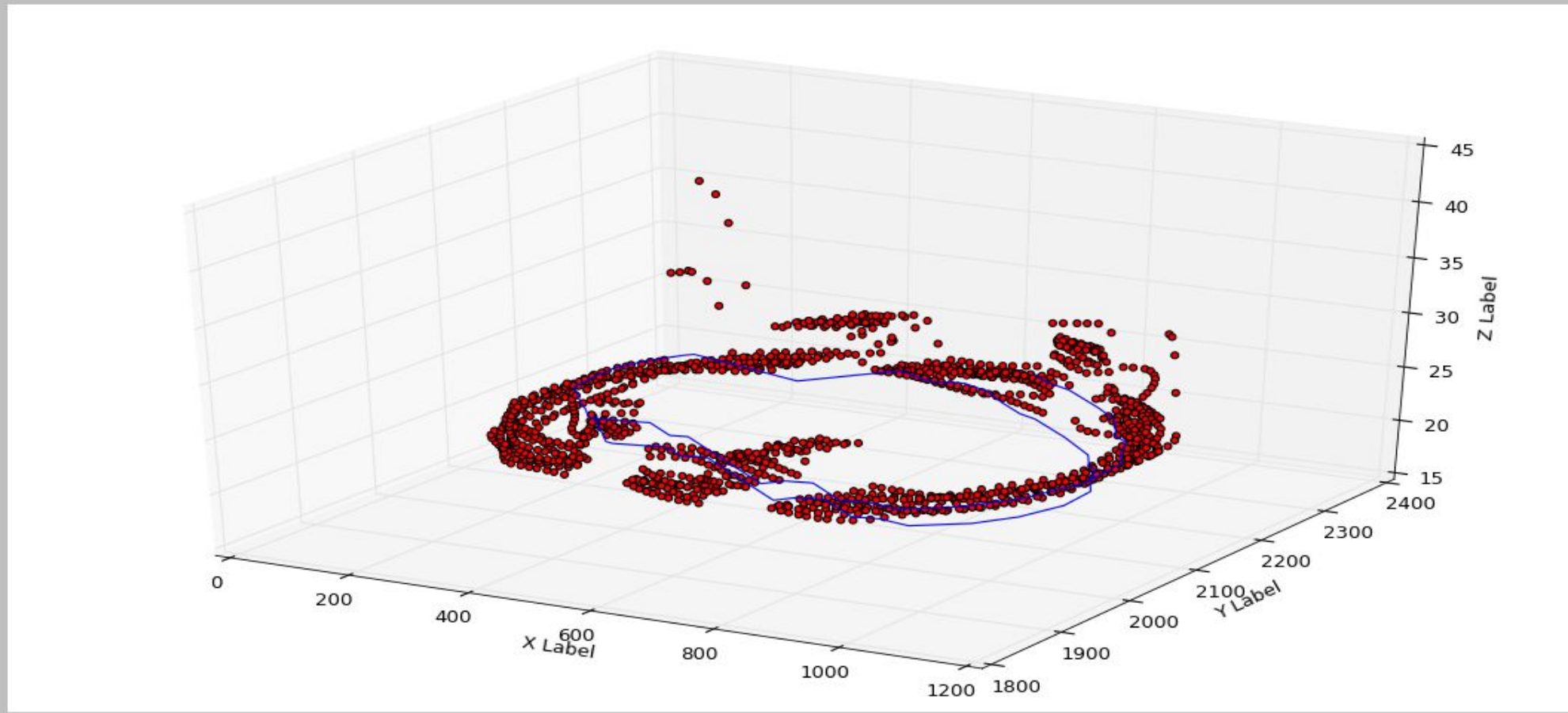
# Task 3.4: Bayesian imitation learning

Figure 1



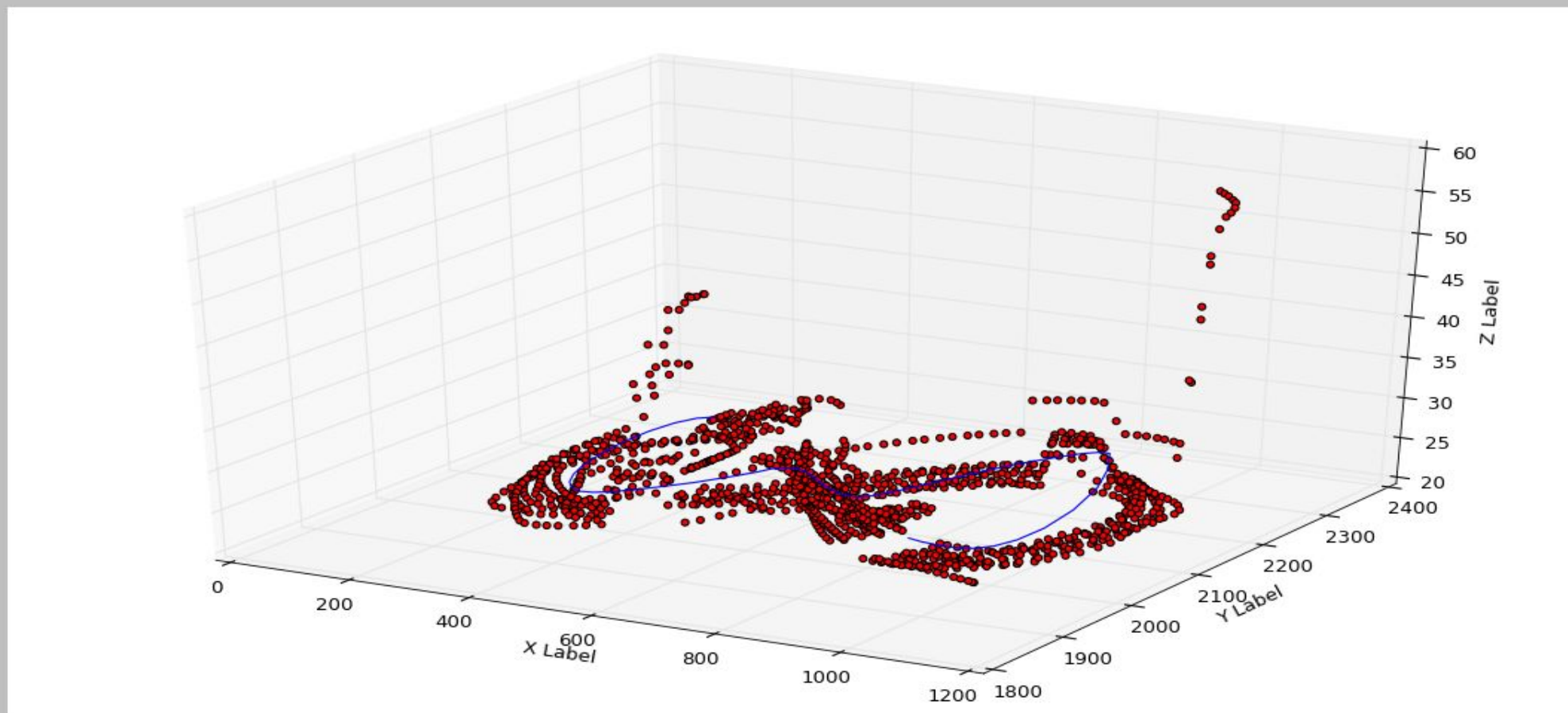
# Task 3.4: Bayesian imitation learning

Figure 1



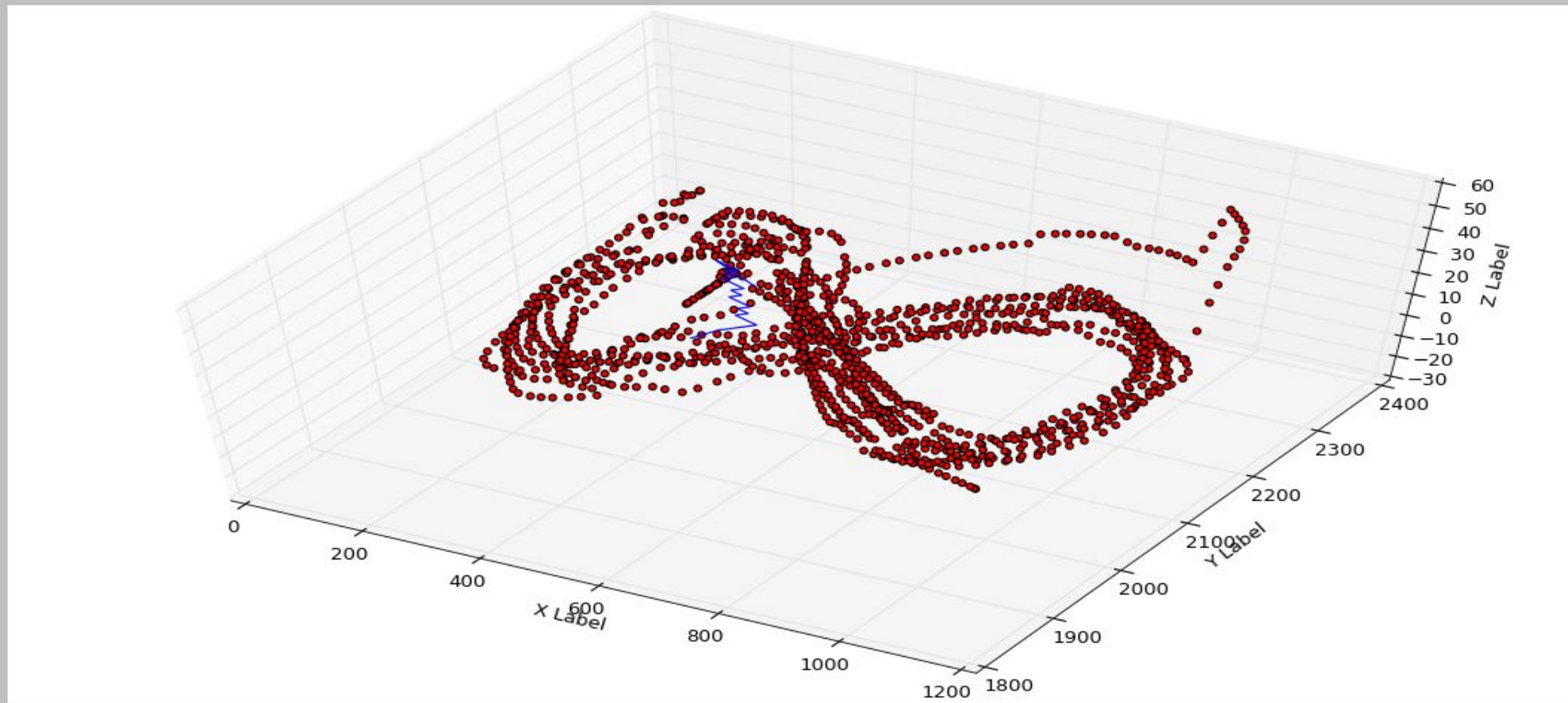
# Task 3.4: Bayesian imitation learning

Figure 1



# Task 3.4: Bayesian imitation learning

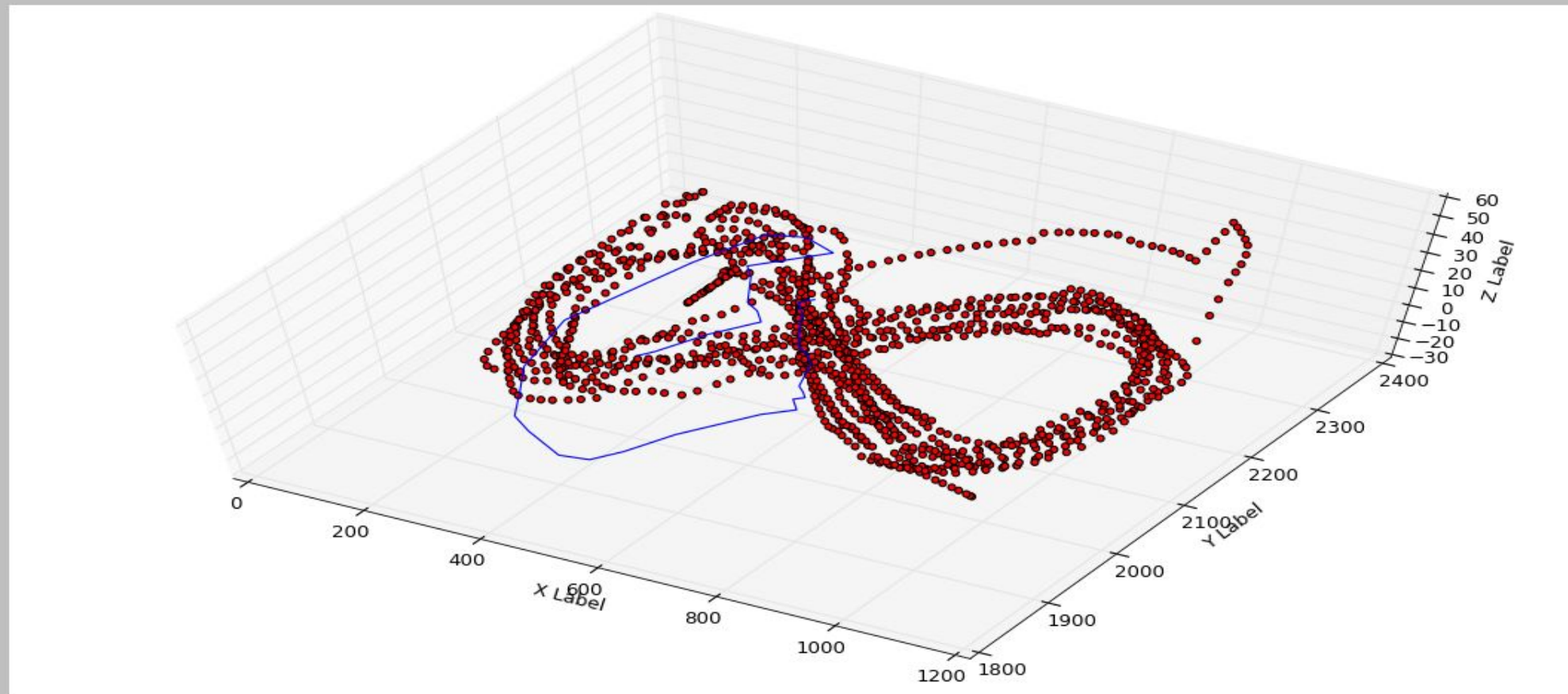
Figure 1





# Task 3.4: Bayesian imitation learning

Figure 1



Thank you for attention