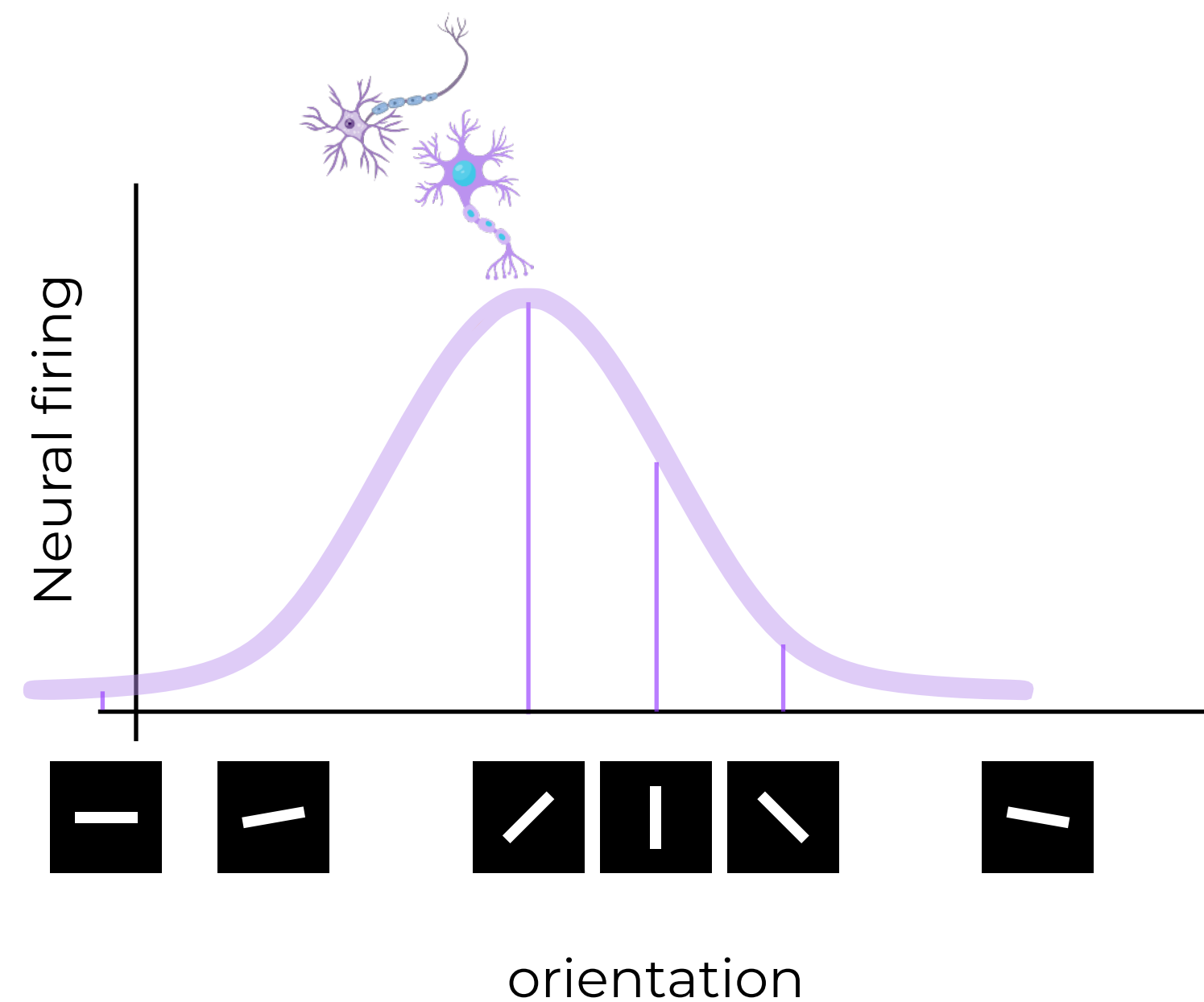
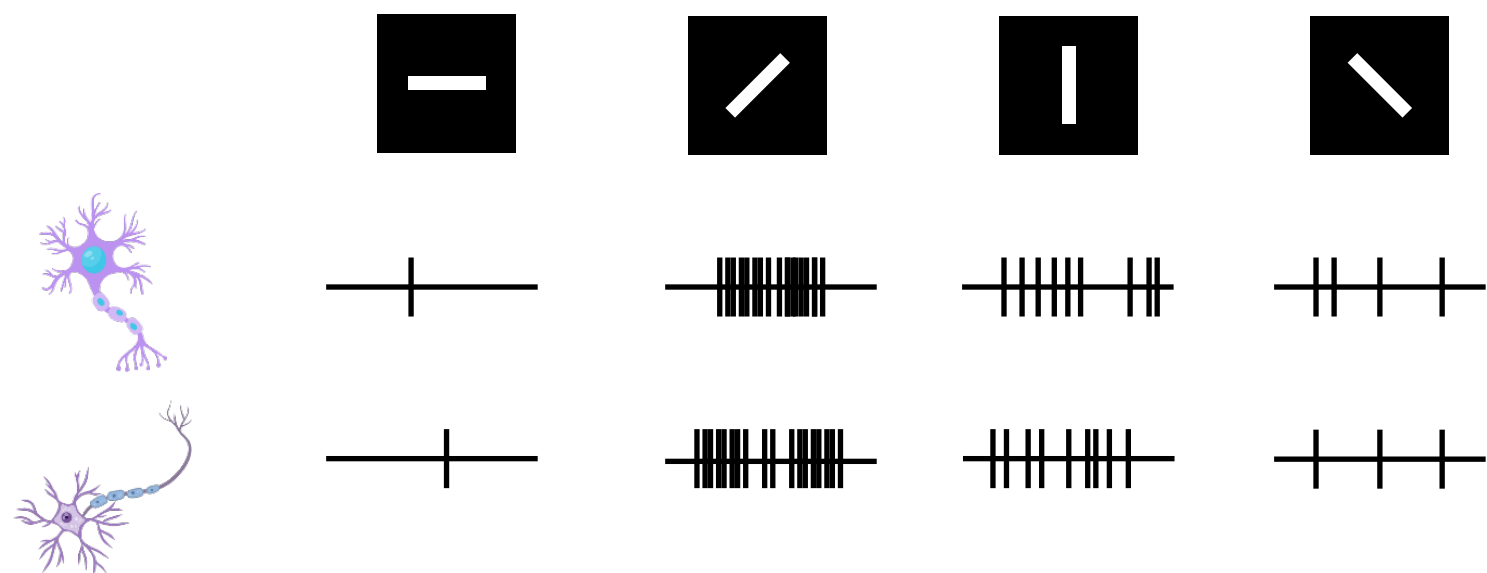


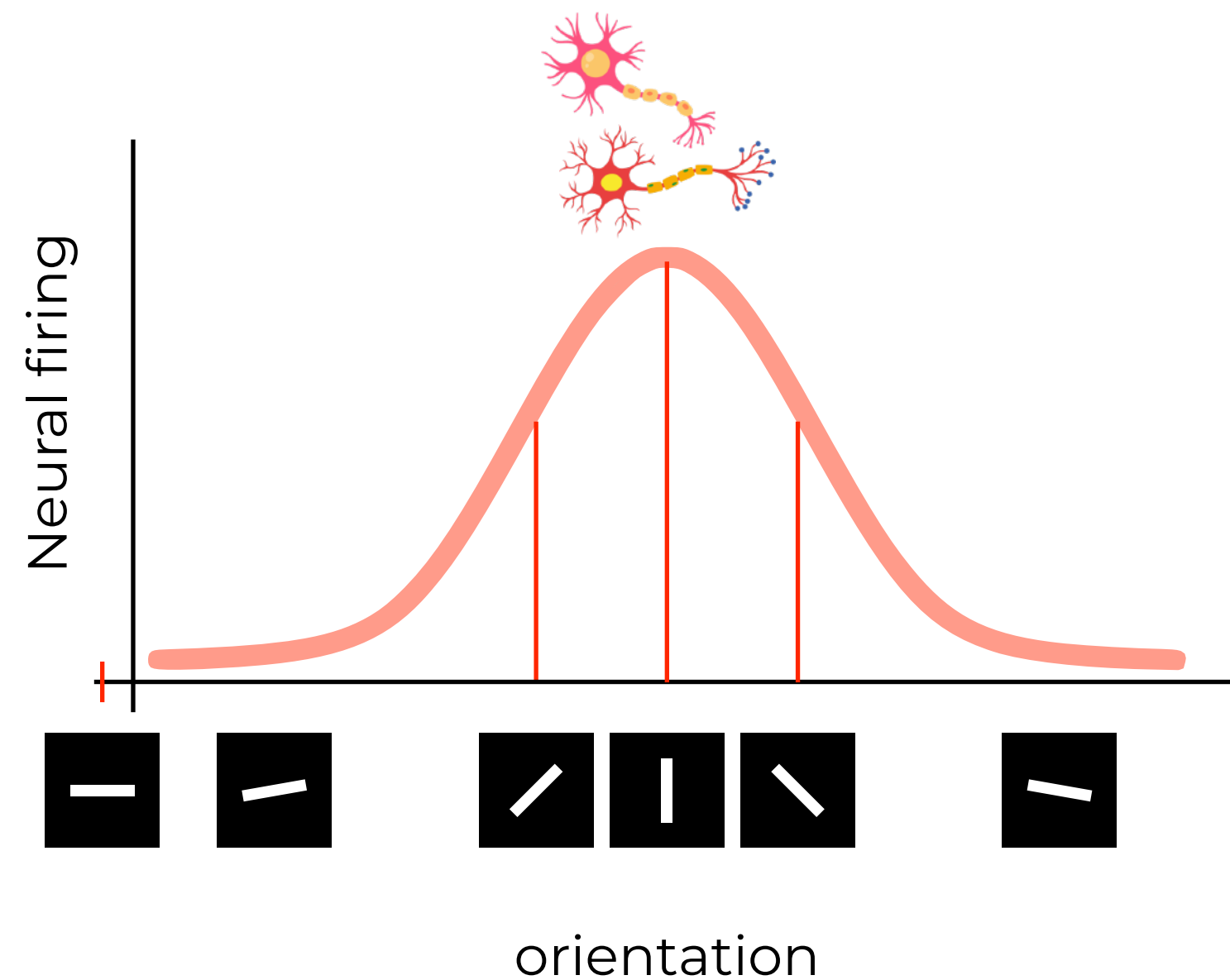
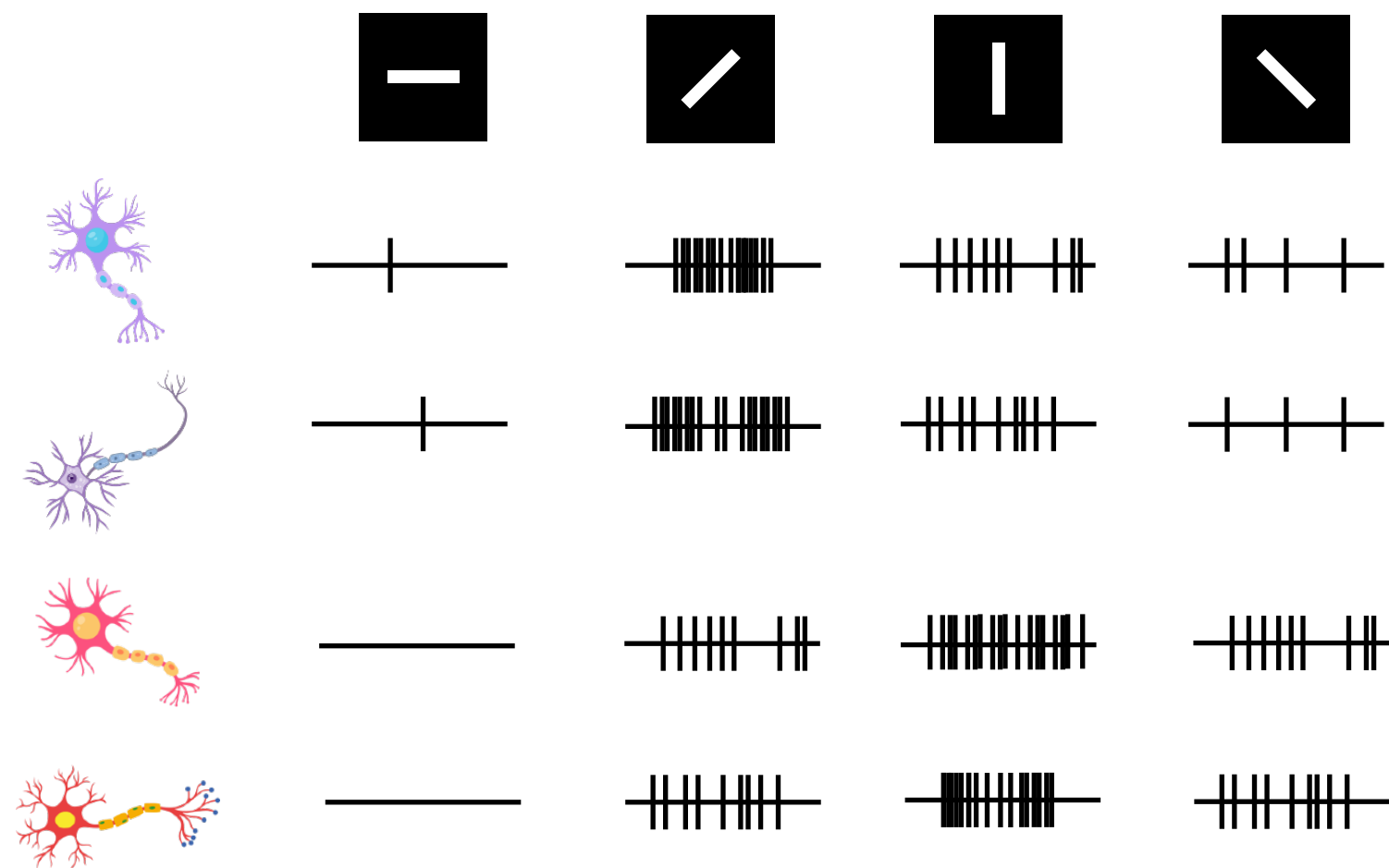
The Basics

Itthi Chatnuntawech

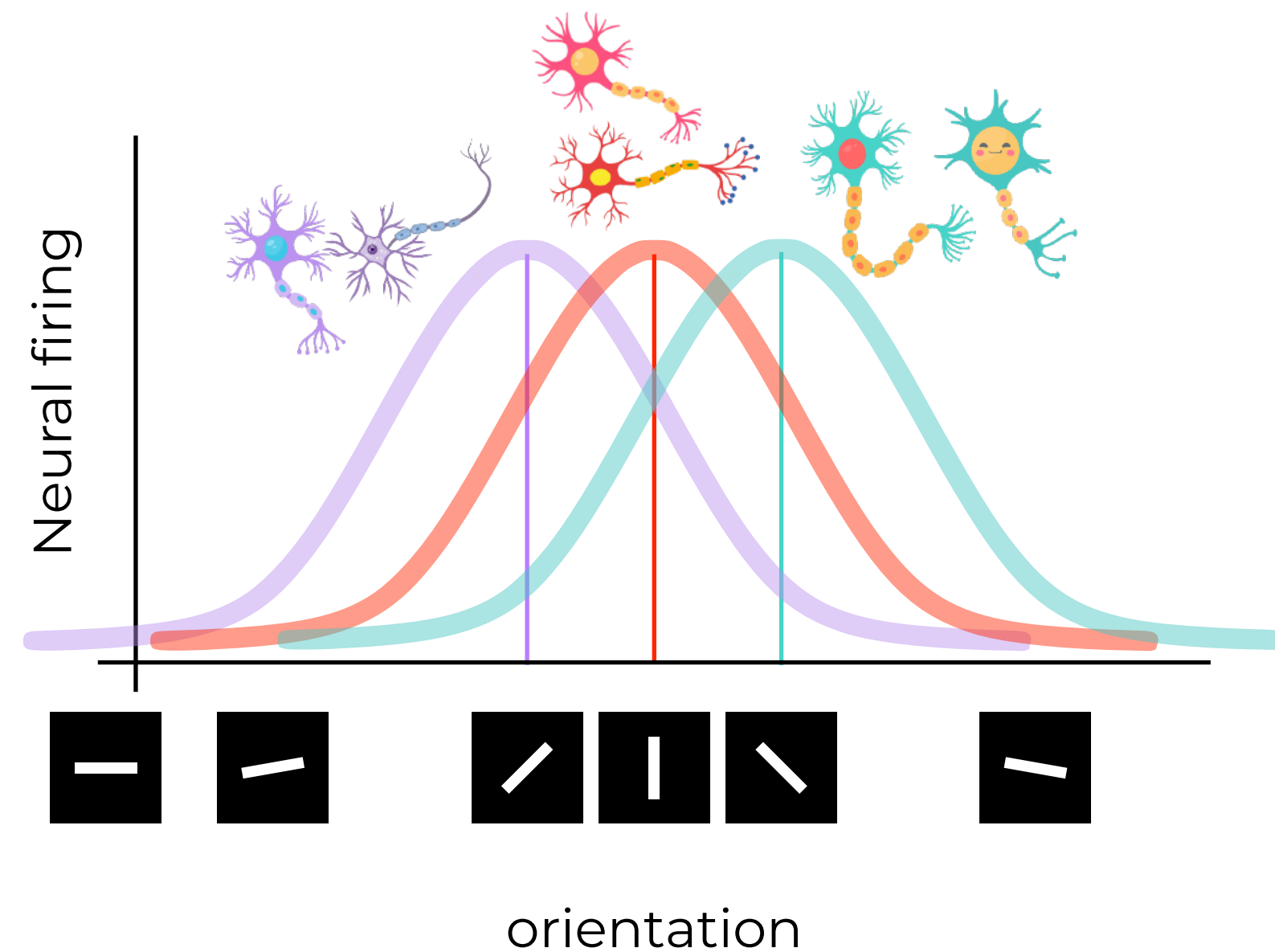
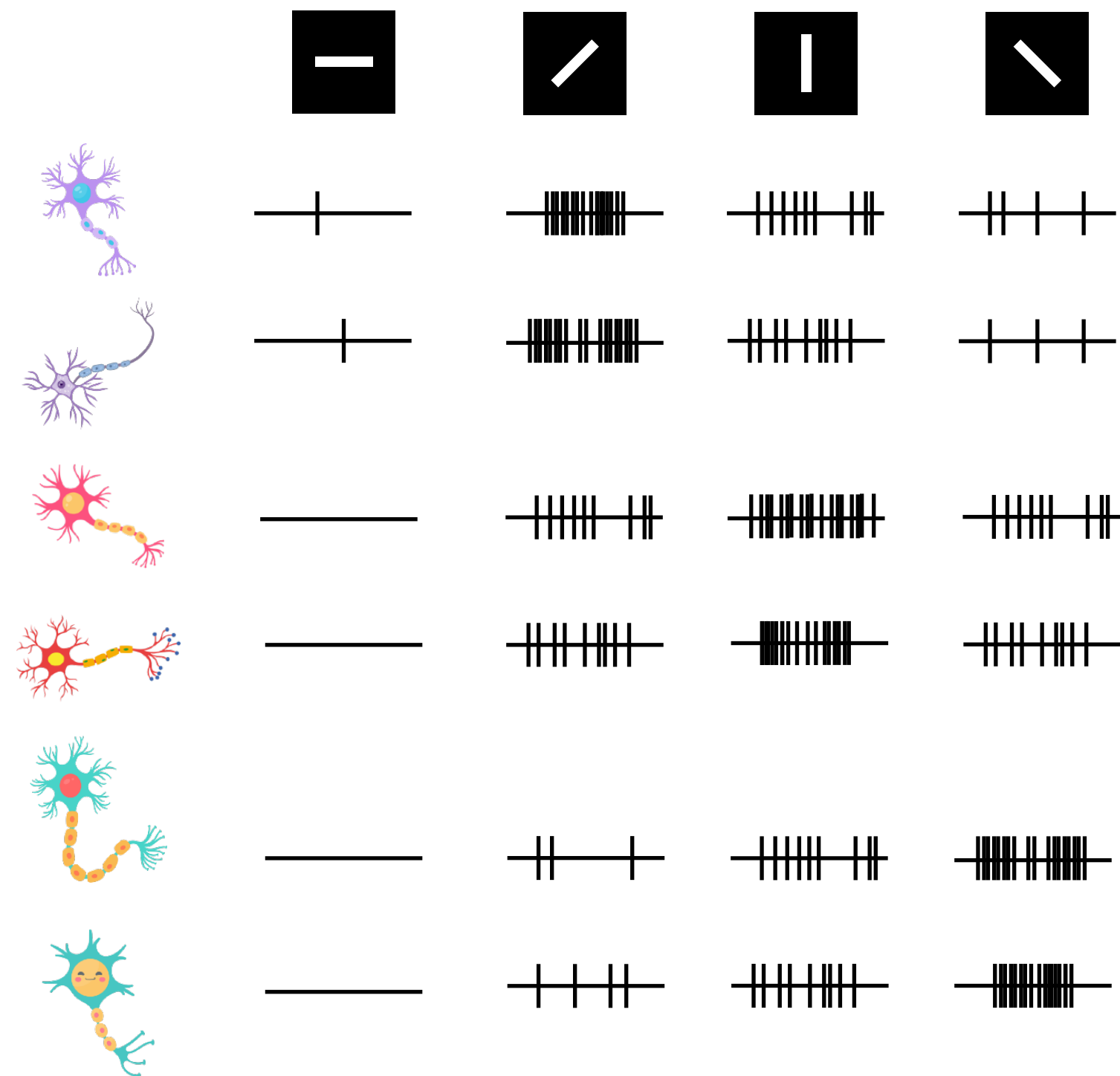
Data Visualization



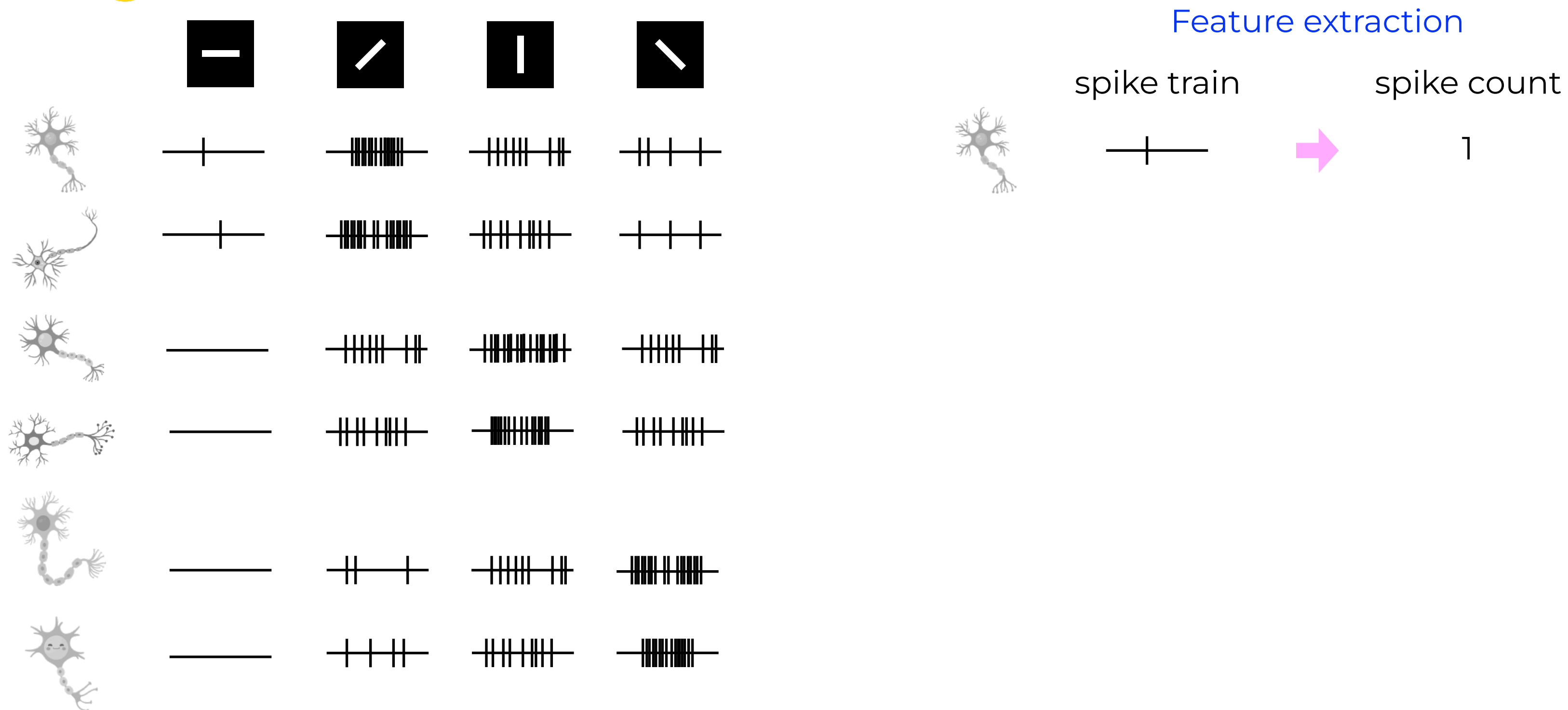
Data Visualization



Data Visualization

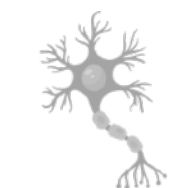
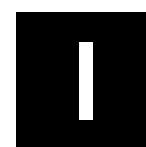
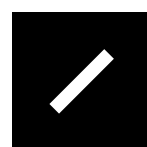


Data Visualization



Data Visualization

feature 1 feature 2 feature 3 feature 4

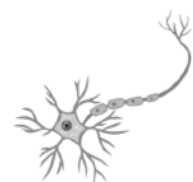


1

18

9

4

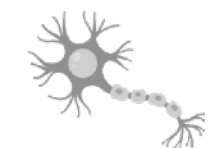


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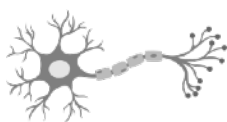


0

10

22

8

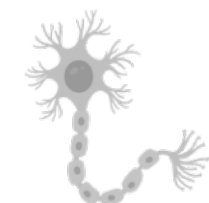


0

11

17

9

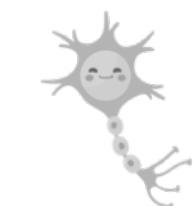


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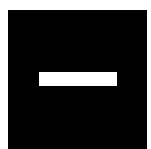
4

10

23

Data Visualization

feature 1



1

1

0

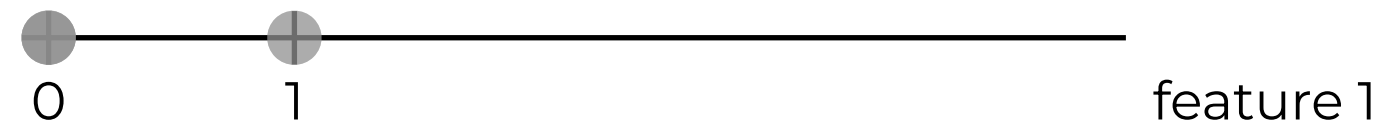
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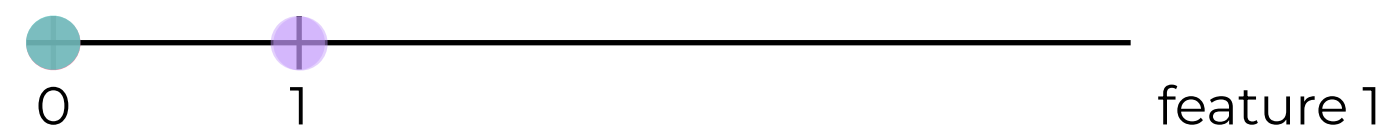
0

What we see

1D feature space



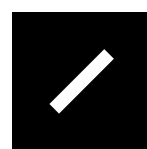
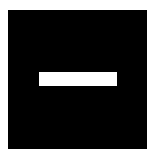
True colors (we do not get to observe)



Data Visualization

feature 1

feature 2



1

18

1

20

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0

11

0

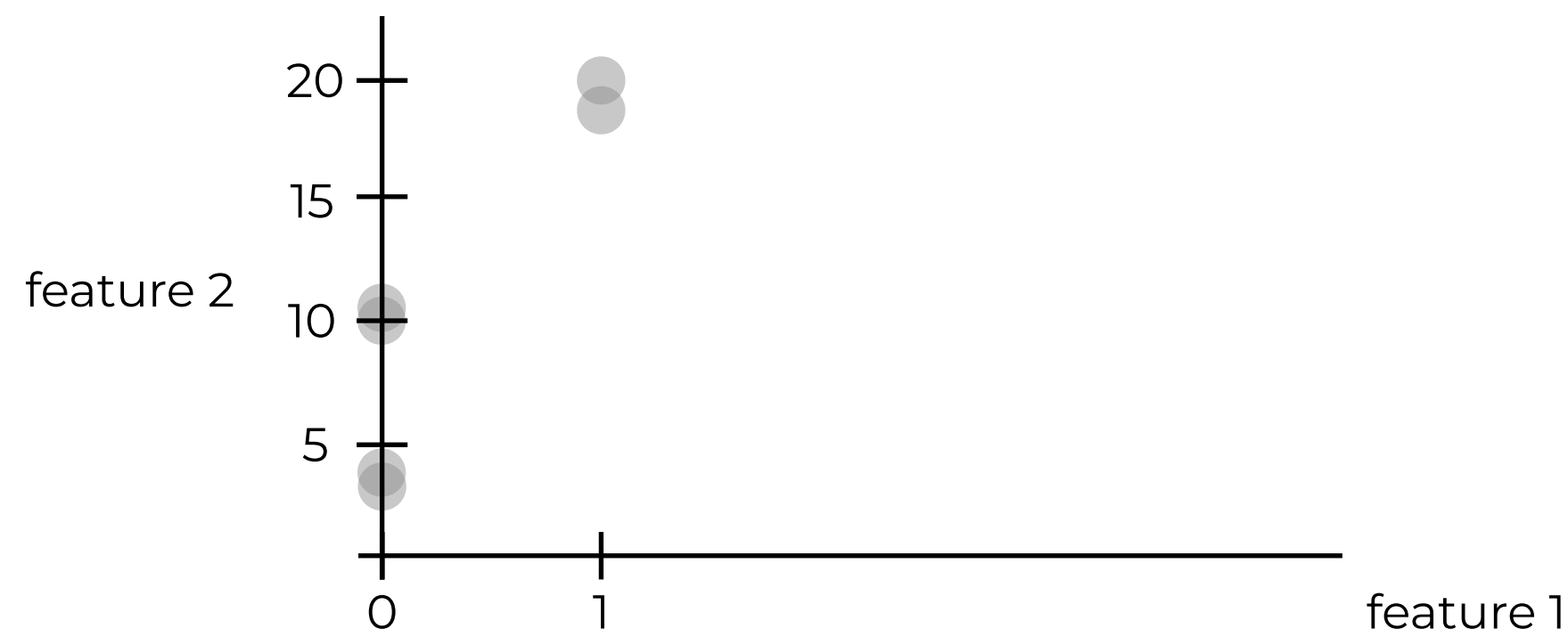
3

0

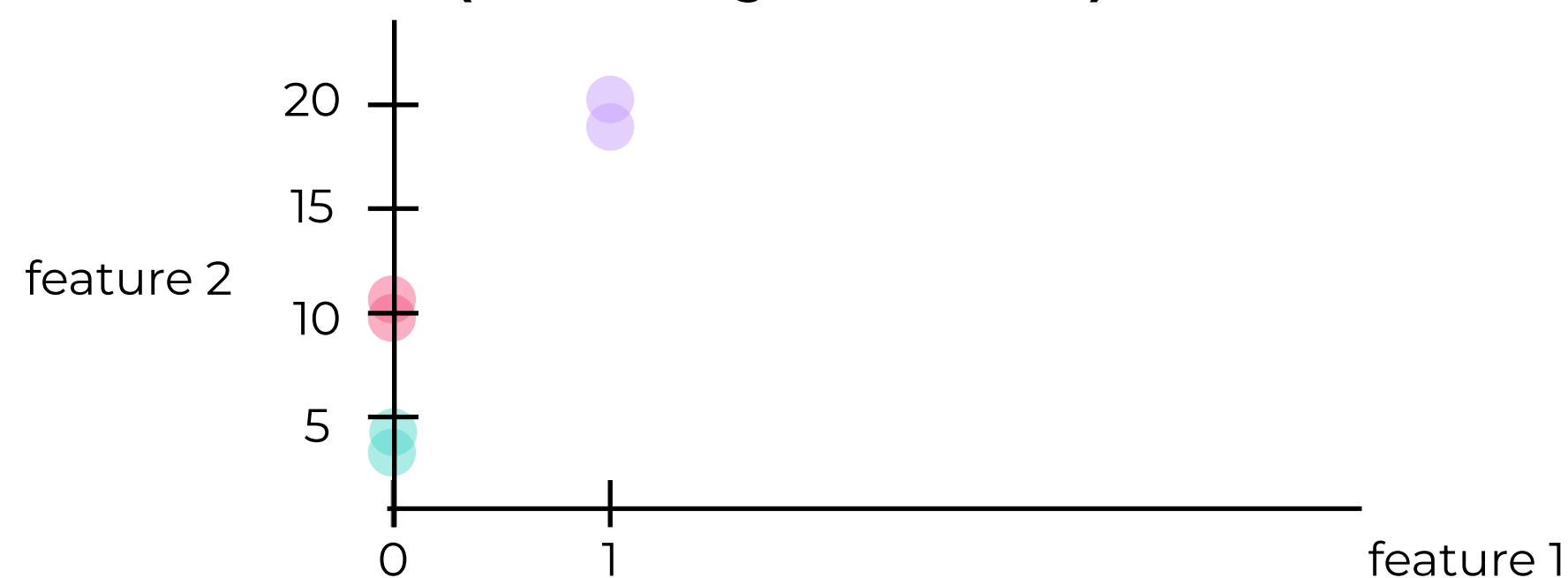
4

2D feature space

What we see



True colors (we do not get to observe)



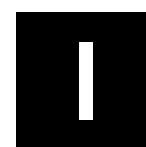
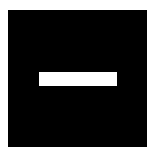
Data Visualization

3D feature space

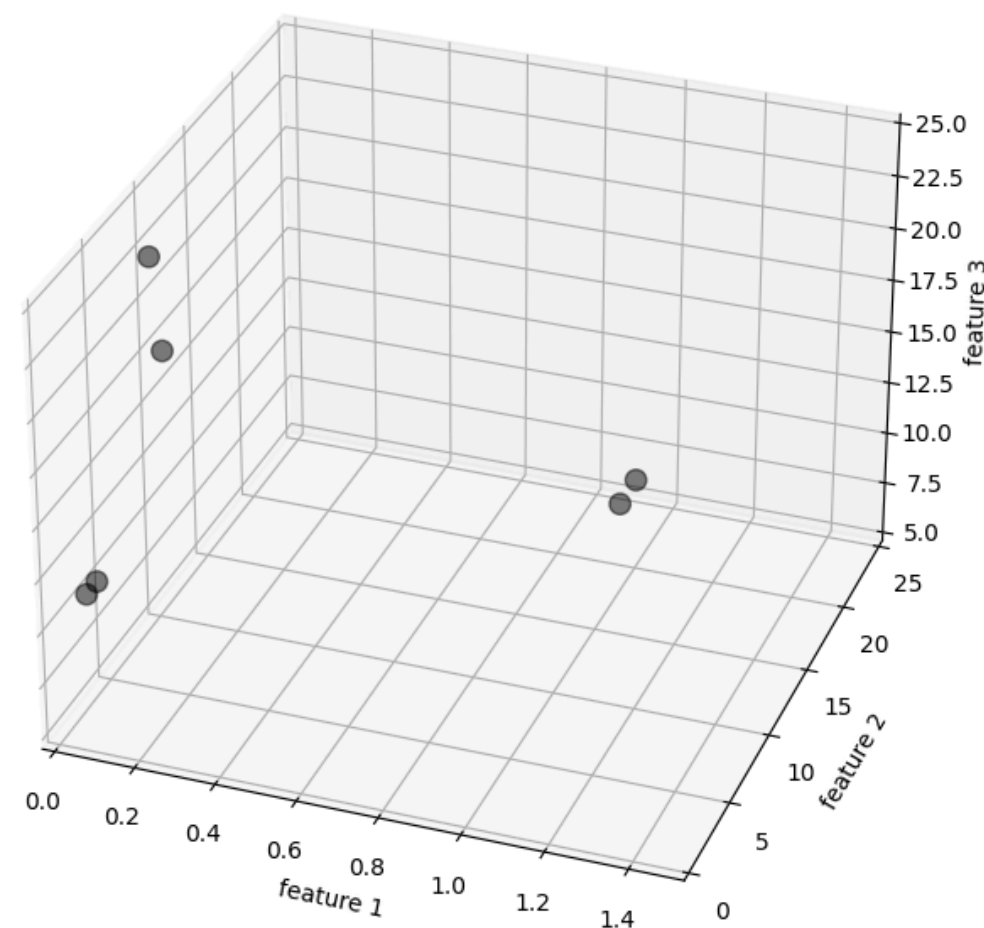
feature 1

feature 2

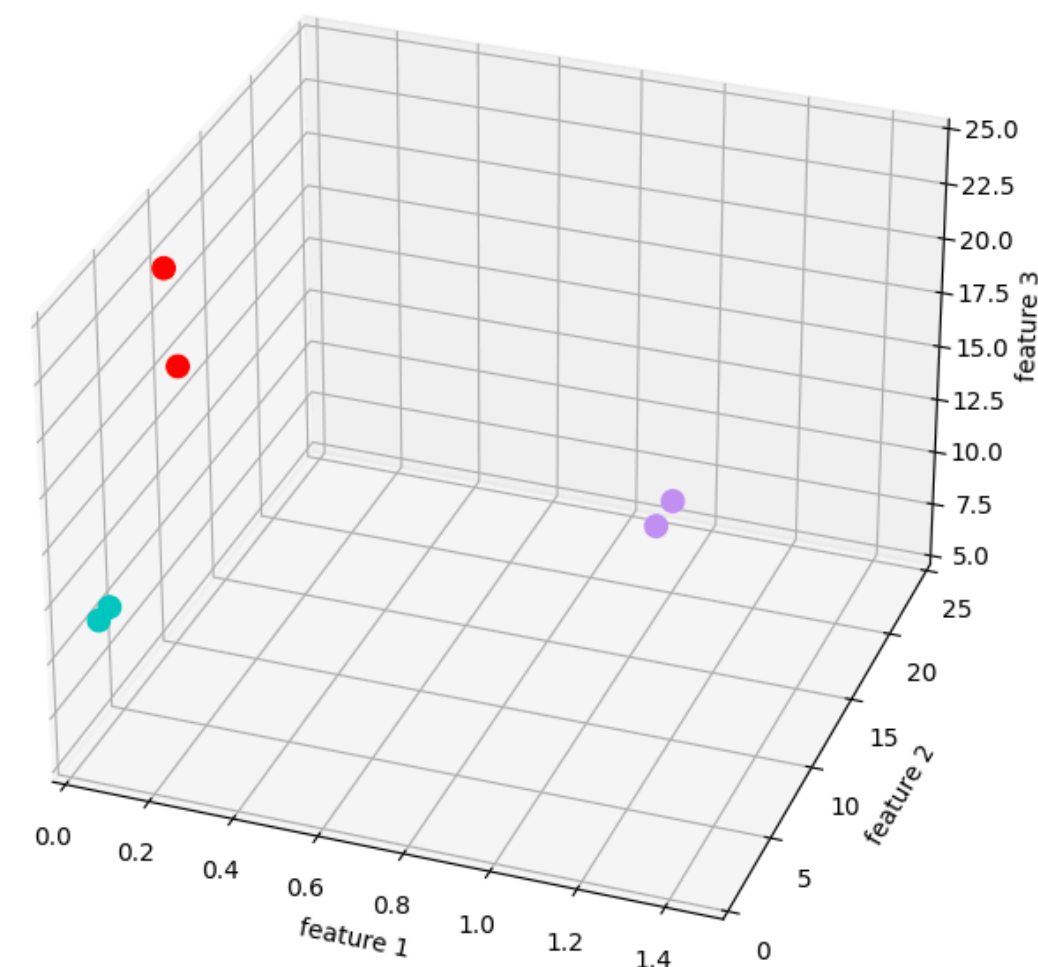
feature 3



What we see

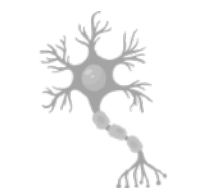
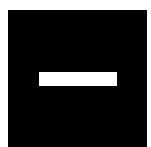


True colors (we do not get to observe)



Data Visualization

feature 1 feature 2 feature 3 feature 4



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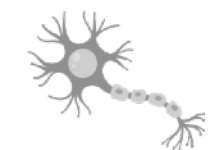


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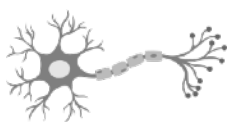


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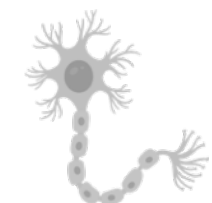


0

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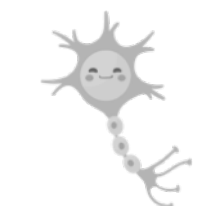


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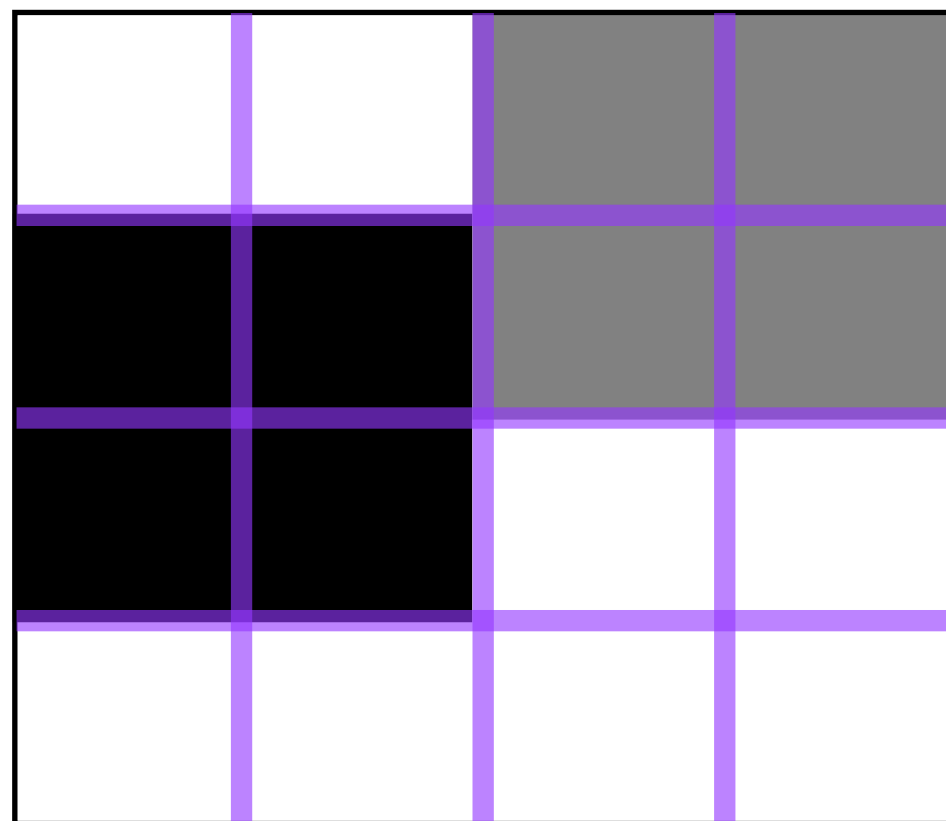
10

23

4D feature space



Grayscale Images



4 x 4 pixels

2D array

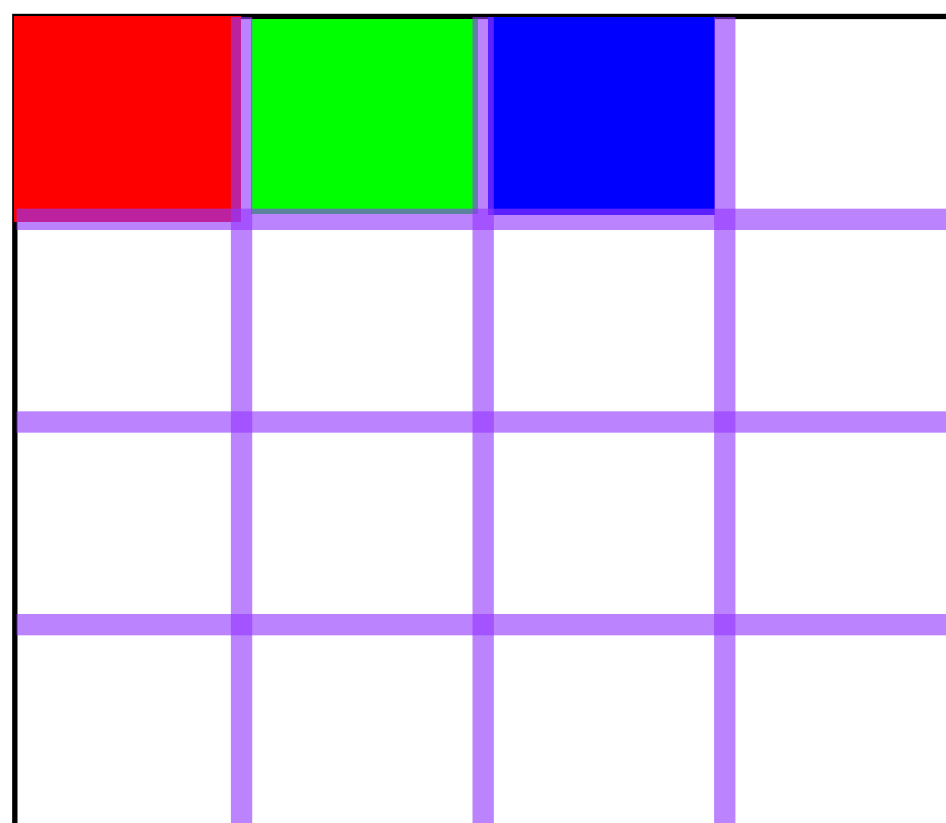
255	255	120	120
0	0	120	120
0	0	255	255
255	255	255	255

vector

	255	feature 1
	0	feature 2
	0	
	255	
	255	
	0	
	0	
	255	
		⋮
	120	
	120	
	255	
	255	
	120	
	120	
	255	
	255	feature 16

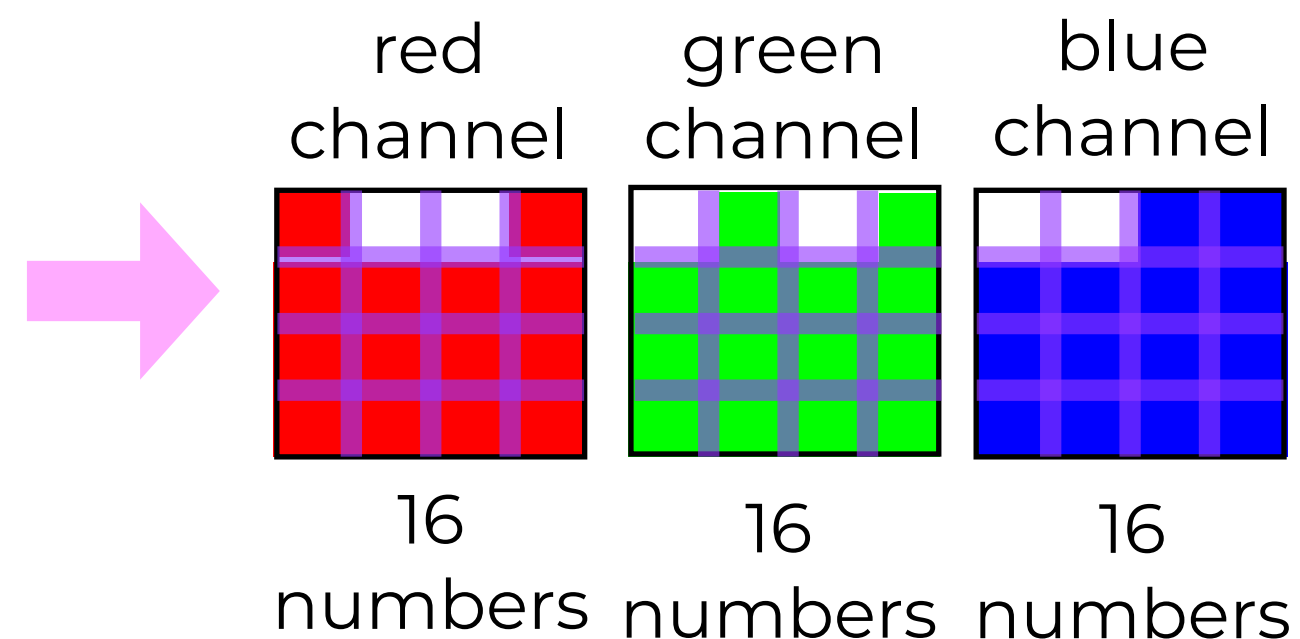
16-dimensional feature space!

RGB Images

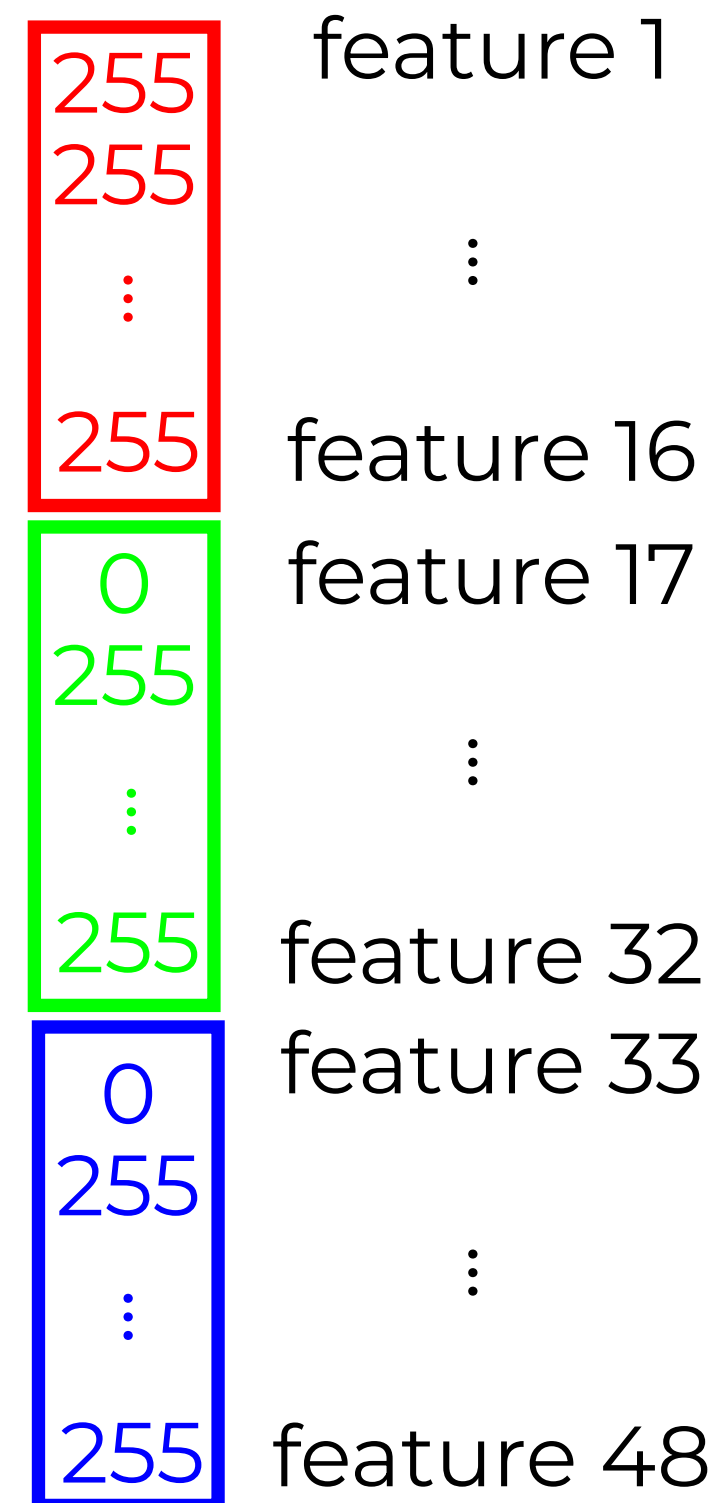


4 x 4 pixels

2D-arrays

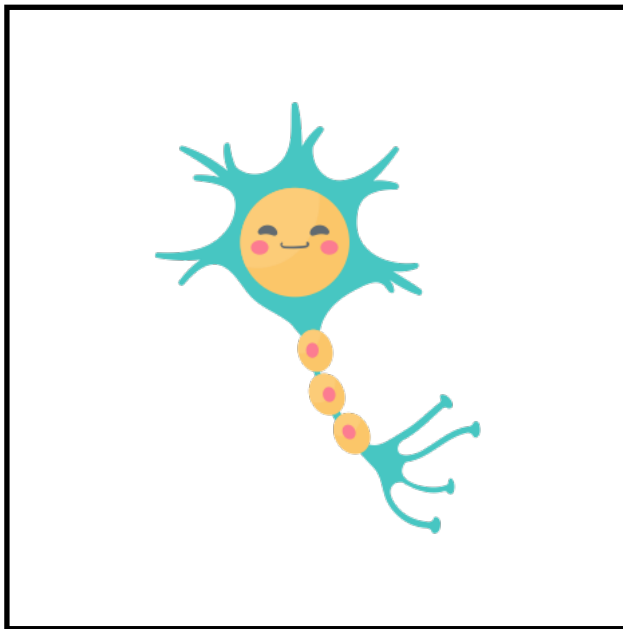


vector



48-dimensional feature space!

RGB Images



1024 x 1024 pixels

If we use raw pixels as features, we will have

$$1024 \times 1024 \times 3 = 3,145,728 \text{ features.}$$

of
rows

of
columns

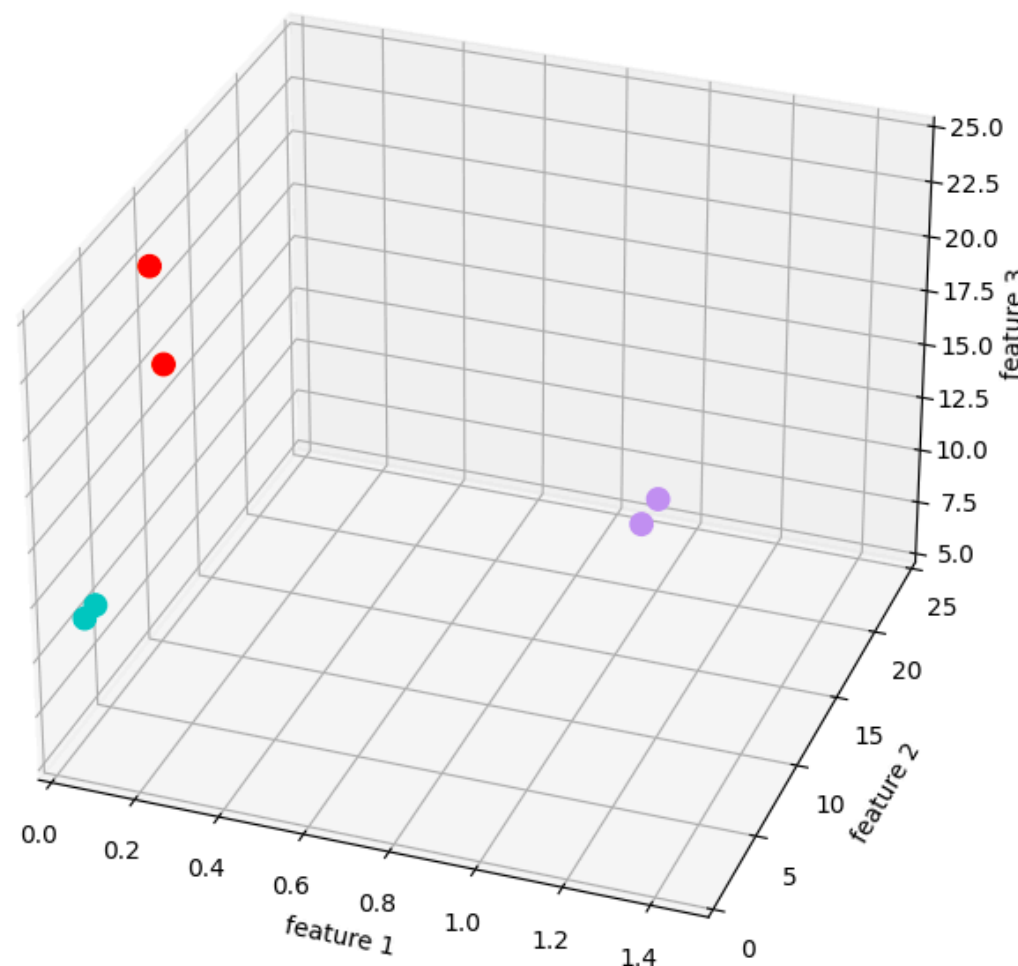
of
channels

3,145,728-dimensional feature space!

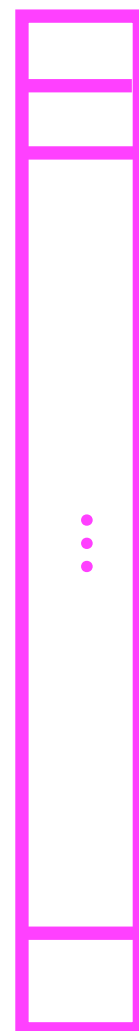
Dimensionality Reduction

data visualization

reduced computational resources



high-dim
space



low-dim
space



data analysis in
lower dimensional
space

