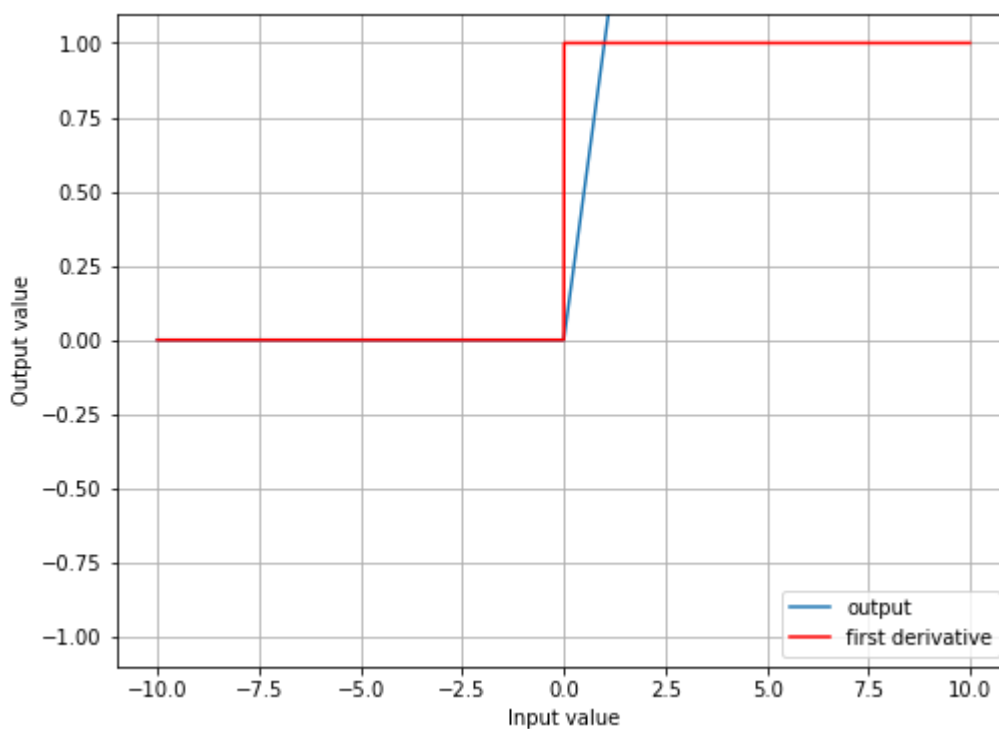


PW09

Auteurs : Pedro Costa, Louis Delabays, Jonathan Guerne

ReLu implementation

```
def ReLu(neta):  
    output = neta.copy()  
    output[output < 0] = 0  
  
    d_output = neta.copy()  
    d_output[d_output >= 0] = 1  
    d_output[d_output < 0] = 0  
  
    return (output, d_output)
```

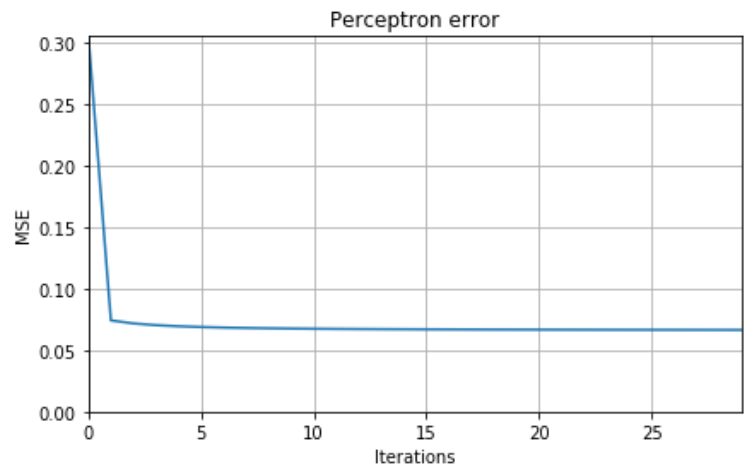
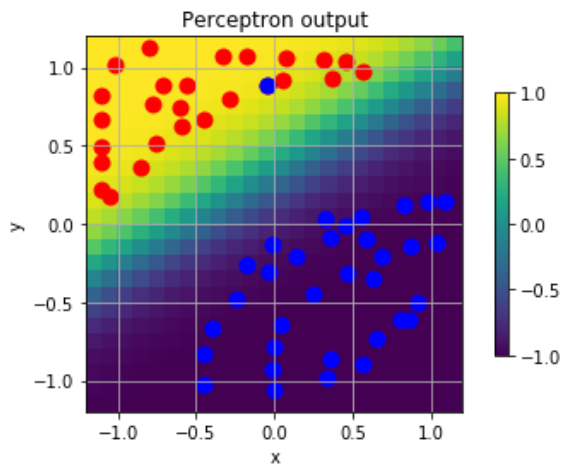


Weight will impact the shape of the function on both axis. The higher the weight, the bigger the slope of the derivative (can be a positive or a negative slope depending on the weight sign).

Delta rules

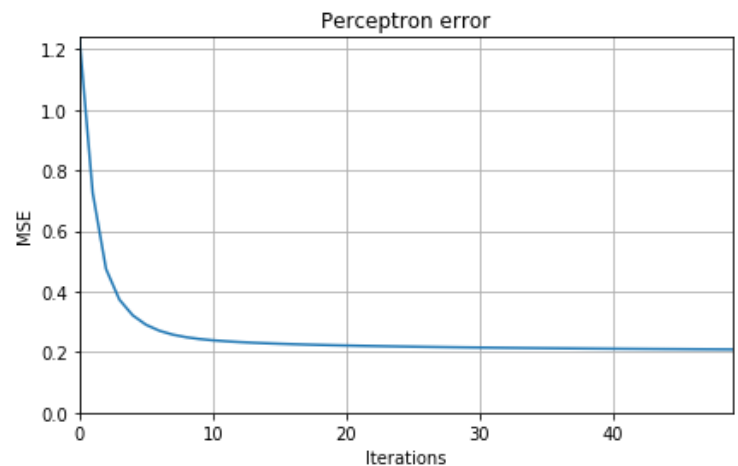
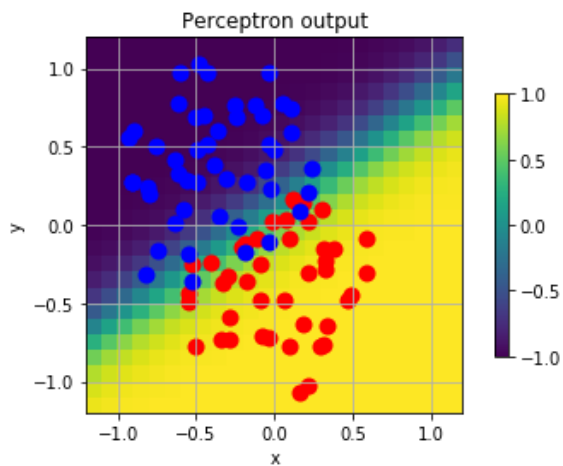
well defined boundaries

Data separated by well defined boundaries can be classified quickly (high convergence speed) and may even use a pretty high learning rate. The error graph will also have little to no oscillations as there might be only one minimum (no local minimum problem).



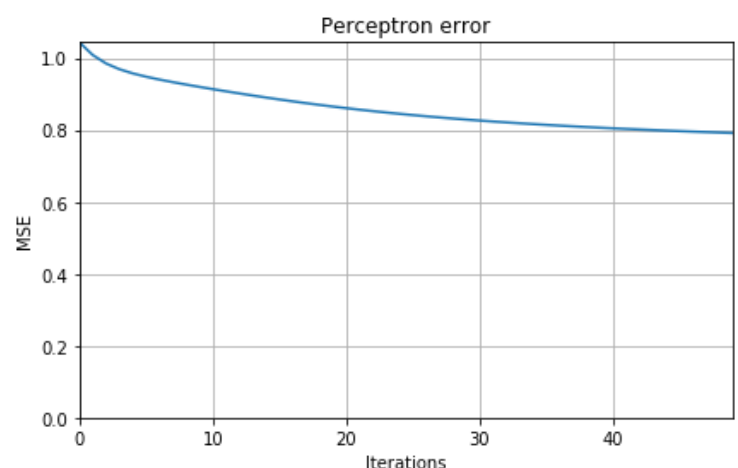
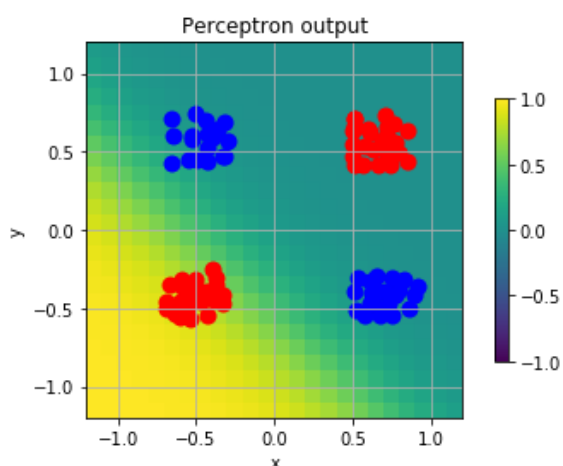
overlapping

Overlapping data will still be separable but the classification will have an higher error. It will take slightly longer to converge and it might be useful to reduce the learning rate (even if it means even more time until convergence) to avoid oscillations.



non separable

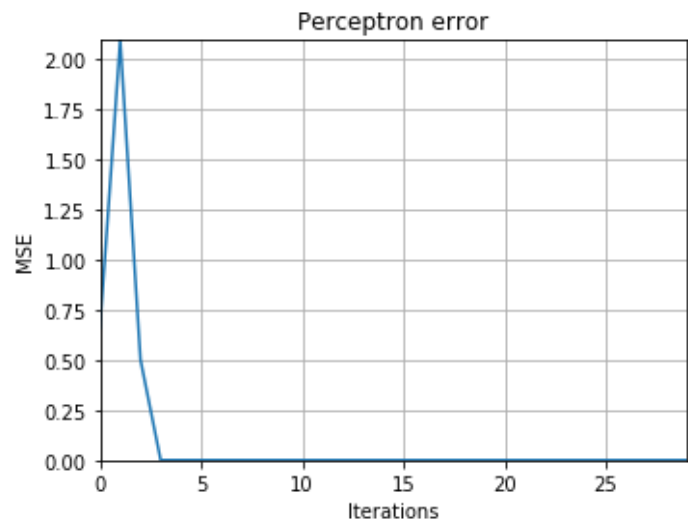
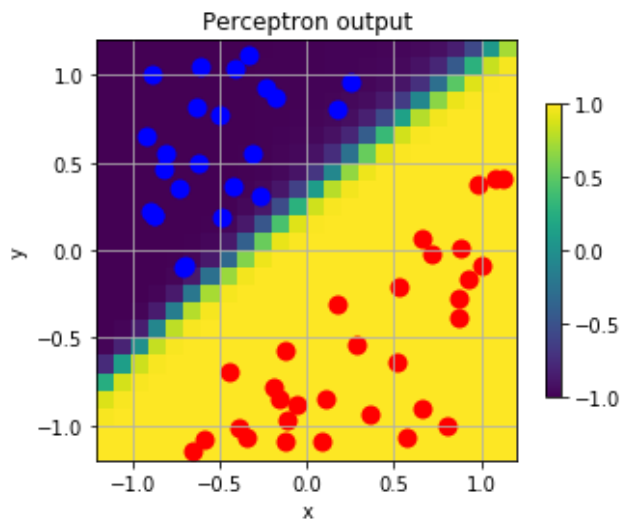
Non-separable data will generate a high error as the algorithm is not capable of properly classify the data using only one line. It will try to minimize the error as shown in the illustration, in our case all the blue data appear in one side. But this is only a local minima and not a global minima as it allow to classify properly one class (blue) but not all classes.



Backpropagation

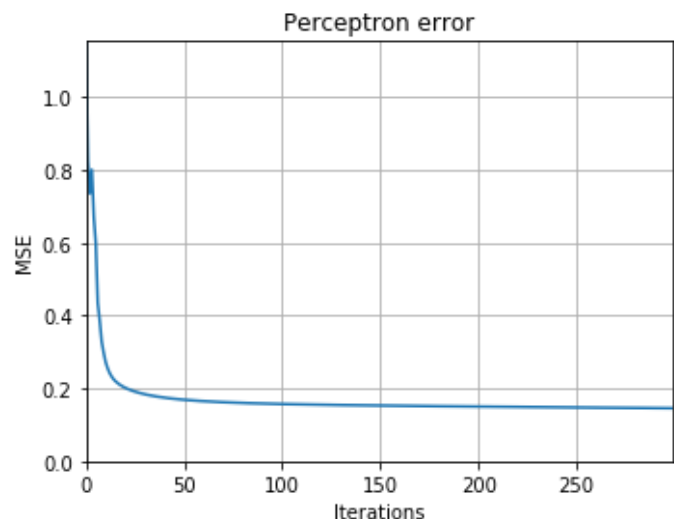
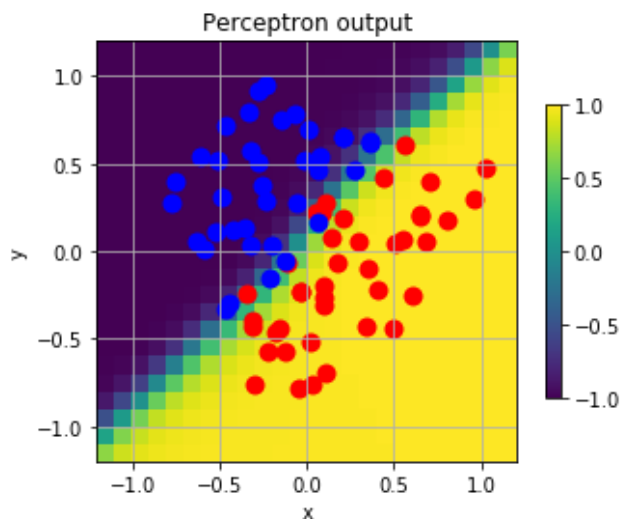
separable data

- may use a big learning rate
- will converge quickly
- more oscillation than a one neuron model



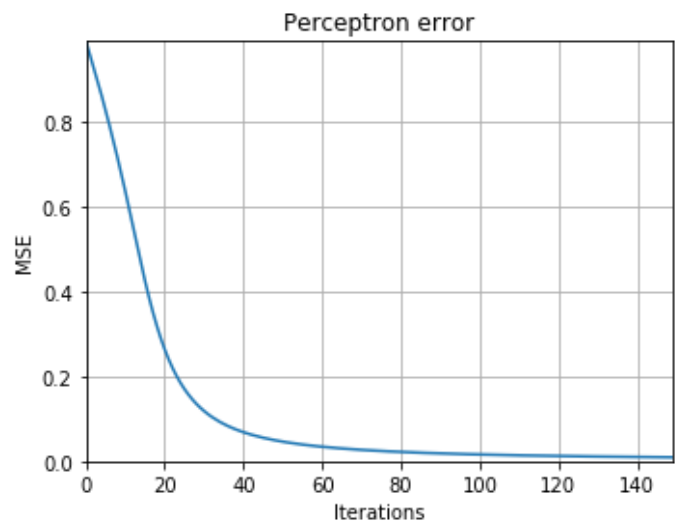
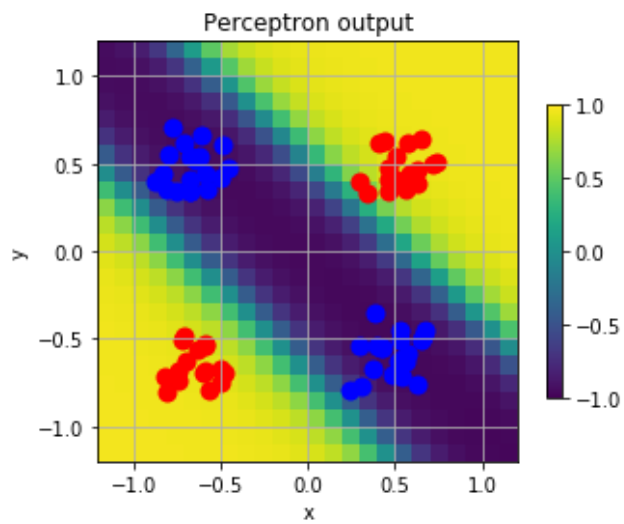
overlapping data

- need a smaller learning rate
- will need more time to converge
- oscillation in error signal will disappear with a lower learning rate



non-separable data

- multiple neurons are able to separate data properly
- not a local minimum anymore



blob

- will trace a line to separate the data as well as possible

