

Exercise 1.3

Part a

Answer: We know $y(t)$ is equal to 1 or -1, and we know when $x(t)$ is misclassified by $w(t)$ $y(t) \neq \text{sign}(w^T(t)x(t))$. So if we multiply $y(t)$ by $(w^T(t)x(t))$, it will always give a negative number.

Part b

Answer: As we know $w(t+1) = w(t) + y(t) + x(t)$,

We can substitute in the left hand side of the equation,

which gives us $y(t)w^T(t+1)x(t) = y(t)w^T(t)x(t) + y(t)^2 + x(t)^2$;

Since $y(t)$ is equal to 1 or -1, $y(t)^2$ is equal to 1, and $x(t)^2$ is equal or greater to zero, so adding 1 and a non-negative number will always make number greater than itself,

so $y(t)w^T(t+1)x(t) > y(t)w^T(t)x(t)$

Part c:

Answer: from part a we know that when $x(t)$ is misclassified by $w(t)$ $y(t)w^T(t)x(t)$ is less than zero. And if $x(t)$ is right classified by $w(t)$, $y(t)w^T(t)x(t)$ is greater or equal to zero, so the goal is to update $w(t)$ to make $y(t)w^T(t)x(t)$ be greater or equal to zero, and from part b we know updating $w(t)$ to $w(t+1)$ where $w(t+1) = w(t) + y(t) + x(t)$ will add a positive number to $y(t)w^T(t)x(t)$. Therefore updating $w(t)$ to $w(t+1)$ is moving in the right direction because it makes the formula, $y(t)w^T(t)x(t)$, be close to the goal, which is greater or equal to 0.

Exercise 1.5

Part A: Learning Approach.

Part B: Design Approach.

Part C: Learning Approach.

Part D: Design Approach.

Part E: Learning Approach.

Exercise 1.6

Part a:

Type of learning: Supervised Learning or Unsupervised Learning

Training Data:

Supervised Learning:

Providing data of what books users have read and also did users like each book. So it will be able to recommend based on books user liked

Unsupervised Learning:

Only providing data of books users read. It will only be able to provide data based on books users read.

Part B:

Type of learning: Reinforcement Learning

Training Data:

Giving the rule and asking it to play against other people and give some feedback or reward if it wins.

Part C:

Type of learning: Unsupervised Learning

Training Data: Giving movie information like what actors in the movie, which country made the movie, what genre is the movie.

Part D:

Type of learning: Reinforcement Learning

Training Data: ask it to make music and give feedback for every music it makes.

Part E:

Type of Learning: Supervised Learning

Training Data: Giving past year data of customers informations and max allowed debt each customer can have in bank

Exercise 1.7

Part a:

Since there is more black than white, we will take the hypothesis that the next three are all black.

From this hypothesis f8 will agree with all 3; f4, f6, f7 agree with 2; f2, f3, f5 agree with 1; f1 agree with 0;

So 1 agreed with all 3, 3 agree with 2, 3 agree with 1, 1 disagree with all 3;

Part b:

Since there is more black than white, we will take the hypothesis that the next three are all white.

From this hypothesis f1 will agree with all 3; f2, f3, f5 agree with 2; f4, f6, f7 agree with 1; f8 agree with 0;

So 1 agreed with all 3, 3 agree with 2, 3 agree with 1, 1 disagree with all 3;

Part c:

From the hypothesis, it will be white, white, black for next 3;

f2 will agree with all 3; f1, f4, f6 will agree with 2; f3, f5, f8 will agree with 1; f7 will agree with 0;

So 1 agreed with all 3, 3 agree with 2, 3 agree with 1, 1 disagree with all 3;

Part d:

From the hypothesis, it will be black, black, white for next 3;

f7 will agree with all 3; f3, f5, f8 will agree with 2; f1, f4, f6 will agree with 1; f2 will agree with 0

1 agreed with all 3, 3 agree with 2, 3 agree with 1, 1 disagree with all 3;

Problem 1.1

Let A be chosen bag 1(two black), B be chosen bag 2(one black, one white), b be drawn black ball from bag 1.

From formula $P[A|b] * P[b] = P[b|A] * P[A]$

$P[b] = \frac{3}{4} = 0.75$ (because 3 ball is black out of 4 balls)

$P[b|A] = 1$

$P[A] = 0.5$

$P[A|b] = P[b|A] * P[A] / P[b]$

$= 1 * 0.5 / 0.75$

$= \frac{2}{3} = 0.67$

Problem 1.2

Part a:

It will be separate at $w^T x = 0$;

$$w^T x = w_0 + w_1 x_1 + w_2 x_2 = 0$$

Since $x_2 = ax_1 + b$;

$$w_0 + w_1 x_1 + w_2 x_2 = 0$$

$$w_2 x_2 = -w_0 - w_1 x_1$$

$$x_2 = (-w_0 - w_1 x_1) / w_2$$

$$a = -w_1 / w_2$$

$$b = -w_0 / w_2$$

Part b:

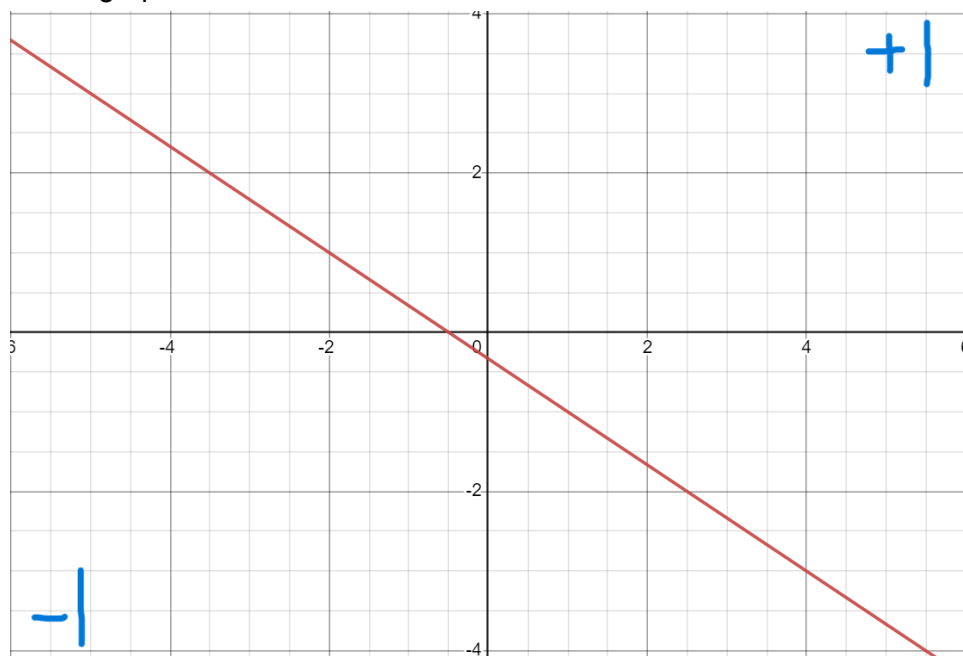
Case 1:

$$W = [1, 2, 3]$$

So we have $a = -2/3$, $b = -1/3$

$$x_2 = -2/3 x_1 - 1/3$$

Here is graph:



Case 2:

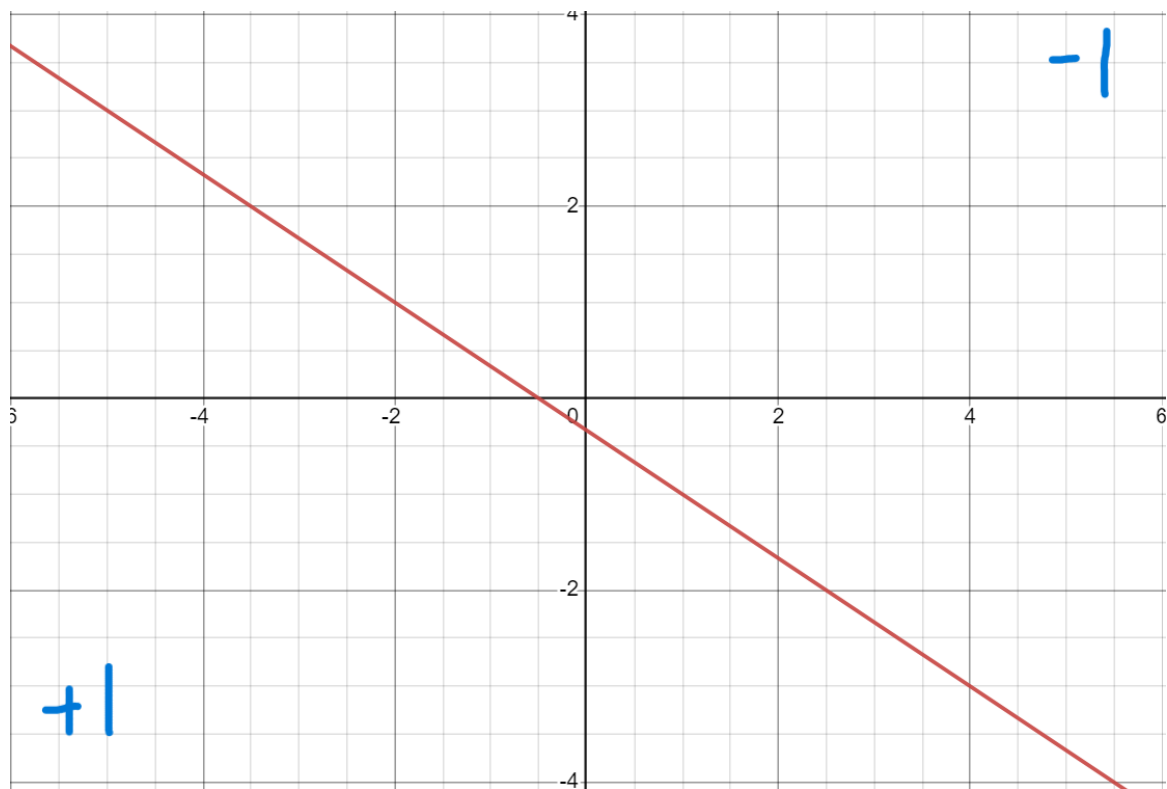
$$W = -[1, 2, 3]$$

So we have $a = 2/3$, $b = 1/3$

$$x_2 = 2/3 x_1 + 1/3$$

The plane is the same but since $y = \text{sign}(w^T x)$, and w is $-w$ now, so the $+1$ area in last case is -1 in this case and -1 in last case is $+1$ in this case;

Here is graph:



Problem 1.4:

My target line on the plane is $y = 3x + 4$, with W where $w_0 = -8$, $w_1 = -6$, $w_2 = 2$

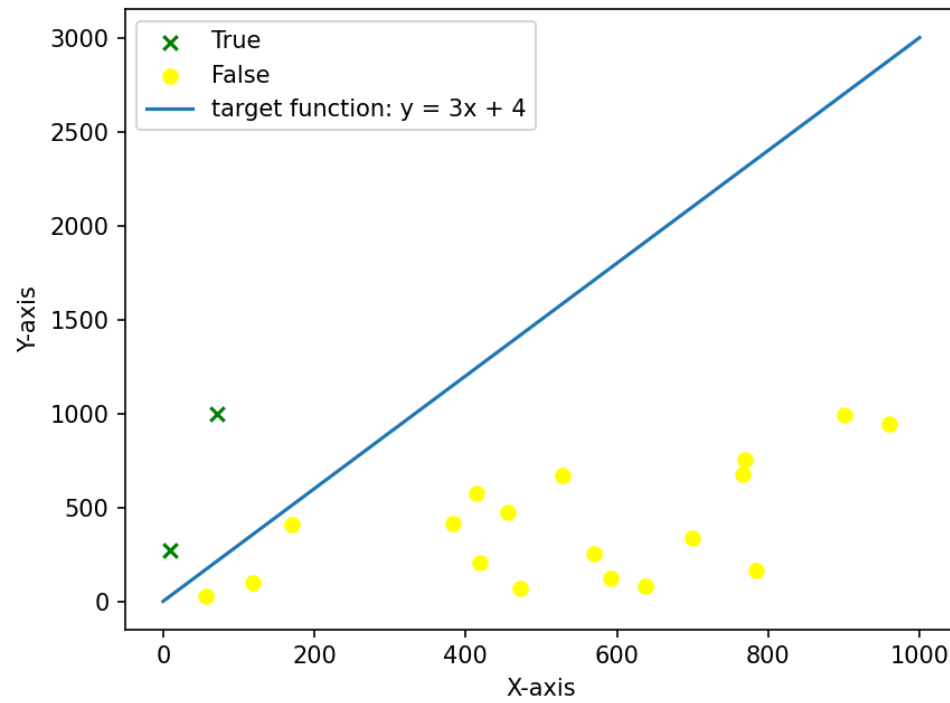
And I will start with W where $w_0 = 0$, $w_1 = 0$, $w_2 = 0$;

So on the plane we have $y = 0$ at the start

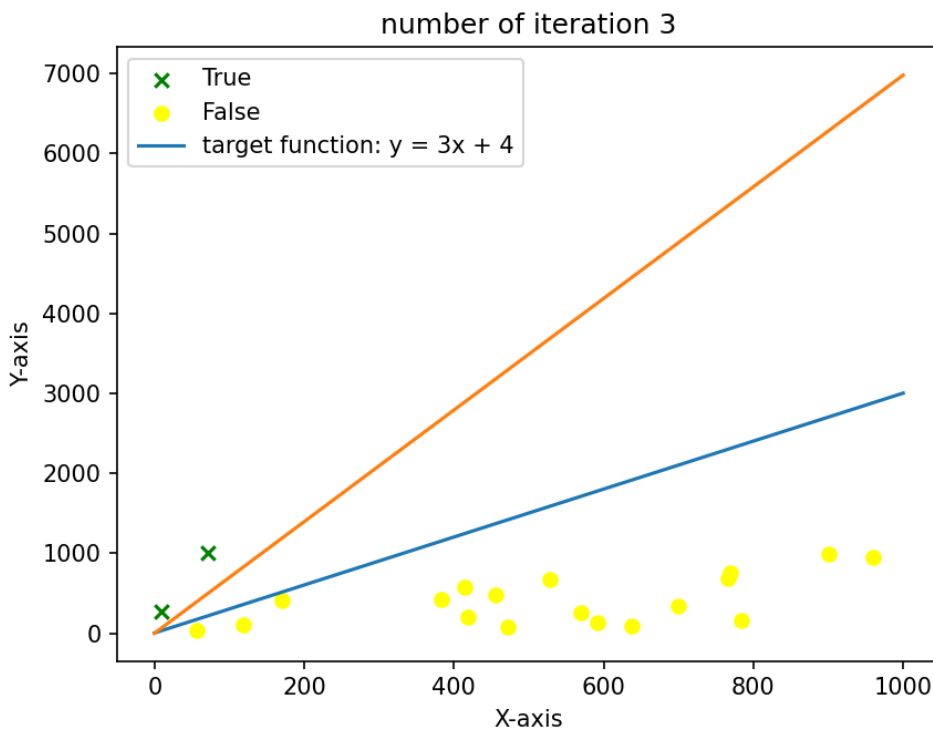
On each graph in this question the blue line is the target function f , the red line is function f .

The green "x" represent $y = 1$; the yellow "o" represent $y = -1$

Part a:



Part b:

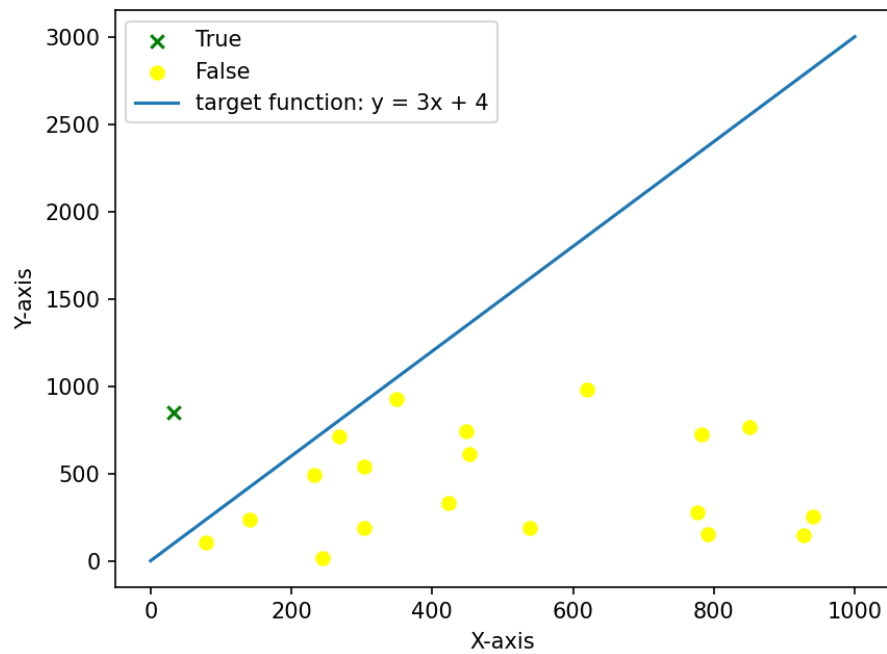


It made 3 updates

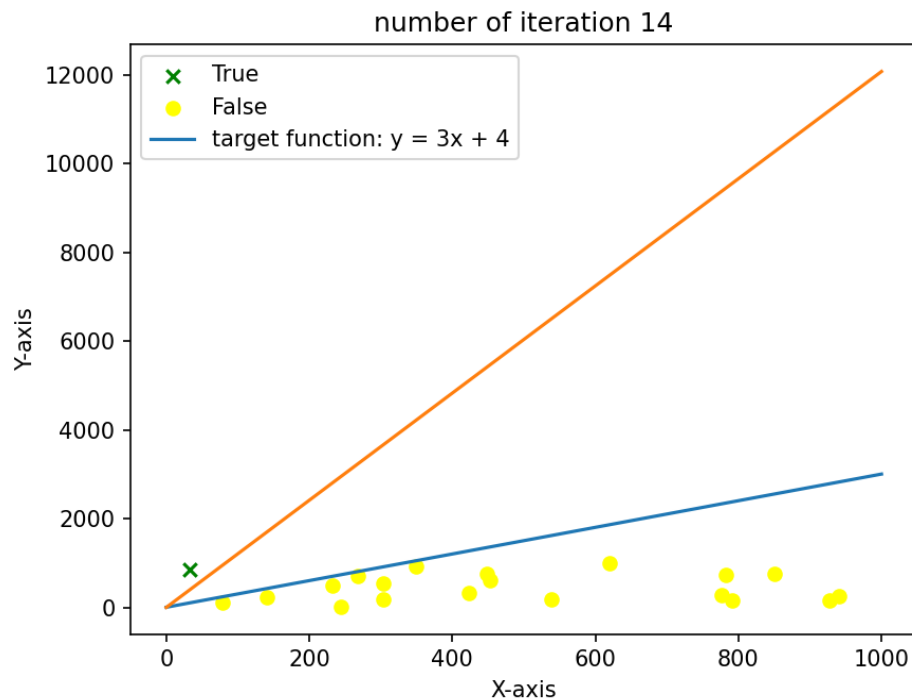
As we can see here is a big difference between f and g.

Part c:

Datas:



Result:

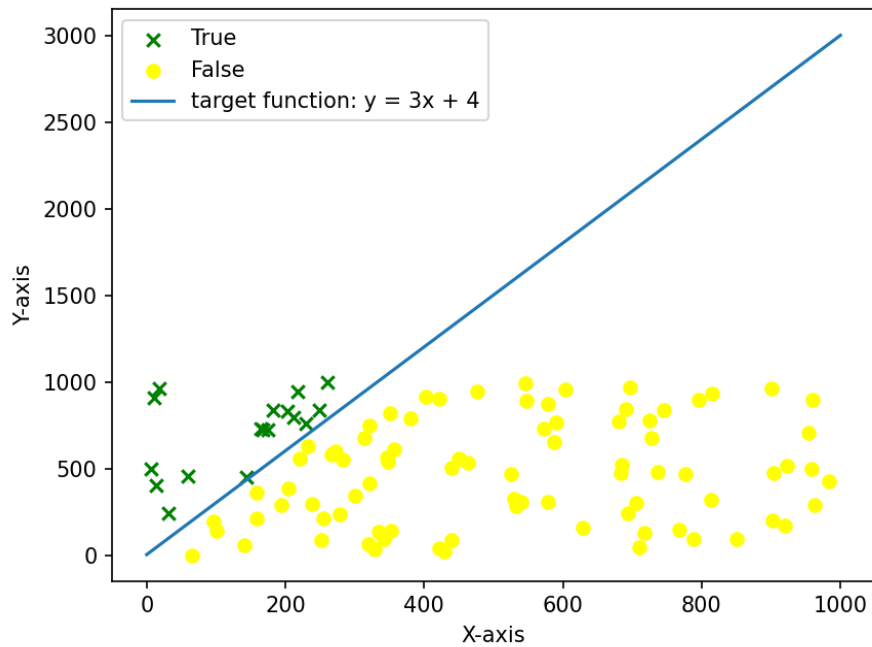


It made 14 updates

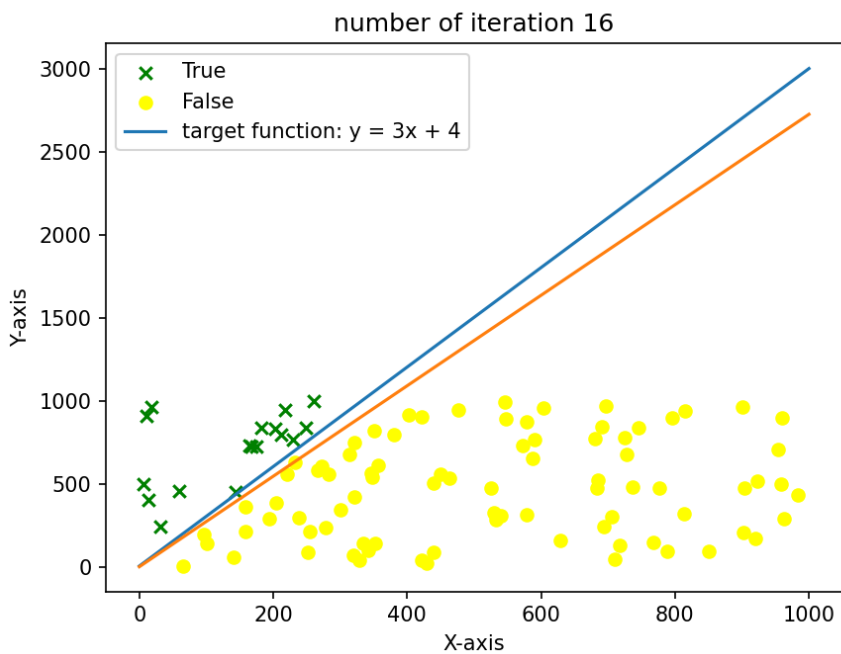
Compared with part b, the gap between g and f is still very big. But in this data set it made more updates.

Part d:

Datas:



Result:

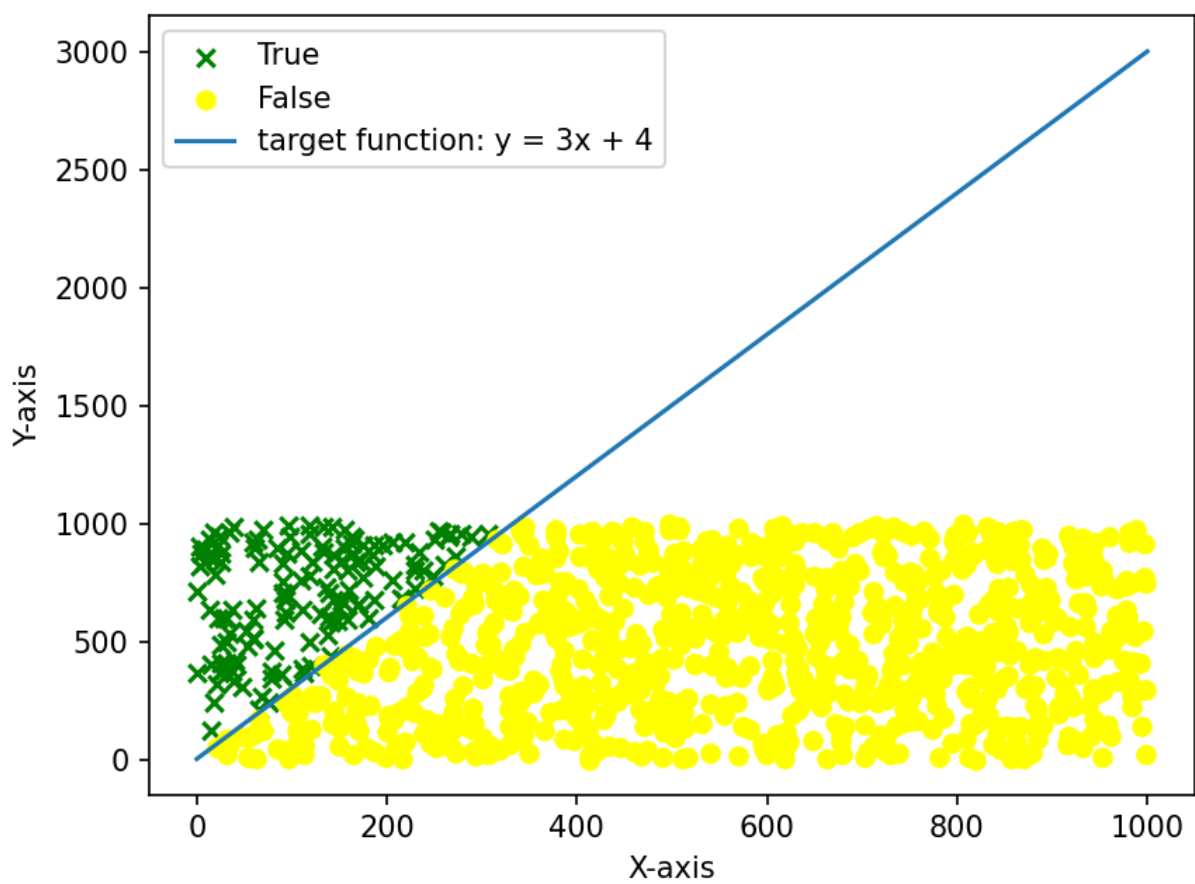


It made 16 updates.

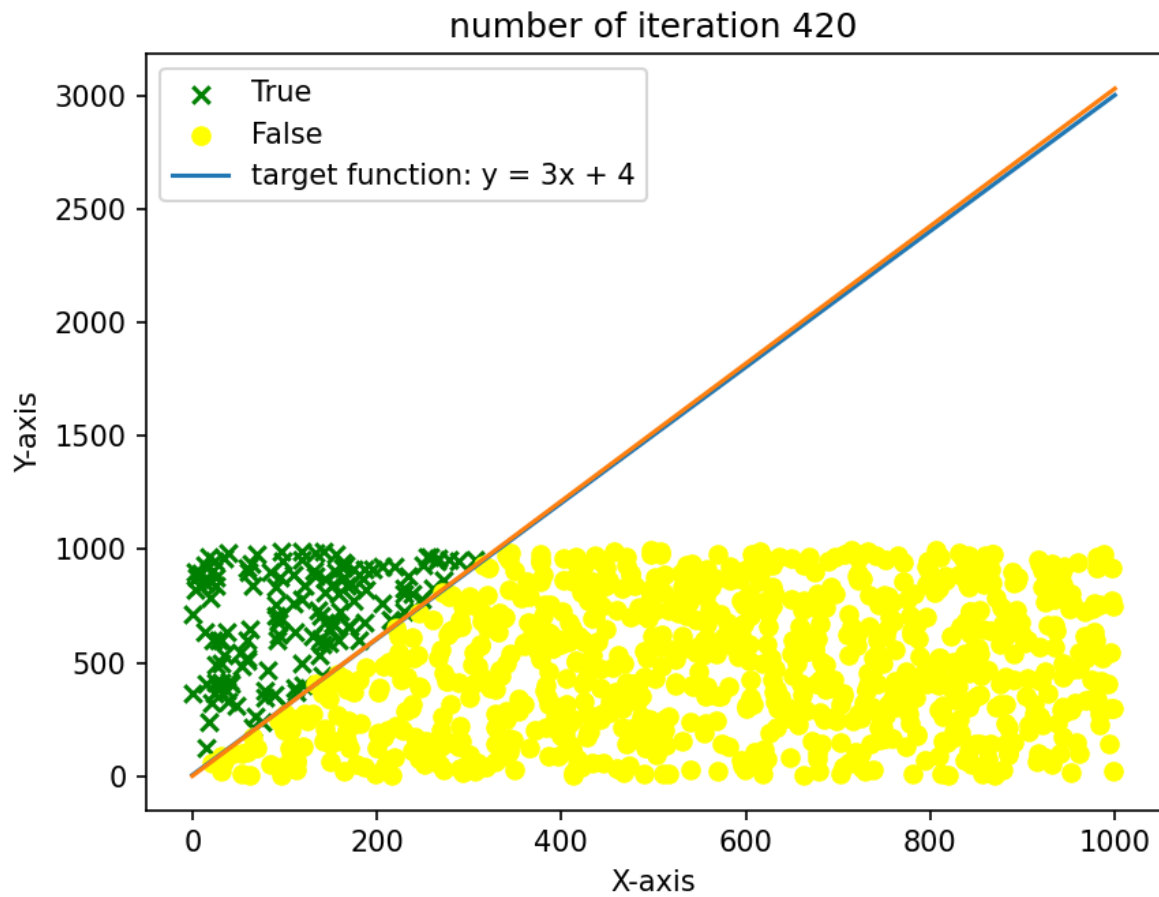
Compared with part b, we can see the gap is much smaller, and it took more updates.

Part e:

Datas:



Result:



It made 24 updates.

Compare with part b, now g is almost the same as f , and takes much much much more updates to reach this