

My name is Itsuo Kumazawa from Tokyo Tech.
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Ask questions and submit report to this
email address.

How to take credits for this course:

There is no examination.

But you have to submit reports
on Five Tasks of programming.

What you should submits:

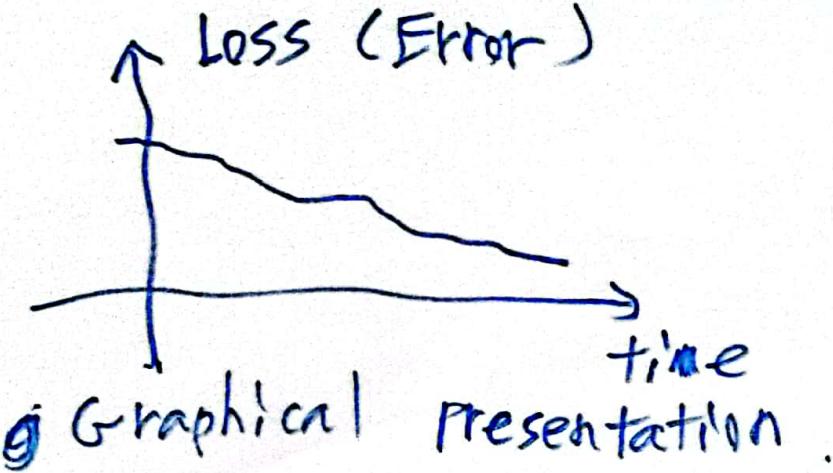
1. One file to explain about the five
tasks.

Word file

PDF file

Jupyter Note book.

- ① The problem
- ② Methods and equations you used
for the programming
- ③ Computation results. Use graphical
representations.



Please appeal your results by using graphs and figures. Just numerics is not good. To work for a company and to present your research results presentation skill is very important. It is more important than the research skill.

④ Please give discussions on the results. ↓ **Most important.**

2. Another file containing the source codes of your program.

python , C , C++ , Matlab

Just calling these functions is not good.
Please use just elementaly (numerical) function. Tell me flow
((Deep learning is so popular, there many functions for programming .

Please submit 1, and 2. for the fire tasks.

{ One file for 1. including ① ② ③ ④
for the fire tasks

One file for 2. including source codes
for the fire tasks.

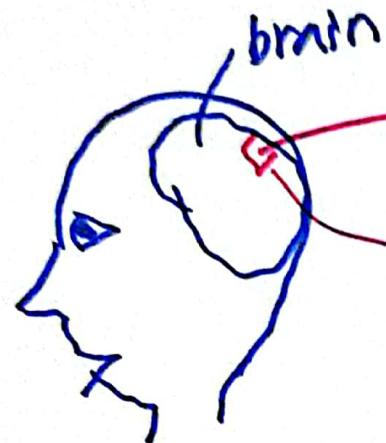
Submit two files by the end of February,
Feb. 29th.

You can use the source codes found in the Net,
But modify them for your own results.

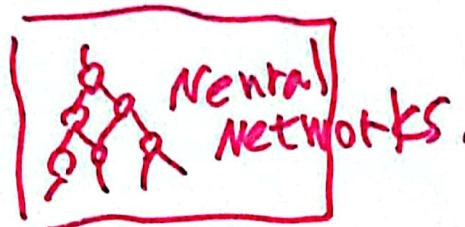
Jan 8th.

① Biological Neural Network

↳ This is the base of AI.



Section Images of the Brain



{ There are many kinds of neurons.

Each neuron receives many inputs
but computes just one output.

The neurons are connected by neural fibers.

There are feed back connections.

Simplified.

② Artificial Neural Network

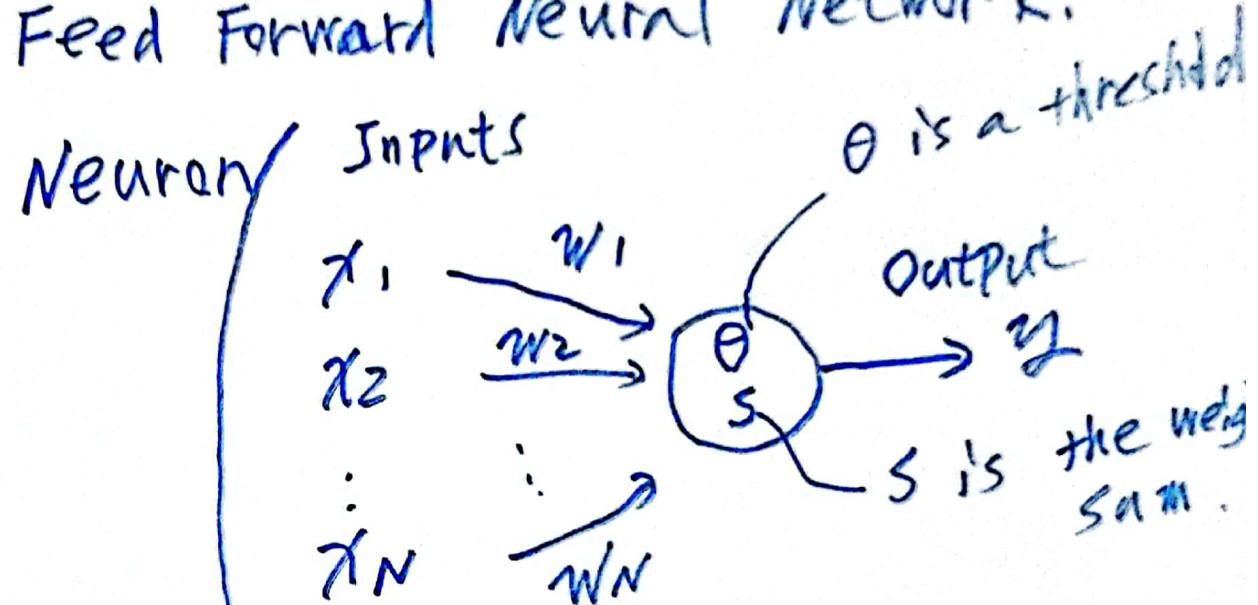
{ Only one type of neuron.

Each neuron computes just one output
from many inputs.

Simplified connections.

③ Structures of Artificial Neural Networks.

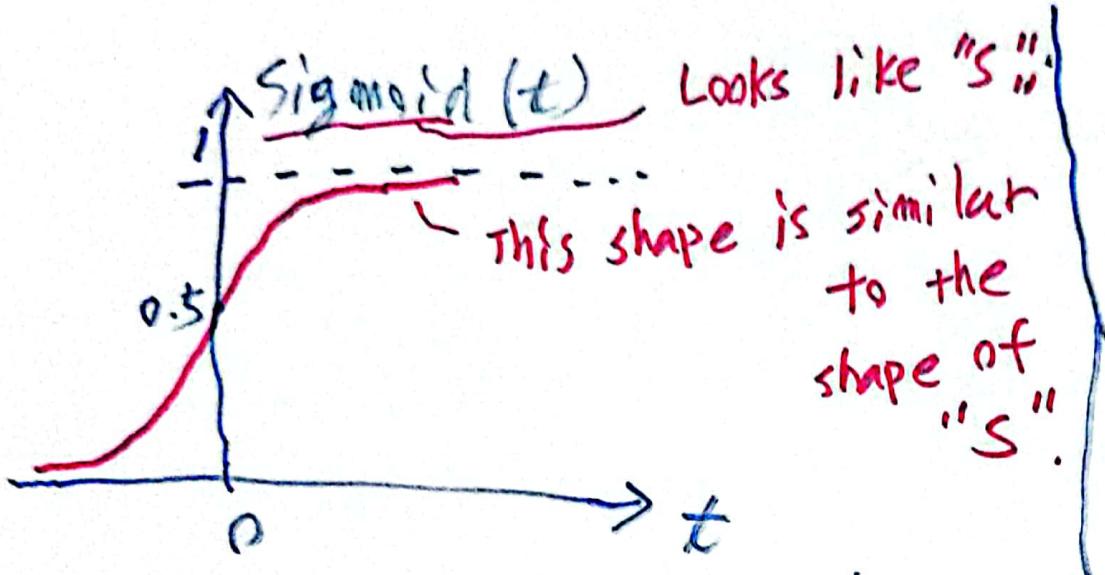
(1) Feed Forward Neural Network.



$$S = \sum_{i=1}^N w_i x_i$$

Weighted Sum
Inputs
Connection weights

These connection weights
are adjusted ~~not~~ by
machine learning.

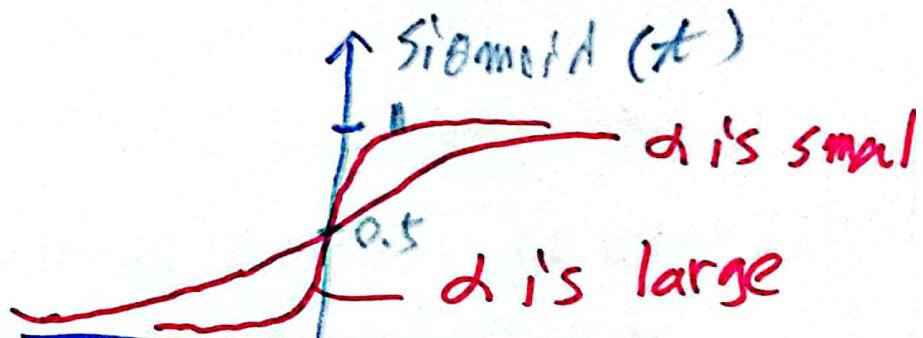
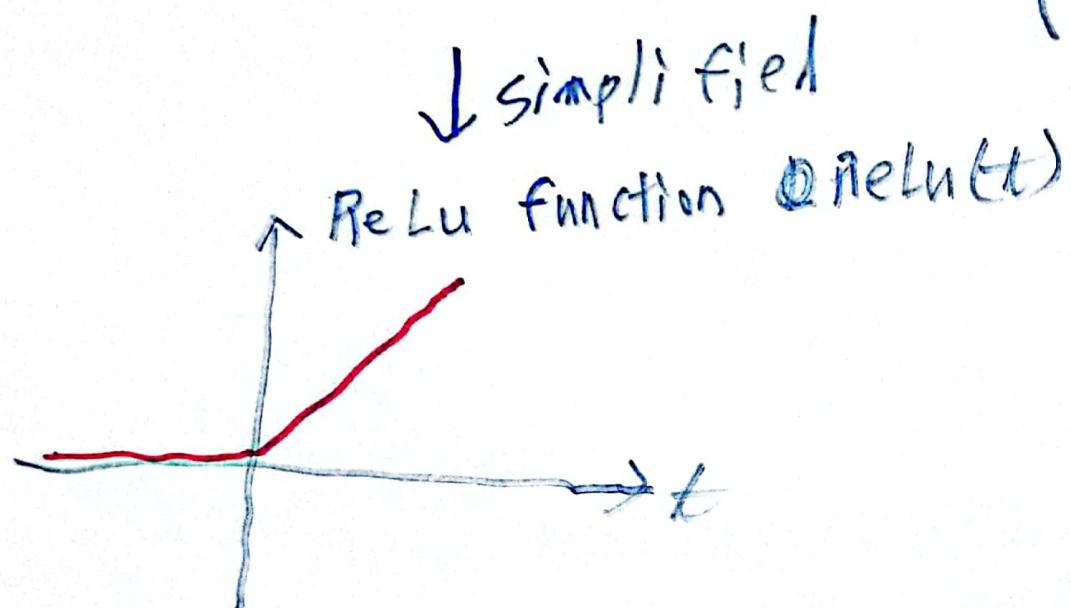


$$y = \text{sigmoid} \left(\frac{s - \theta}{\tau} \right)$$

threshold
weighted sum

$$\text{Sigmoid} (x) \rightarrow \frac{1}{1 + e^{-d x}}$$

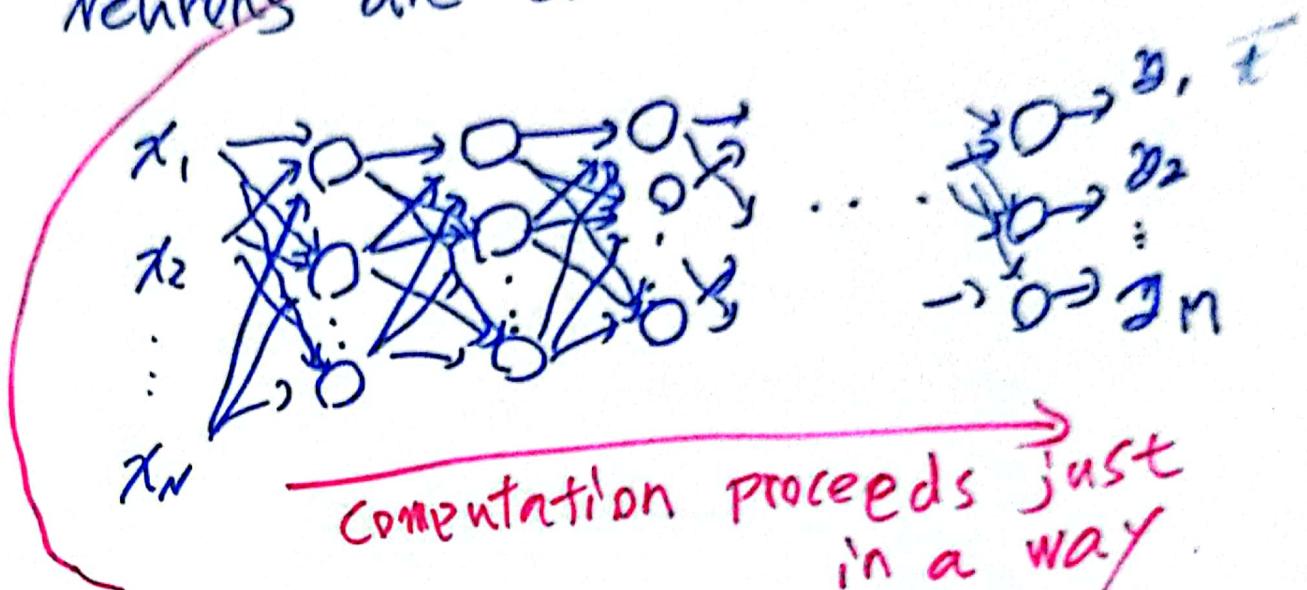
Gain
Exponential



The function of Neuron and Neural Network is very sensitive to d .

d specifies the steepness of Sigmoid Function.

In a Feed Forward Neural Network,
neurons are connected like this:



Computation proceeds just
in a way.
The signals flow from
the inputs to the outputs.
There is no feed back.

Many popular deep learning neural networks
are based on Feed Forward
Neural Networks.

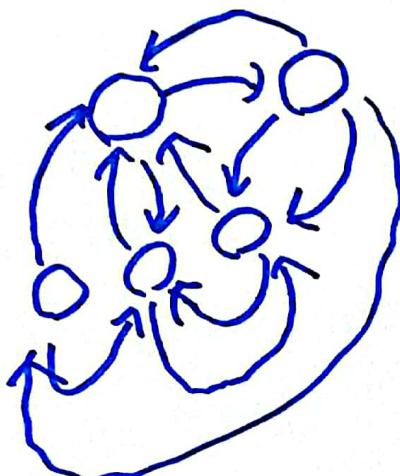
The most popular deep learning neural network
is CNN (Convolutional Neural Network).

CNN is also a kind of Feed Forward Neural network.

(2) Recurrent Neural Network.

We use the same neuron as Feed Forward Neural Network.

But they are interconnected with Feed Backs.



The neurons are connected with feed backs.

It is more complex than Feed Forward Neural Network.

In this course, we study about Recurrent Neural Network

The first task for your report.

Computation of the Neuron Models.

There are three models of neurons.

① Deterministic Binary Model.

The output is always same
if the inputs are same

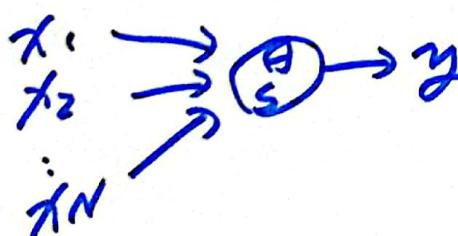
The output ~~takes~~
takes 0 or 1.

② Deterministic Continuous Model.

The output takes
an analog value.

③ Probabilistic Binary Model.
(Stochastic)

① Deterministic Binary Model



$$S = \sum_{i=1}^N w_i x_i \text{ weighted sum}$$

$$y = \begin{cases} 0 & \text{if } S < \theta \\ 1 & \text{if } S \geq \theta \end{cases} \text{ Threshold}$$

② Deterministic Continuous Model.

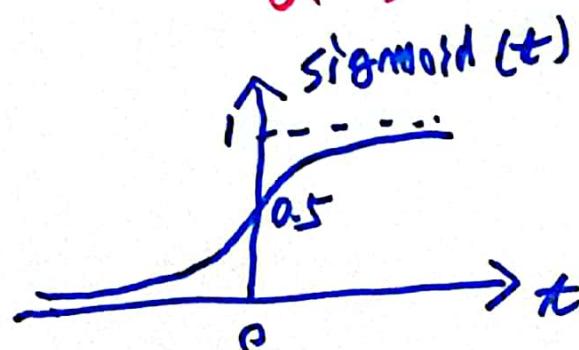
$$S = \sum_{i=1}^N w_i x_i$$

$$y = \text{Sigmoid}(S - \theta)$$

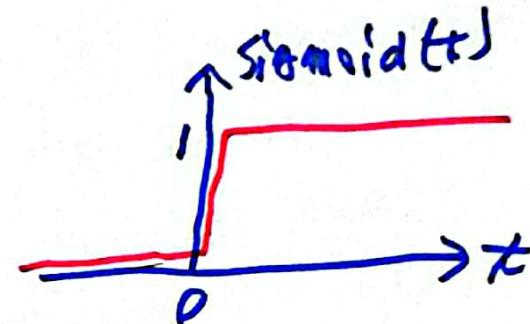
$$\text{Sigmoid}(S) = \frac{1}{1 + e^{-\alpha S}}$$

α is gain

$\alpha \rightarrow \infty$ then it becomes the deterministic model.



$$\alpha \rightarrow \infty$$



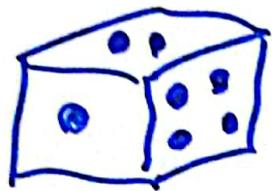
③ Probabilistic Binary Model.

Even for the same inputs, the output can take a different value.

A random number generator is used for the computation.

For example, in the C language `rand()` function is a random number generator.

A die (dice) is a random number generator.
It generates a number between 1 and 6 randomly.

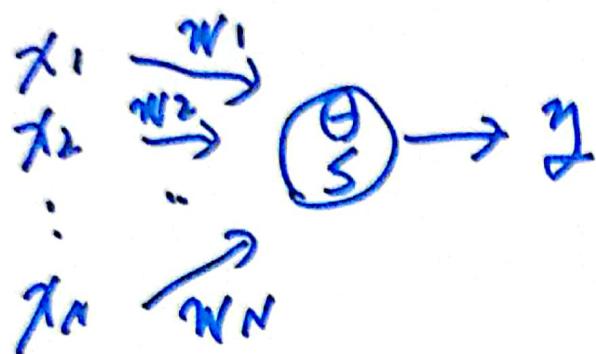


`rand()` is a die that generates the number between 0 and $2^{16} - 1$.
This is different depending on the system.

The actual number is defined in `stdio.h` in case of C language.
The macro "RAND_MAX" has the defined number.

In case of Probabilistic model, use a die to compute its output.

For example,

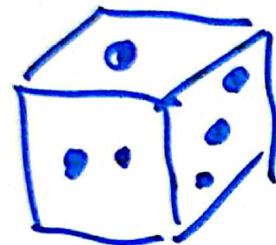


① Compute S by

$$S = \sum_{i=1}^N w_i x_i$$

② Compute probability
 $P = \text{sigmoid}(S - \theta)$

③ Use a die to compute the output.



↓
6 faces
It generates one of
 $1, 2, \dots, 6$

$y = \begin{cases} 1 & \text{if the number generated by the die is/are less than } P+6 \\ 0 & \text{if the die } \geq P+6 \end{cases}$

$P=0.5 \rightarrow 0$ and 1 should happen equally with probability 0.5.

Just check it!

$$P = 0.5 \rightarrow P * 6 = 3$$

$$y = \begin{cases} 1 & \text{if the die } \leq 3 \\ 0 & \text{if the die } > 3 \end{cases}$$

this happens
with the probability
0.5

This also happens
with probability
0.5.

$$P = 0.66 \dots \rightarrow P * 6 = 4$$

Output y should be 1 with probability 0.66 ..
 y should be 0 with probability 0.33 ..

$$y = \begin{cases} 1 & \text{if the die } \leq 4 \\ 0 & \text{if the die } > 4 \end{cases}$$

We understand "the Probabilistic Binary ~~Model~~
can be computed using the die".

In the computer we cannot use the real die,
so we use the artificial die (random
number generator)

The artificial die has many faces.

The number of faces is

$$\text{RAND-MAX} (= 2^{16}-1)$$

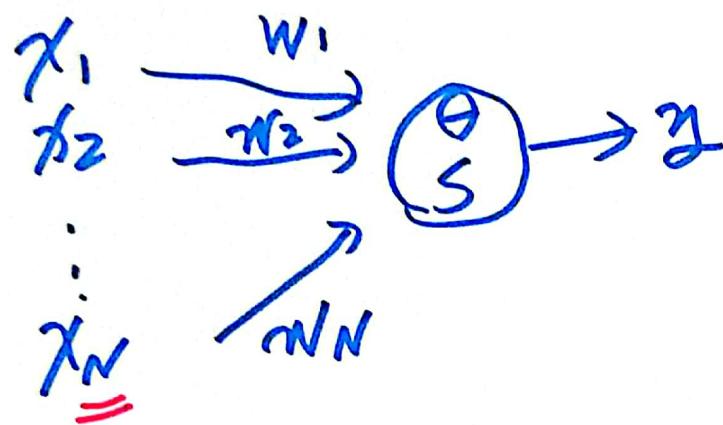
↳ stdio.h defines this number.

✓ change 6 to RAND-MAX

The output y of the Probabilistic Binary Model can be computed by

Task 1. $\leftarrow \begin{cases} y = \begin{cases} 1 & \text{if } \text{ran}() \leq P * \text{RAND-MAX} \\ 0 & \text{else } (\text{ran}() > P * \text{RAND-MAX}) \end{cases} \\ P = \text{sigmoid}(S - \theta) \\ S = \sum_{i=1}^N w_i x_i \end{cases}$

Task 1 : Make the program for the probabilistic binary model of the neuron.



$$\begin{aligned}N &= 4 \\x_1 &= 0, x_2 = 1, x_3 = 1, x_4 = 0 \\w_1 &= 2, w_2 = 0.5, w_3 = -1, w_4 = -2 \\&\theta = 0.5\end{aligned}$$

Compute y 100 times
1000 times
10000 times.

Check if $y=1$ happens with probability
 $P = \text{sigmoid}(S-\theta)$

λ (Gain) is important. Please compare the results for different λ , $\lambda = 0.1, 1, 5, 10$