

GRADIENT DESCENT IS
TAKING YOUR
ANDROID DEVELOPER
JOB AWAY



ALPHAGO

Conv

Photo by Adriana Harakalova, 2021



Andrej Karpathy 

@karpathy

...

Gradient descent can write code better than you. I'm sorry.

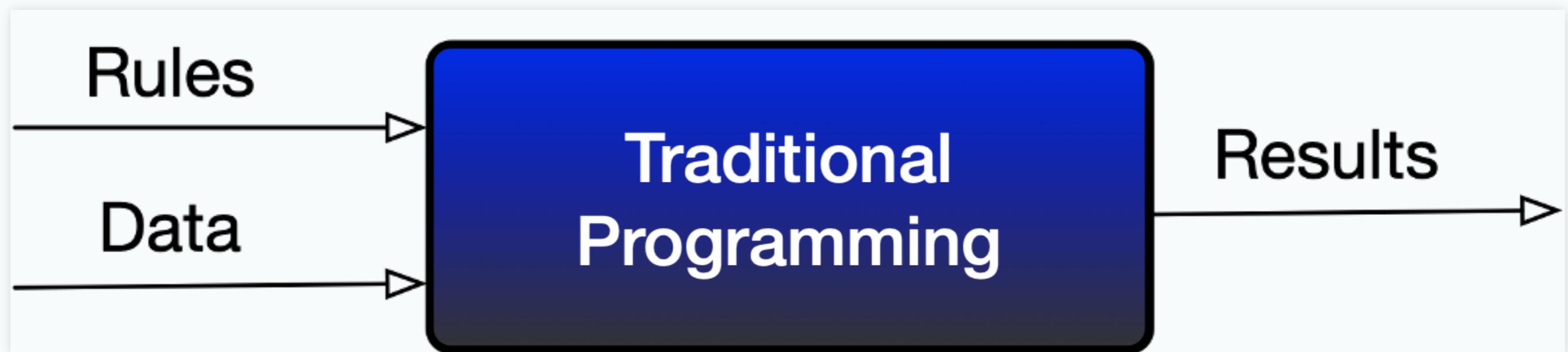
10:56 PM · Aug 4, 2017 · Twitter Web Client

493 Retweets 92 Quote Tweets 2,611 Likes

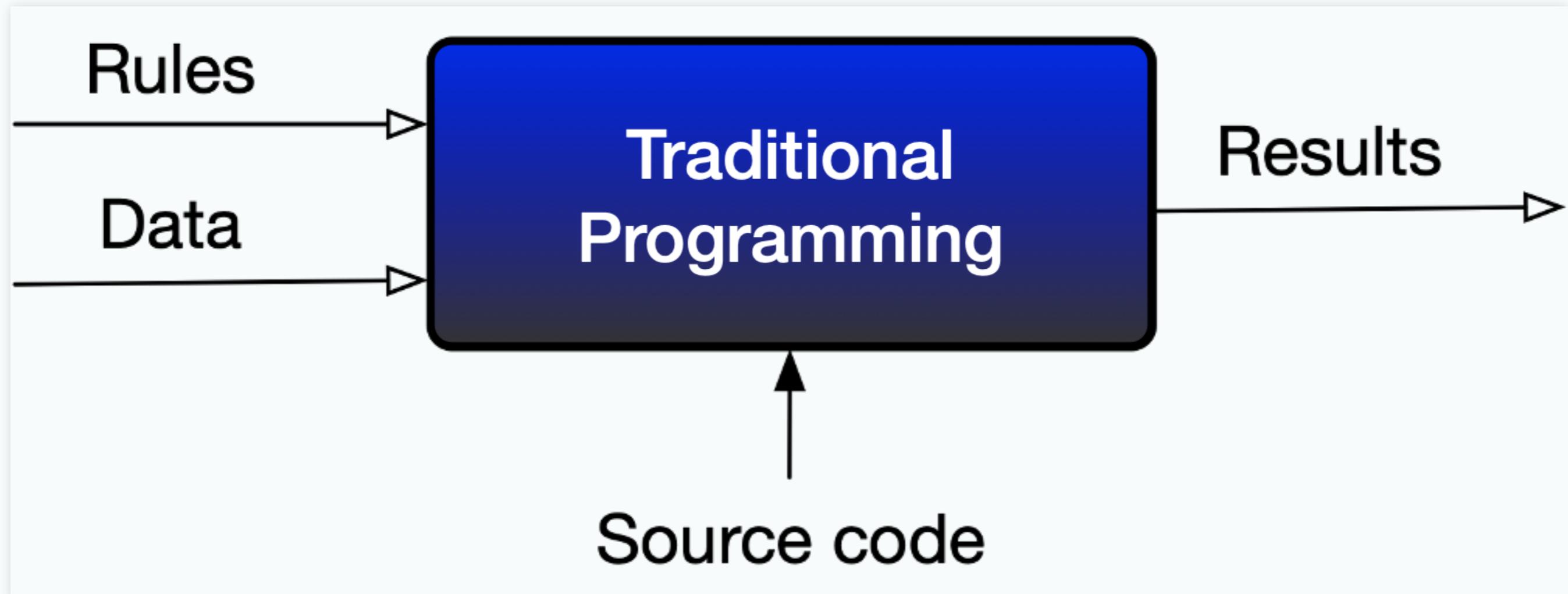


SOFTWARE 2.0

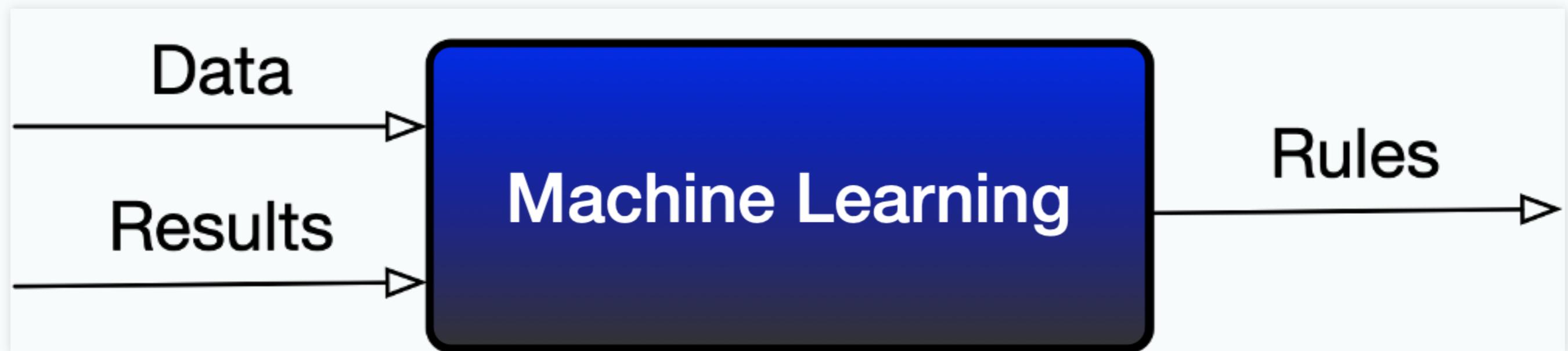
SOFTWARE DEVELOPMENT



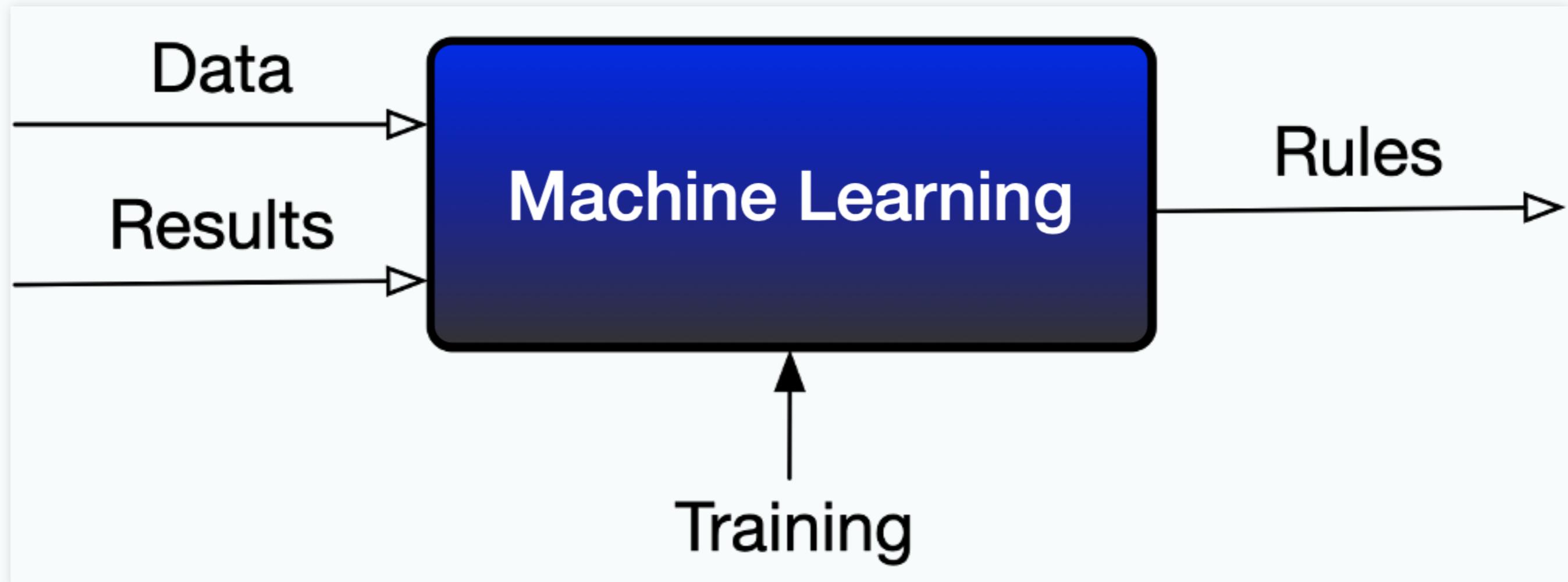
SOFTWARE DEVELOPMENT



MACHINE LEARNING



TRAINING



EXAMPLES



APPLICATIONS IN REAL LIFE

APPLICATIONS IN REAL LIFE

- visual recognition

APPLICATIONS IN REAL LIFE

- visual recognition
- speech recognition & synthesis

APPLICATIONS IN REAL LIFE

- visual recognition
- speech recognition & synthesis
- machine translation

APPLICATIONS IN REAL LIFE

- visual recognition
- speech recognition & synthesis
- machine translation
- recommendation engines

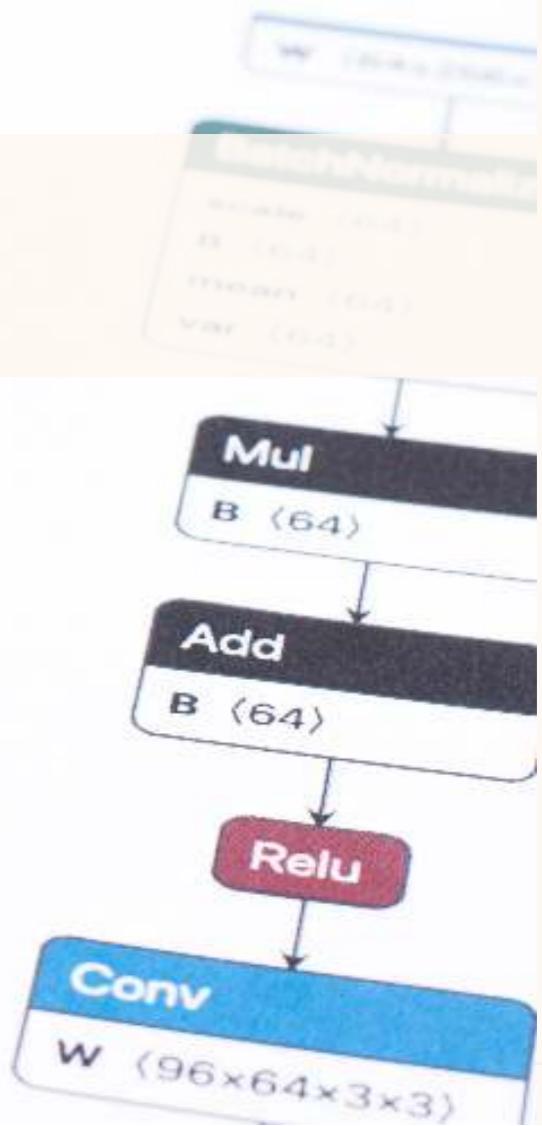
APPLICATIONS IN REAL LIFE

- visual recognition
- speech recognition & synthesis
- machine translation
- recommendation engines
- natural language processing

APPLICATIONS IN REAL LIFE

- visual recognition
- speech recognition & synthesis
- machine translation
- recommendation engines
- natural language processing
- financial sector

ROCKET SCIENCE



APOLLO 11 GUIDANCE COMPUTER

```
# SINGLE PRECISION SINE AND COSINE

      COUNT*  $$/INTER
SPCOS      AD      HALF
SPSIN      TS      TEMK
            TCF     SPT
            CS      TEMK
SPT        DOUBLE
            TS      TEMK
            TCF     POLLEY
            XCH     TEMK
            INDEX   TEMK
            AD      LIMITS
            COM
            AD      TEMK
            TS      TEMK
            TCF     POLLEY
            TCF     ARG90
POLLEY    EXTEND
            MP      TEMK
            TS      SQ
            EXTEND
            MP      C5/2
            AD      C3/2
            EXTEND
            MP      SQ
            AD      C1/2
            EXTEND
            MP      TEMK
            DDOUBL
            TS      TEMK
            TC      Q
            INDEX   A
            CS      LIMITS
            TC      Q
# ARGUMENTS SCALED AT PI
# RESULT SCALED AT 1.
```

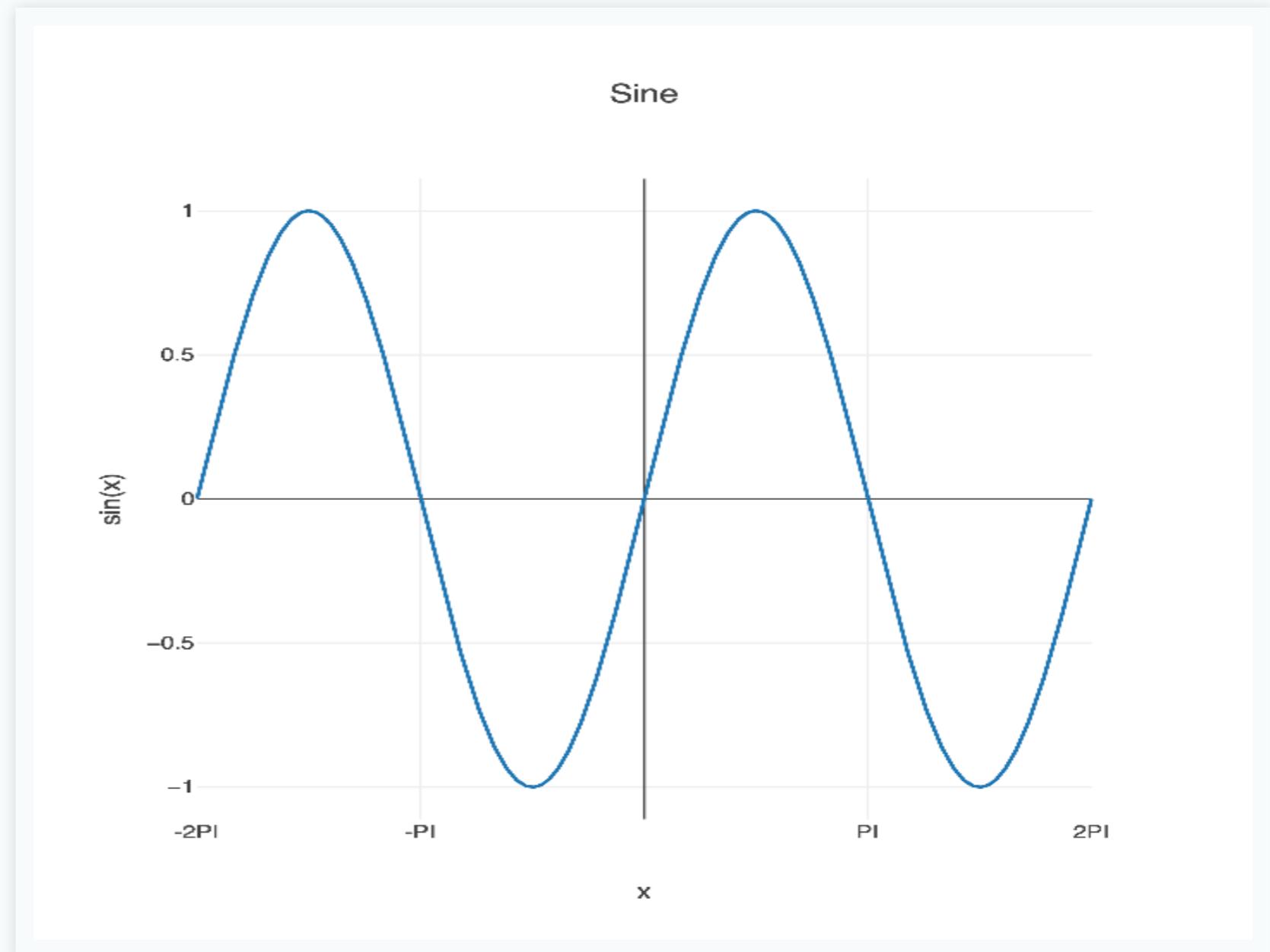
MARGARET HAMILTON



Photo by Adriana Harakalova, 2021

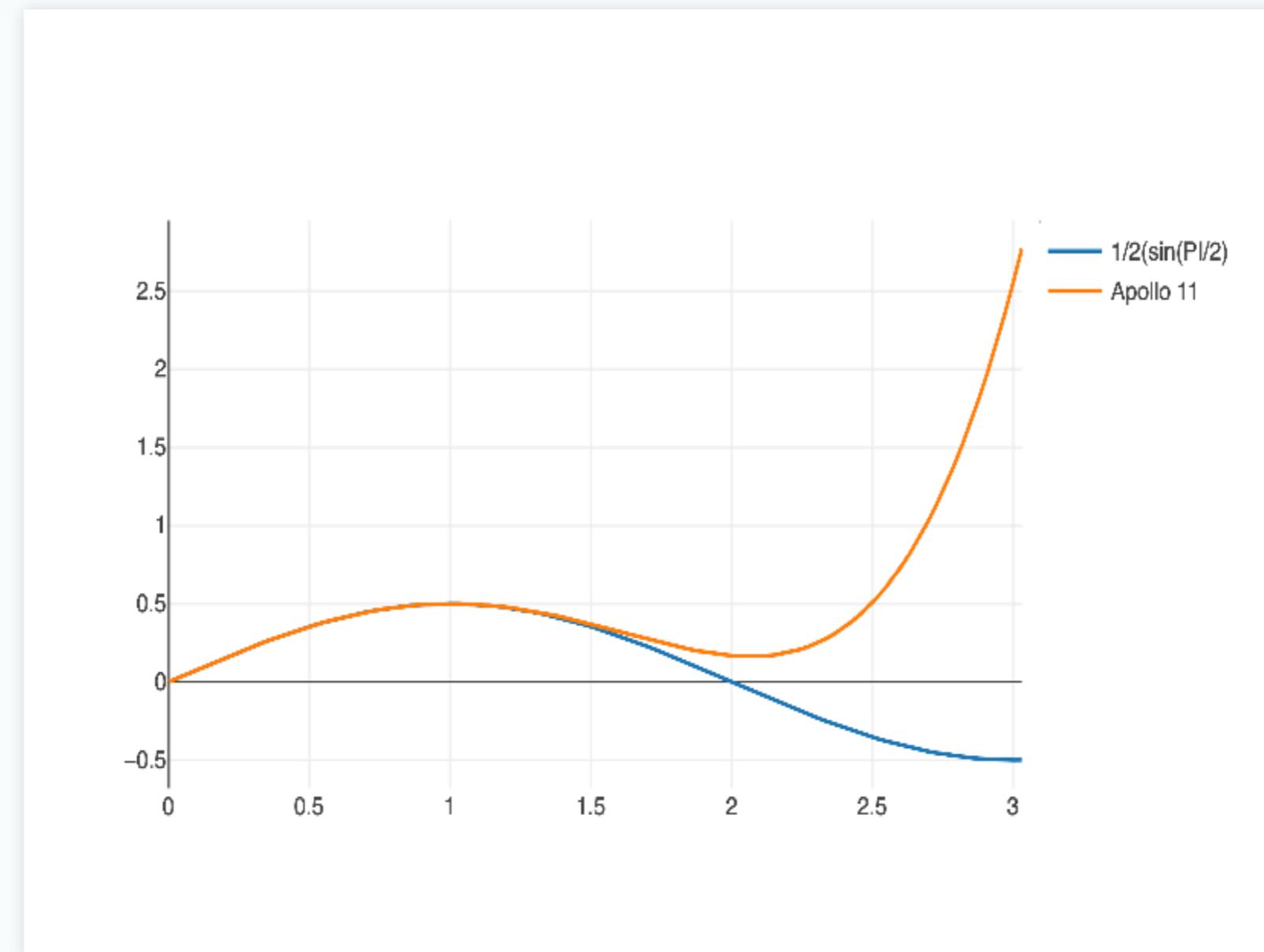
SINE FUNCTION

$$y(x) = \sin(x)$$



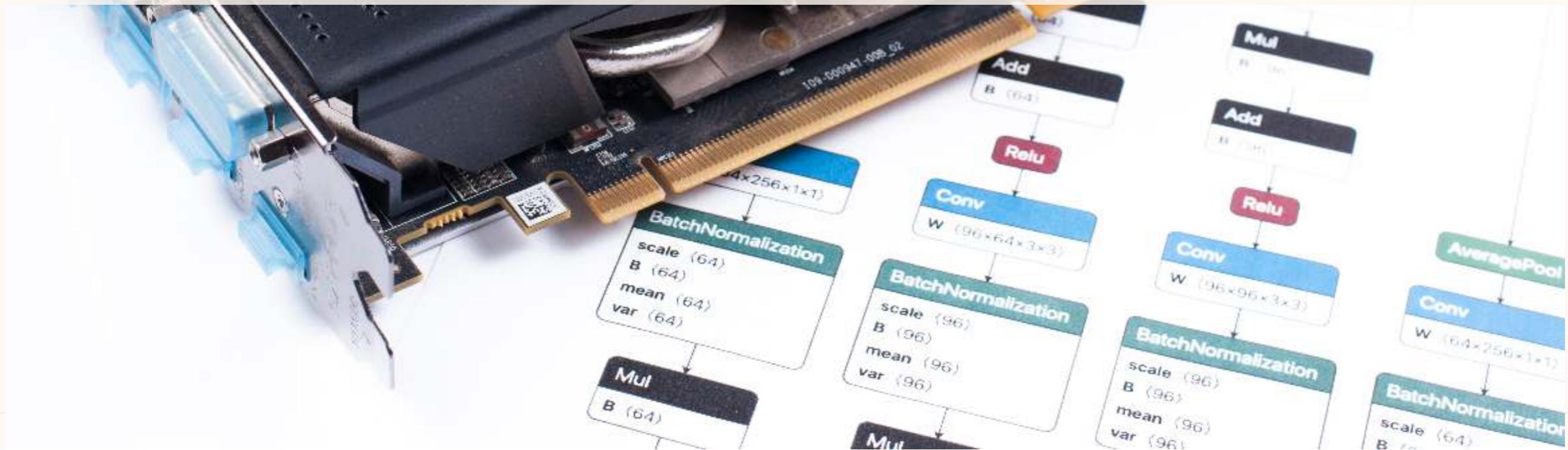
APOLLO 11 APPROXIMATION

$$y(x) = 0.7853134x - 0.3216147x^3 + 0.036551x^5$$

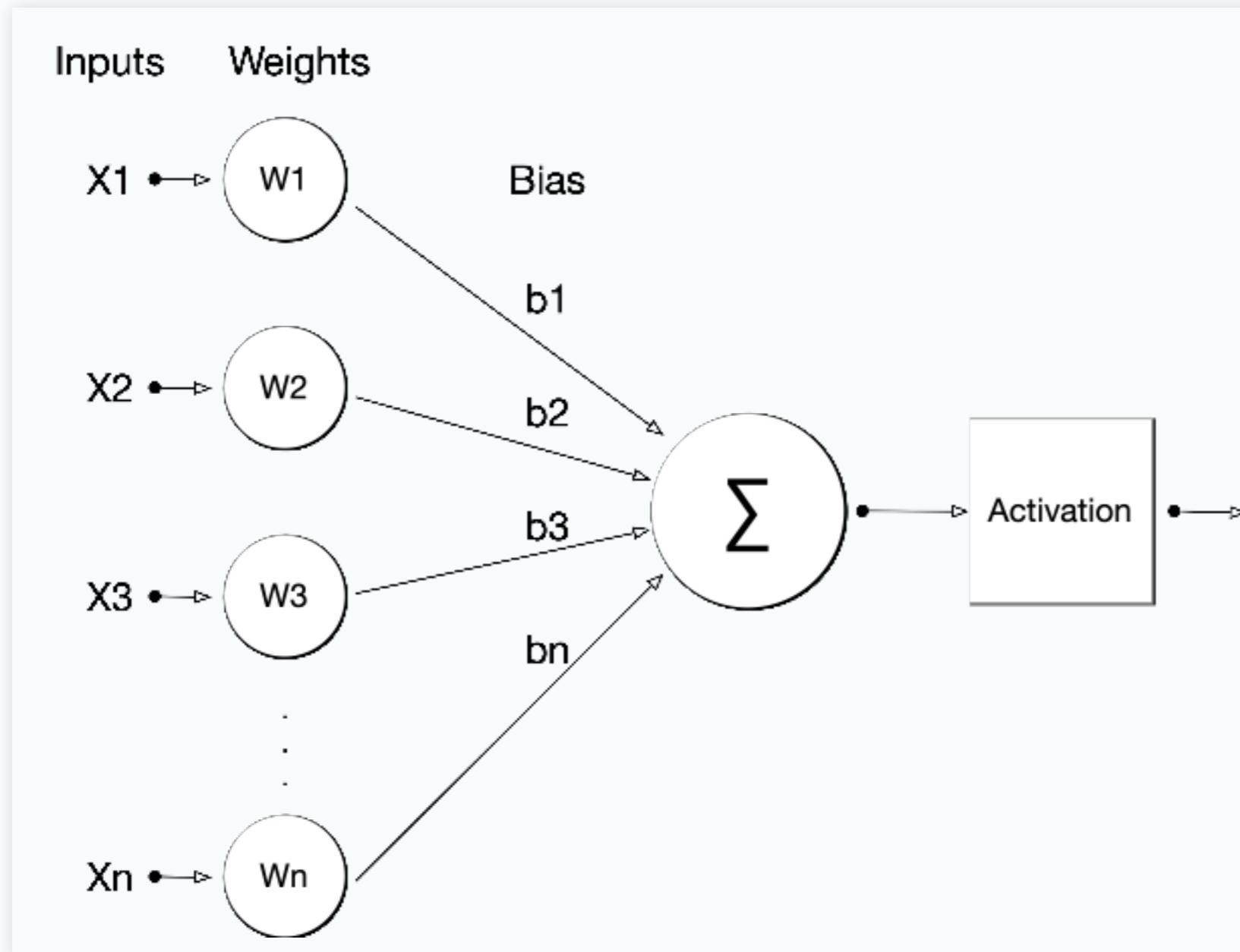




NEURAL NETWORKS

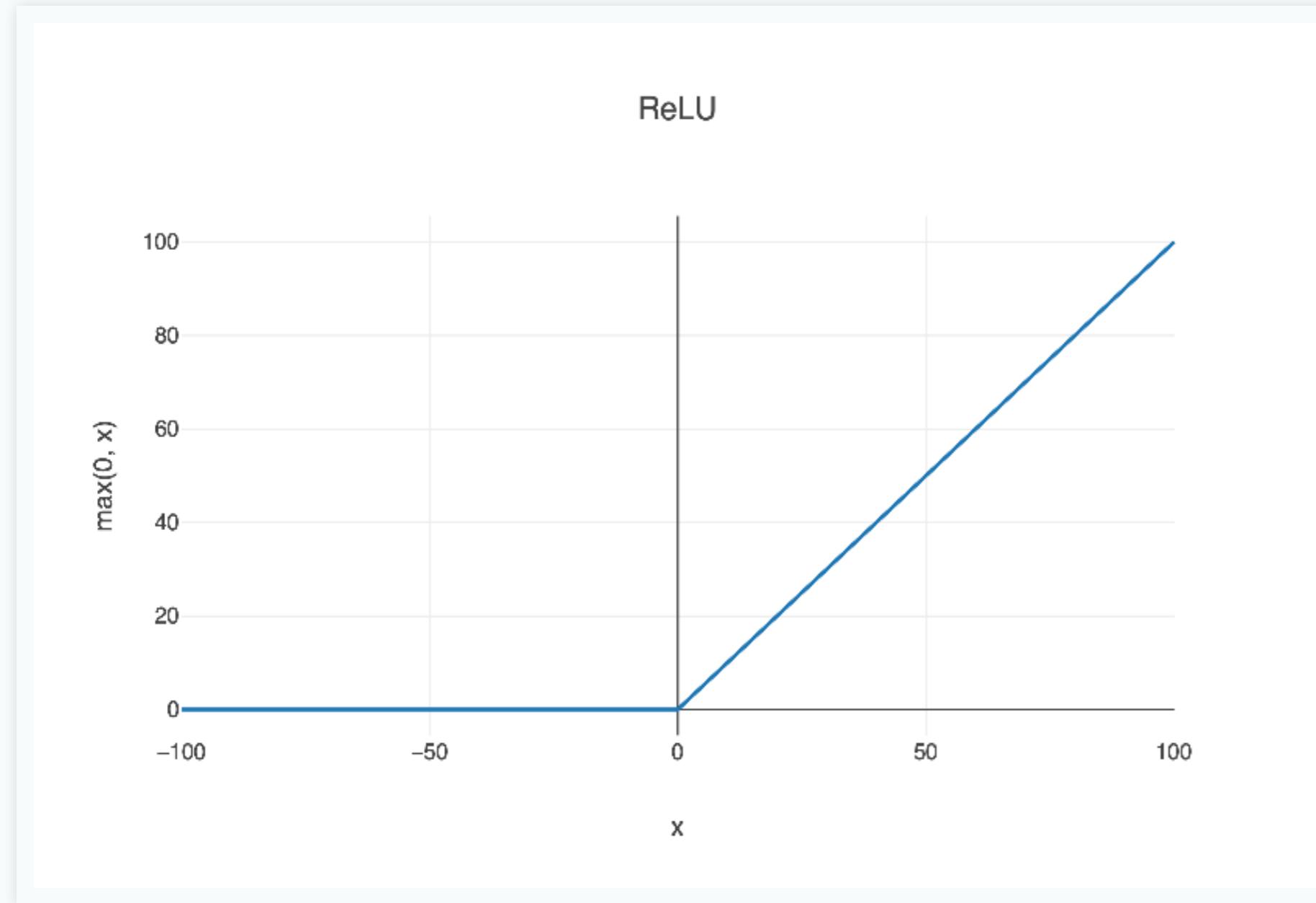


NEURON



$$\sum_{i=0}^n x_i w_i + b_i$$

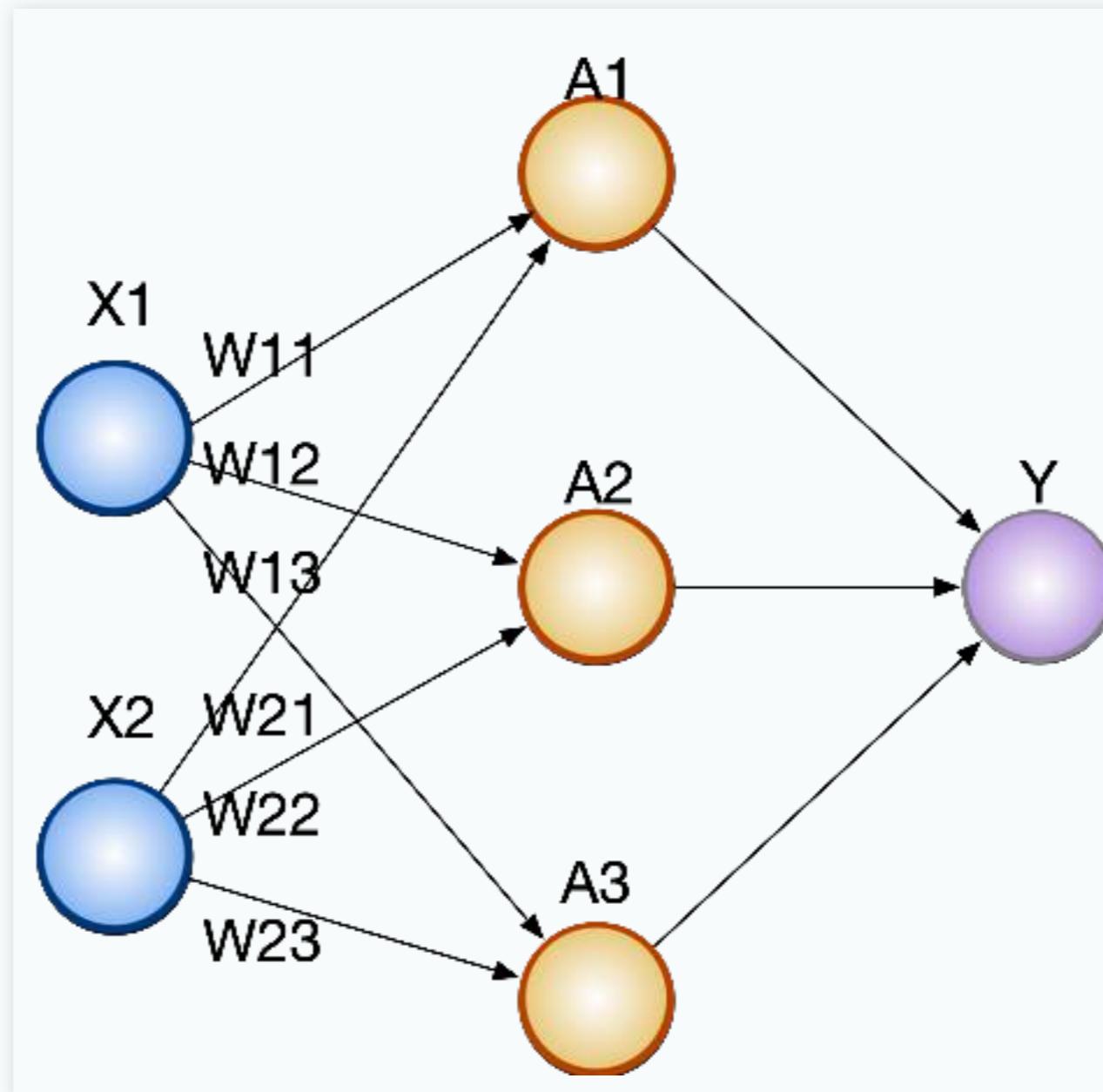
ACTIVATION FUNCTION RELU



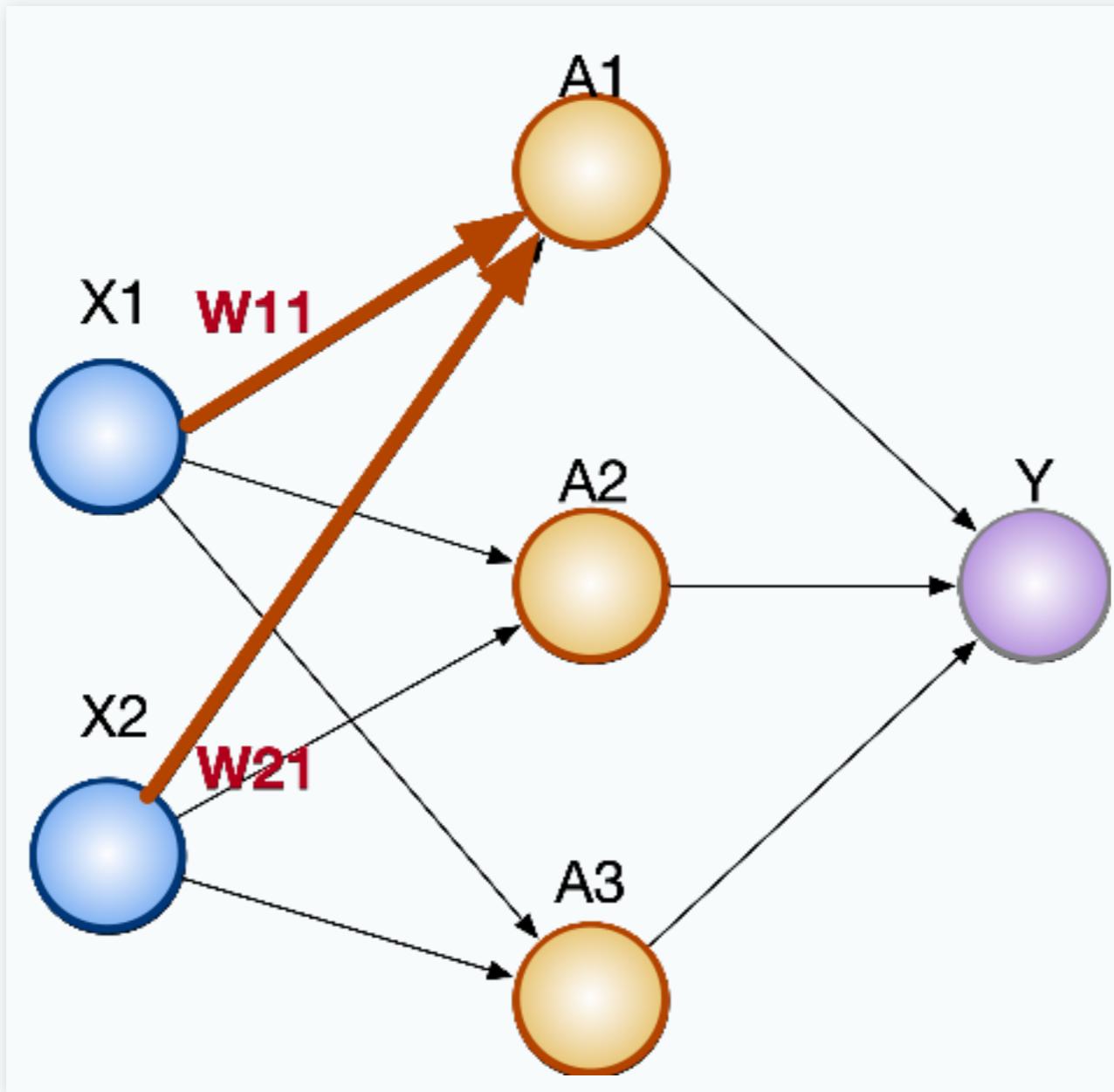
ReLU

$$f(x) = \max(0, x)$$

NEURAL NETWORK ARCHITECTURE

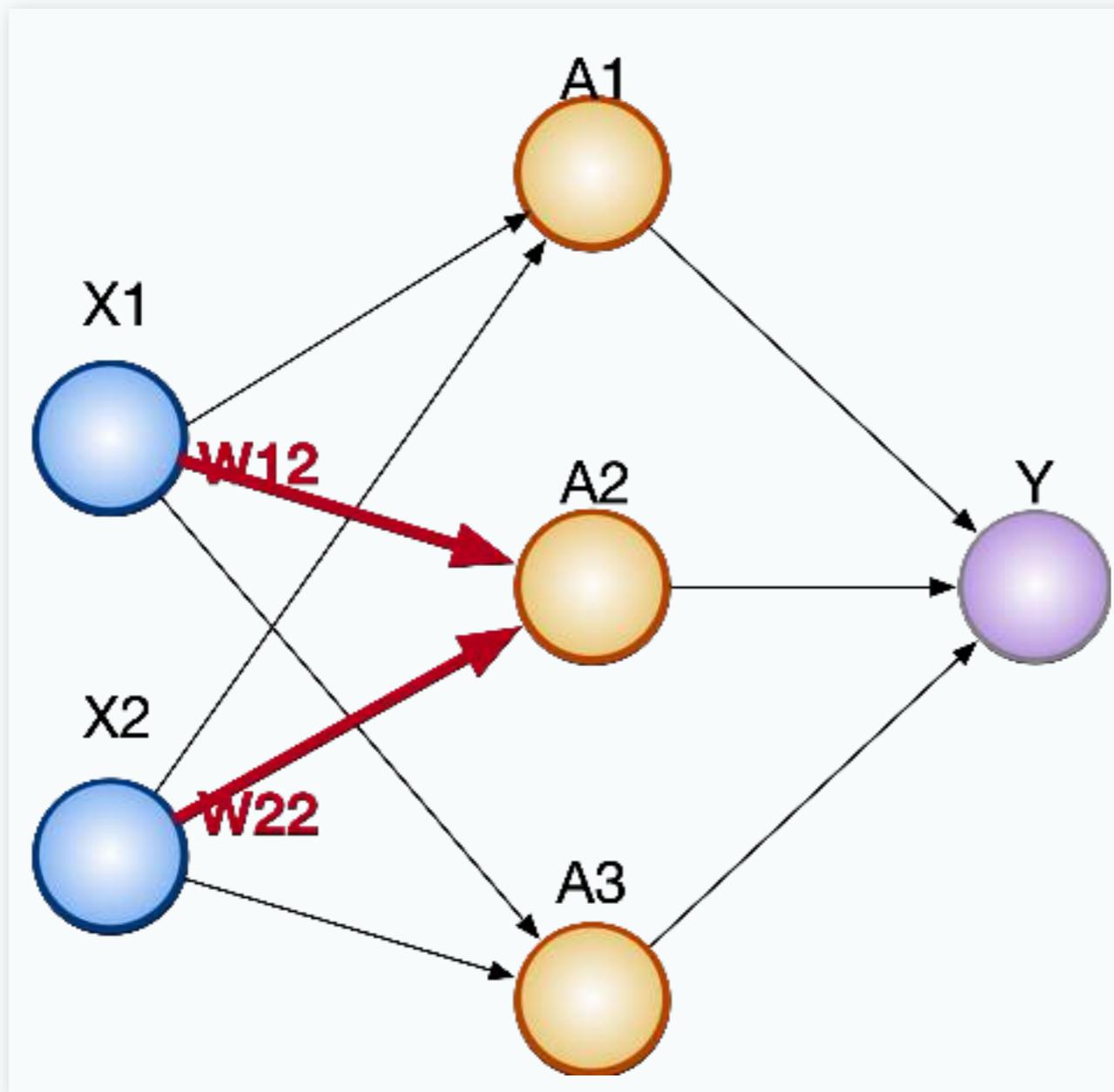


NEURAL NETWORK ARCHITECTURE



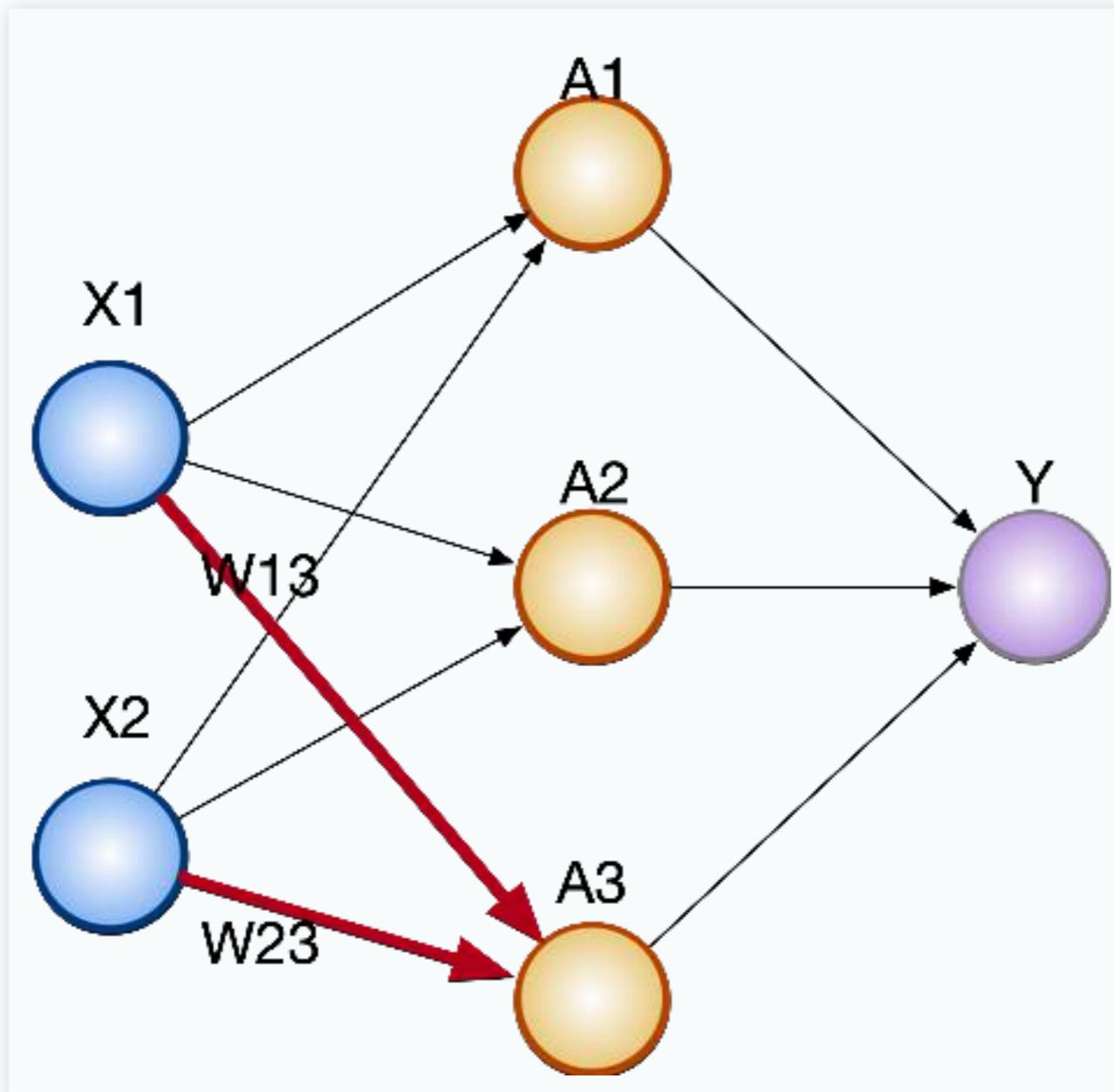
- $A_1 = X_1 W_{11} + X_2 W_{21}$

NEURAL NETWORK ARCHITECTURE



- $A_2 = X_2 W_{21} + X_1 W_{12}$

NEURAL NETWORK ARCHITECTURE



- $A_3 = X_1 W_{13} + X_2 W_{23}$

MATRICES

$$A = X \cdot W$$

$$W = \begin{bmatrix} \textcolor{blue}{W}_{11} & W_{12} & W_{13} \\ \textcolor{blue}{W}_{21} & W_{21} & W_{23} \end{bmatrix}$$

$$X = \begin{bmatrix} \textcolor{blue}{X}_1 & X_2 \end{bmatrix}$$

$$A = \begin{bmatrix} \textcolor{blue}{A}_{11} & A_{12} & A_{12} \end{bmatrix}$$

$$A_{11} = X_1 W_{11} + X_2 W_{21}$$

MATRICES

$$A = X \cdot W$$

$$W = \begin{bmatrix} W_{11} & \textcolor{red}{W}_{12} & W_{13} \\ W_{21} & \textcolor{red}{W}_{21} & W_{23} \end{bmatrix}$$

$$X = \begin{bmatrix} \textcolor{red}{X}_1 & X_2 \end{bmatrix}$$

$$A = \begin{bmatrix} A_{11} & \textcolor{red}{A}_{12} & A_{12} \end{bmatrix}$$

$$A_{11} = X_1 W_{21} + X_2 W_{22}$$

MATRICES

$$A = X \cdot W$$

$$W = \begin{bmatrix} W_{11} & W_{12} & \textcolor{green}{W}_{13} \\ W_{21} & W_{21} & \textcolor{green}{W}_{23} \end{bmatrix}$$

$$X = \begin{bmatrix} \textcolor{green}{X}_1 & X_2 \end{bmatrix}$$

$$A = \begin{bmatrix} A_{11} & A_{12} & \textcolor{green}{A}_{12} \end{bmatrix}$$

$$A_{11} = X_1 W_{13} + X_2 W_{23}$$

FORWARD PROPAGATION & INFERENCE

```
fun predict(inputMatrix: Matrix): Matrix {  
    var data = inputMatrix  
    layers.forEach { layer ->  
        val weighted = data.multiply(layer.weights)  
        val biased = weighted.add(layer.bias)  
        data = layer.activation(biased)  
    }  
    return data  
}
```

TRAINING

Mean square error

$$\frac{1}{N} \sum_{i=0}^N y_i + \hat{y}_i$$

BACK PROPAGATION & GRADIENT DESCENT

SOLUTION IN KOTLIN

```
val modell = Sequential.of(  
    Input(1, name = "input_1"),  
    Dense(  
        20,  
        Activations.Relu,  
        kernelInitializer = HeNormal(SEED),  
        biasInitializer = HeUniform(SEED),  
        name = "dense_1"  
    ),  
    Dense(  
        20,  
        Activations.Relu,  
        kernelInitializer = HeNormal(SEED),  
        biasInitializer = HeUniform(SEED),  
        name = "dense_2"  
    ),  
    Dense(1, Activations.Linear, name = "dense_3")  
)
```

DEMO TIME



LEARNING TO LEARN

```
BatchNo  
scale (64)  
B (64)  
mean (64)  
var (64)
```

```
Mul  
B (64)
```

```
Add
```

LEARNING TO LEARN

- pimp up your brain

LEARNING TO LEARN

- pimp up your brain
- healthy lifestyle

LEARNING TO LEARN

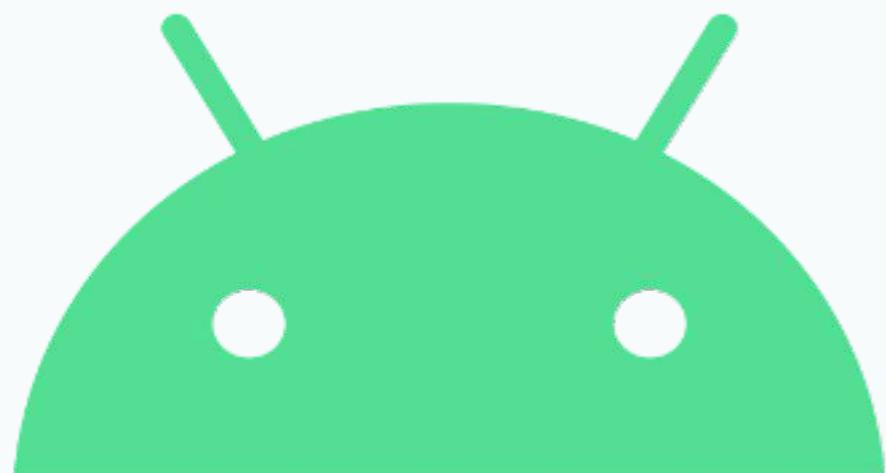
- pimp up your brain
- healthy lifestyle
- massive open online courses(MOOC)

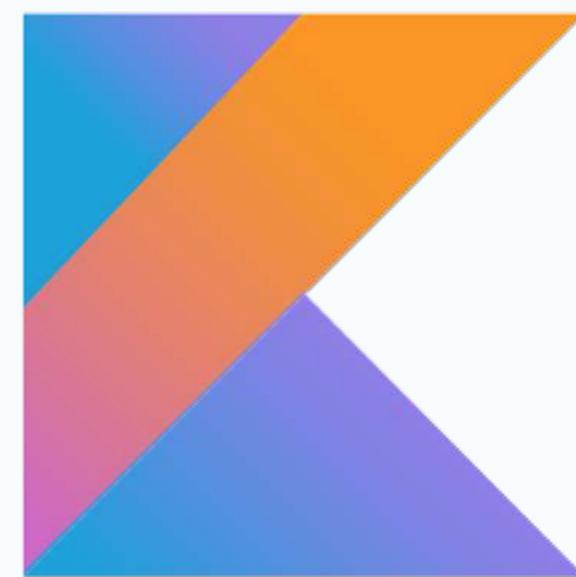
LEARNING TO LEARN

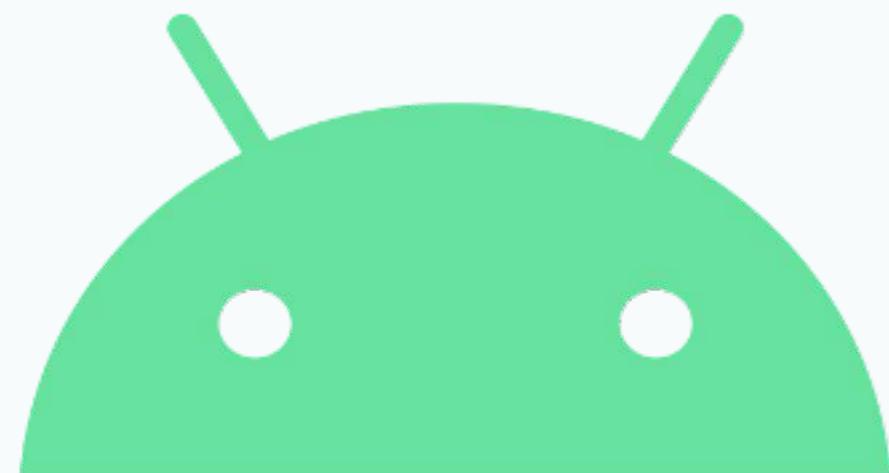
- pimp up your brain
- healthy lifestyle
- massive open online courses(MOOC)
- learning by doing



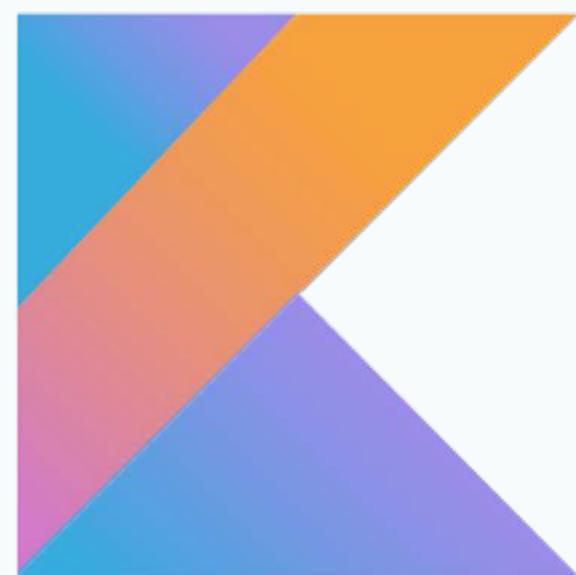
DATA SCIENCE FOR ANDROID DEVELOPER







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DATA SCIENCE AND KOTLIN

DATA SCIENCE AND KOTLIN

- Jetbrains and data science

DATA SCIENCE AND KOTLIN

- Jetbrains and data science
- kscript

DATA SCIENCE AND KOTLIN

- Jetbrains and data science
- kscript
- kmath, kotlingrad

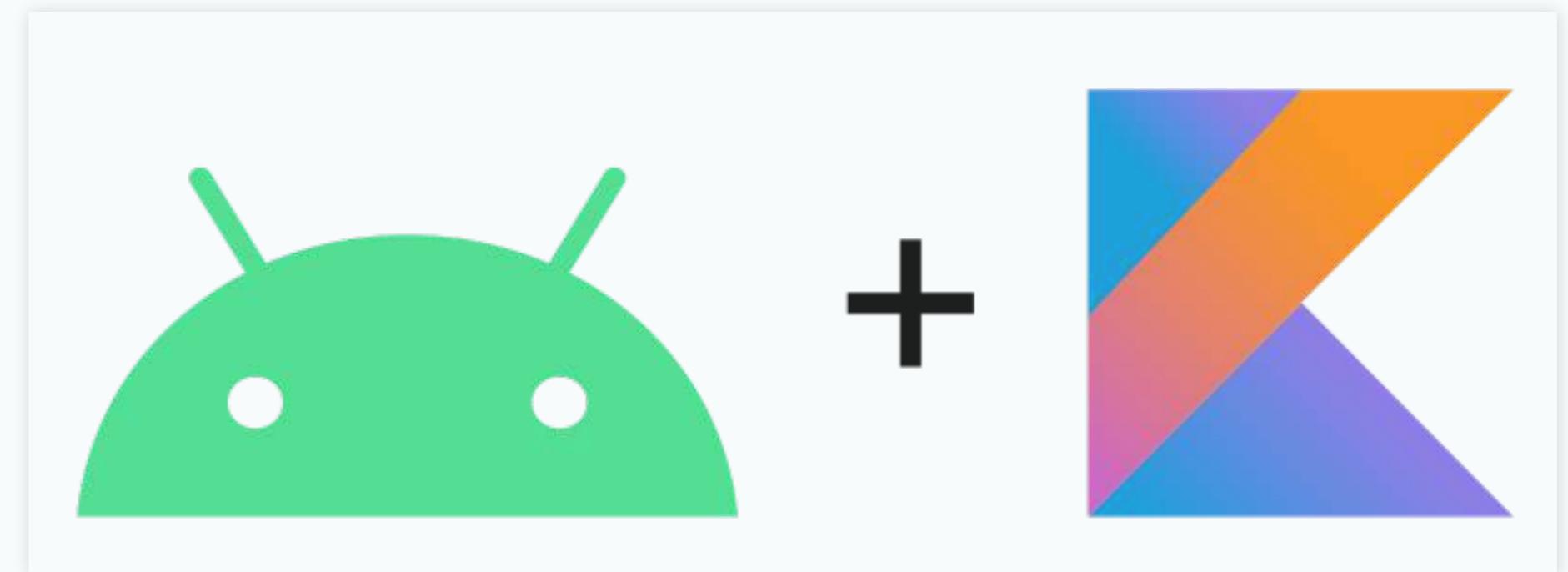
DATA SCIENCE AND KOTLIN

- Jetbrains and data science
- kscript
- kmath, kotlingrad
- krangl, plotly.kt

DATA SCIENCE AND KOTLIN

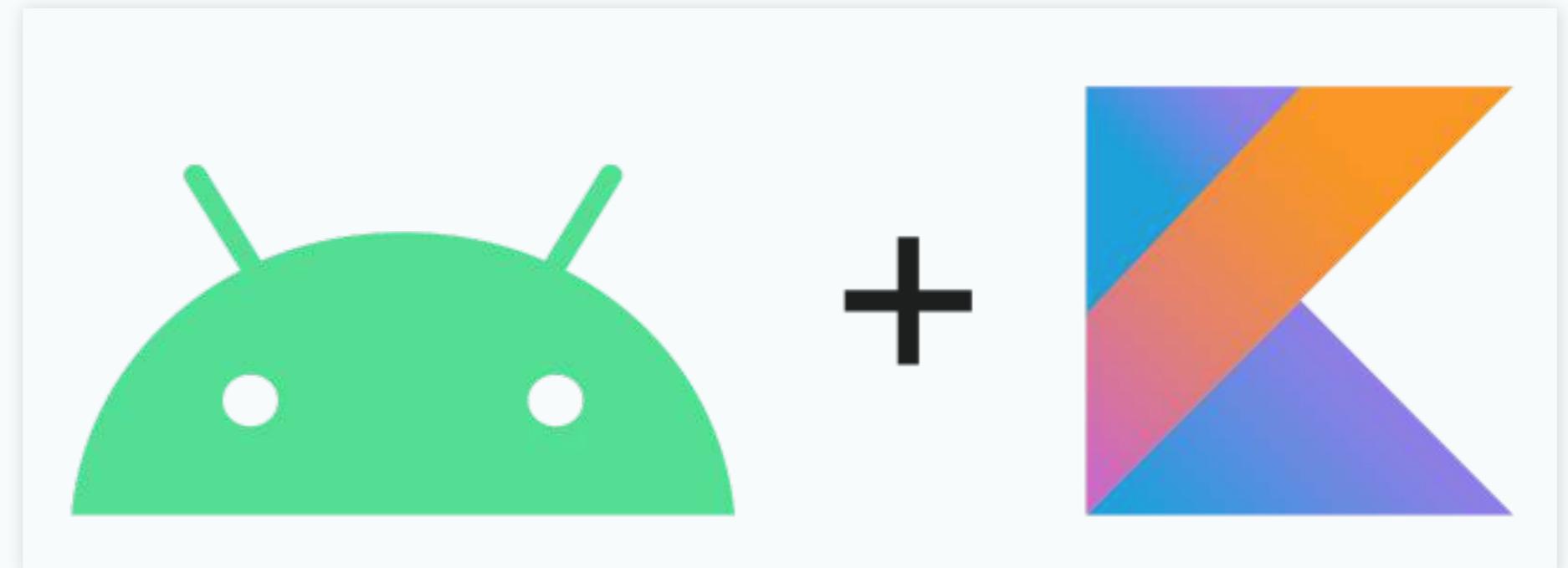
- Jetbrains and data science
- kscript
- kmath, kotlingrad
- krangl, plotly.kt
- KotlinDL

MACHINE LEARNING ON ANDROID



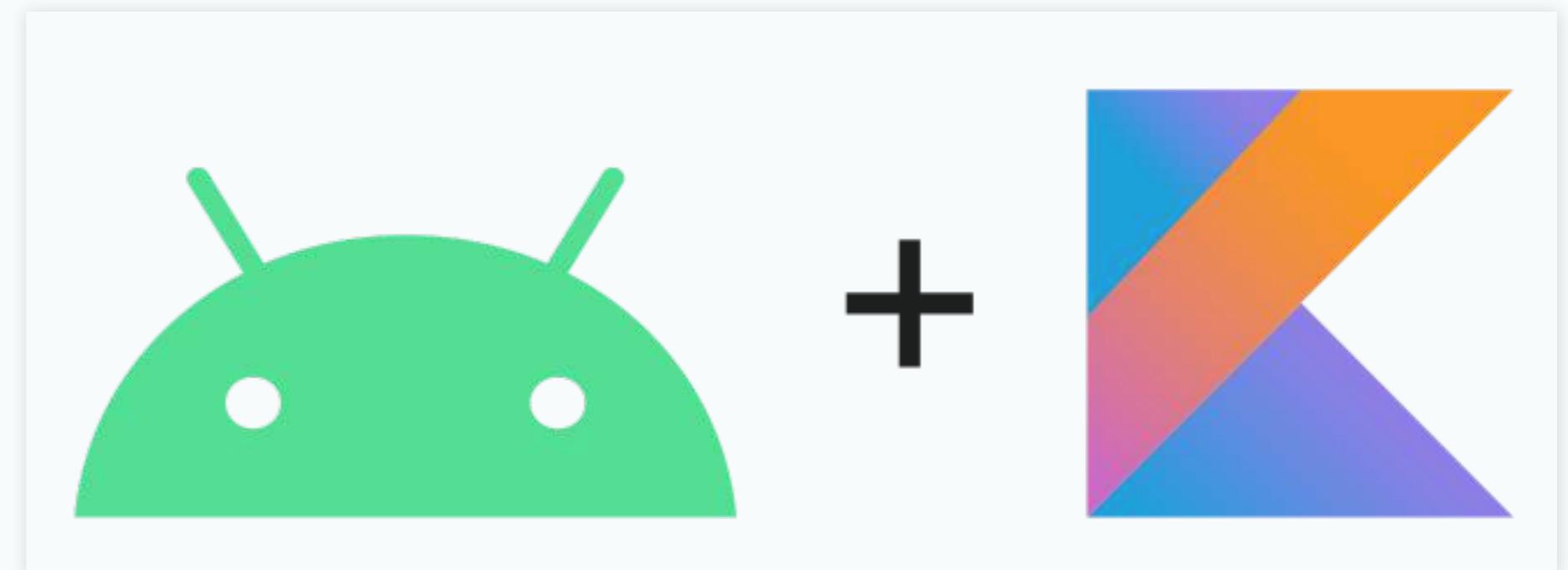
MACHINE LEARNING ON ANDROID

- Kotlin & JVM



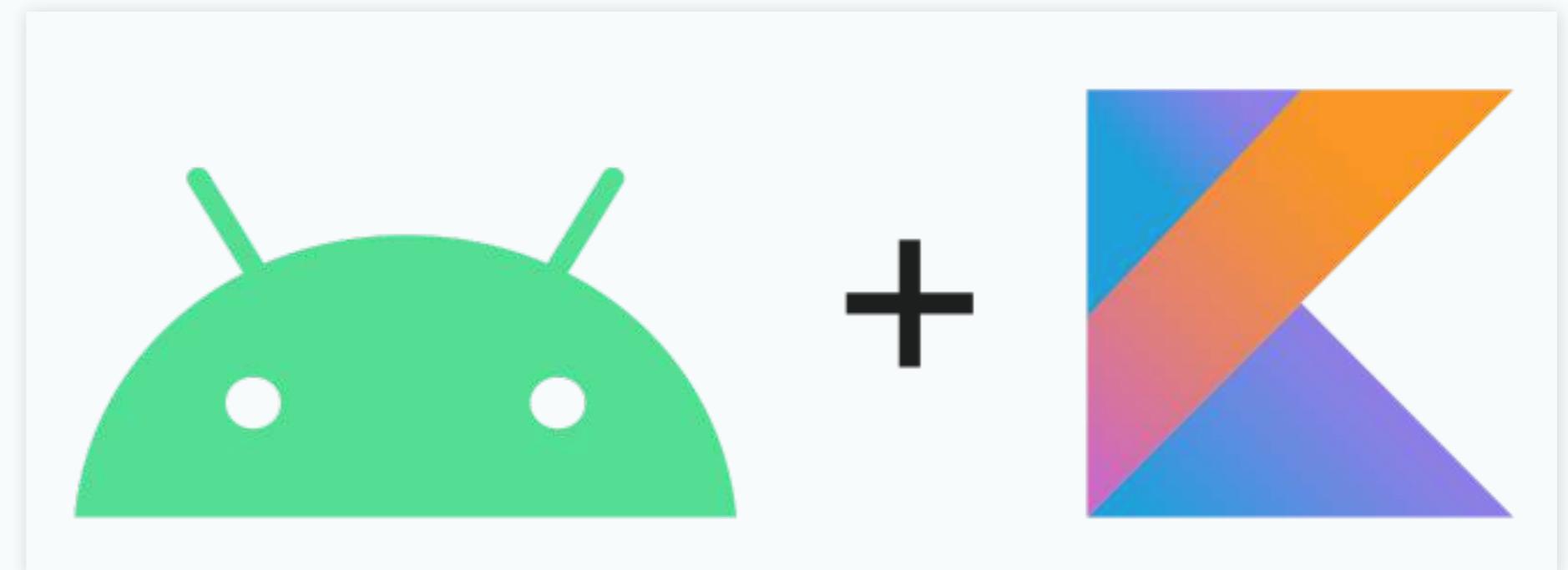
MACHINE LEARNING ON ANDROID

- Kotlin & JVM
- machine learning on the edge



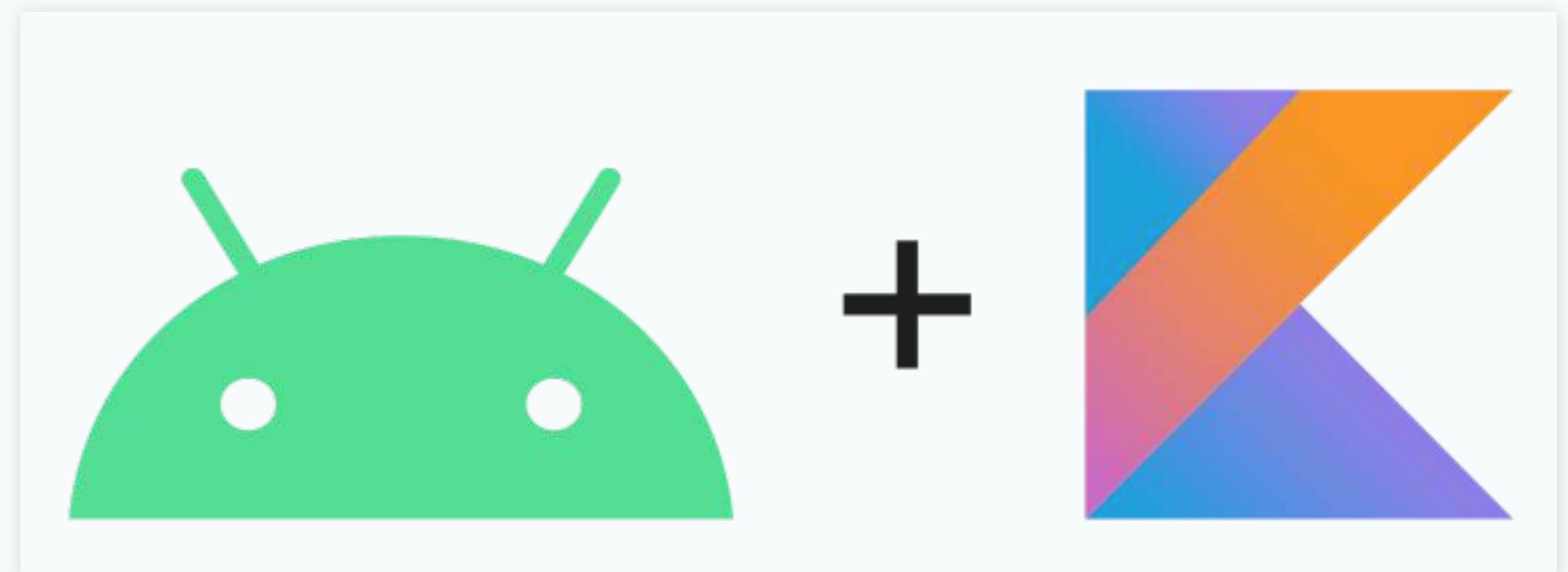
MACHINE LEARNING ON ANDROID

- Kotlin & JVM
- machine learning on the edge
- TinyML



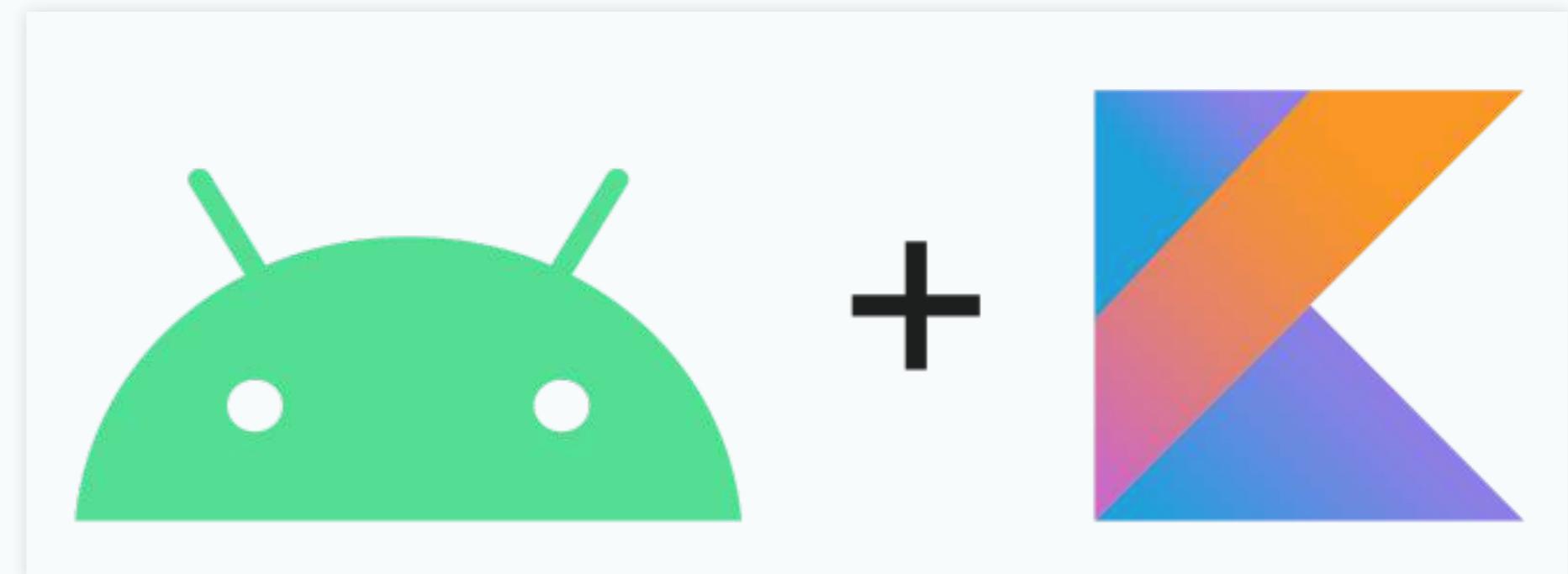
MACHINE LEARNING ON ANDROID

- Kotlin & JVM
- machine learning on the edge
- TinyML
- Tensorflow & Tensorflow Lite



MACHINE LEARNING ON ANDROID

- Kotlin & JVM
- machine learning on the edge
- TinyML
- Tensorflow & Tensorflow Lite
- Tensorflow Hub





THANK YOU



SLIDES

- slides
- code
- notebook



LINKS

Slides and code, arXiv papers, papers with code, AlphaGo, Scale of the human brain, The total number of neurons in the human neocortex unbiasedly estimated using optical disectors

Apollo 11 Program

Wikipedia about Apollo Guidance Computer, Simplified implementation of sin/cos,
[https://de.wikipedia.org/wiki/Margaret_Hamilton_\(Wissenschaftlerin\)](https://de.wikipedia.org/wiki/Margaret_Hamilton_(Wissenschaftlerin)),
Virtual AGC project

Learning

Learning how to learn,

Android&Math

Flag Sam, Pose estimation Tensorflow lite sample, kotlingrad

Logos&pictures

Android, Kotlin, Adriana Harakalova ©2021,
Margaret Hamilton, Wikipedia