



Hello, Colaboratory

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CONNECT EDITING



Welcome to Colaboratory!

Colaboratory is a free Jupyter notebook environment that requires no setup and runs entirely in the cloud. See our [FAQ](#) for more info.

Google

colab

TPU

Getting Started

- [Overview of Colaboratory](#)
- [Loading and saving data: Local files, Drive, Sheets, Google Cloud Storage](#)
- [Importing libraries and installing dependencies](#)
- [Using Google Cloud BigQuery](#)
- [Forms, Charts, Markdown, & Widgets](#)
- [TensorFlow with GPU](#)
- [Machine Learning Crash Course: Intro to Pandas & First Steps with TensorFlow](#)

알아보기...

Highlighted Features

Seedbank

Looking for Colab notebooks to learn from? Check out [Seedbank](#), a place to discover interactive machine learning examples.

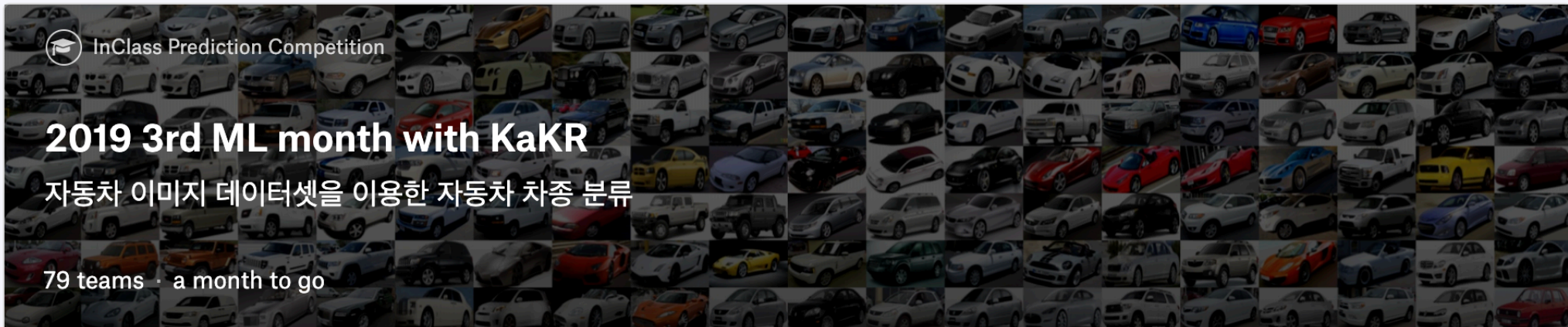
발표자 소개

김 태 진 Kim Tae Jin

부산대학교 정보컴퓨터공학부 졸업
현 캐글코리아 운영진
KaKR 3rd Competition 준비 & 운영

특징 : 업무 및 취미 캐글





[Overview](#)

[Data](#)

[Kernels](#)

[Discussion](#)

[Leaderboard](#)

[Rules](#)

[Team](#)

[Host](#)

[My Submissions](#)

[Submit Predictions](#)

Overview

Edit

Description

Evaluation

Timeline

How to classify car classes ?

<https://www.kaggle.com/c/2019-3rd-ml-month-with-kakr>



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시작하기 전에...

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Q. 딥러닝?

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GPU

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Nvidia Tesla v100 16GB

by PNY

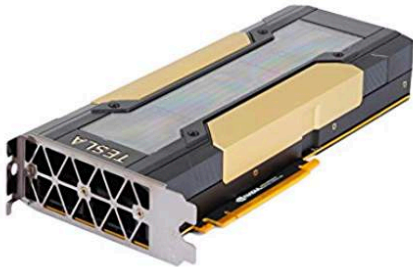
Eligible for Shipping to Korea, Republic of

\$5,995⁰⁰

Only 13 left in stock - order soon.



Produ
... NVIE
...



NVIDIA Tesla V100 Volta GPU Accelerator 32GB Graphics Card

by NvidiaCorporation

Eligible for Shipping to Korea, Republic of

\$7,498⁰⁰

Only 5 left in stock - order soon.

Produ
... NVIE
TENSO



NVIDIA TITAN V VOLTA 12GB HBM2 VIDEO CARD

by NVIDIA

Eligible for Shipping to Korea, Republic of

\$3,587⁹⁹

Only 7 left in stock - order soon.

More Buying Choices

\$2,250.00 (17 used & new offers)





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현실은

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GTX 1060

GTX 1060



VS



3 GB

6 GB

10 Entered Competitions



Jigsaw Unintended Bias in Toxicity Classification

Detect toxicity across a diverse range of conversations

Featured · Kernels Competition · 7 days to go · biases, nlp, text data



\$65,000
10/3167



APTOS 2019 Blindness Detection

Detect diabetic retinopathy to stop blindness before it's too late

Featured · Kernels Competition · 2 months to go · healthcare, medicine, image data, multiclass...



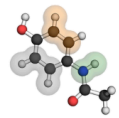
\$50,000
587 teams



SIIM-ACR Pneumothorax Segmentation

Identify Pneumothorax disease in chest x-rays

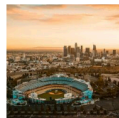
Featured · 2 months to go · image data, object segmentation



Predicting Molecular Properties

Can you measure the magnetic interactions between a pair of atoms?

Featured · 2 months to go · chemistry, tabular data, regression



Data Science for Good: City of Los Angeles

Help the City of Los Angeles to structure and analyze its job descriptions

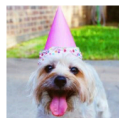
Analytics · 12 days ago · employment, nlp, image data, text data



Recursion Cellular Image Classification

CellSignal: Disentangling biological signal from experimental noise in cellular images

Research · 3 months to go · research, biology, classification, image data



Generative Dog Images

Experiment with creating puppy pics

Research · Kernels Competition · a month to go



\$30,000







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TPU

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내 TPU가 뭐예요?

TPU with colab

Tips & Caution



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TPU가 뭐예요?

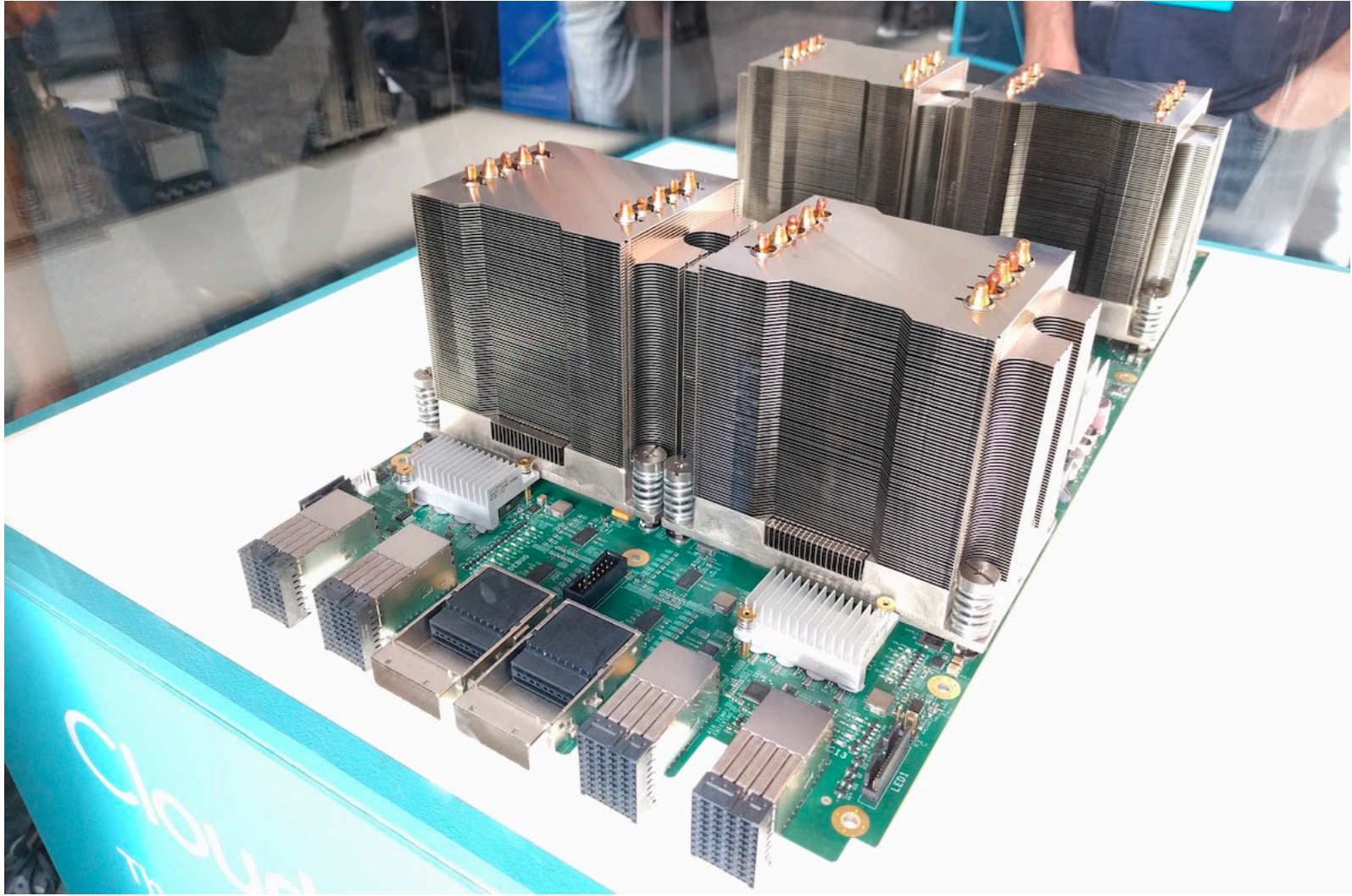
Highlighted Features

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TPU가
뭐예요?

Tensor**P**rocessing**U**nit
(텐서 처리 장치)



TPU가
뭐예요?

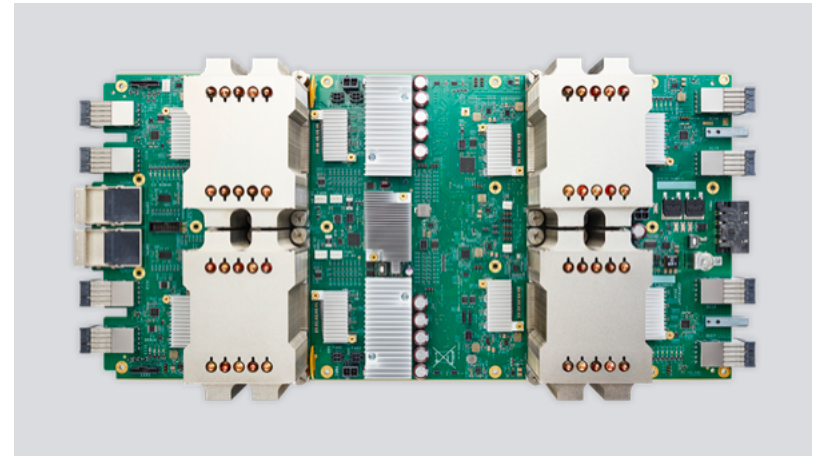
Tensor**P**rocessing**U**nit

Resource (TPU v2 기준)

- 180 TFLOPS
- 64 GB HBM

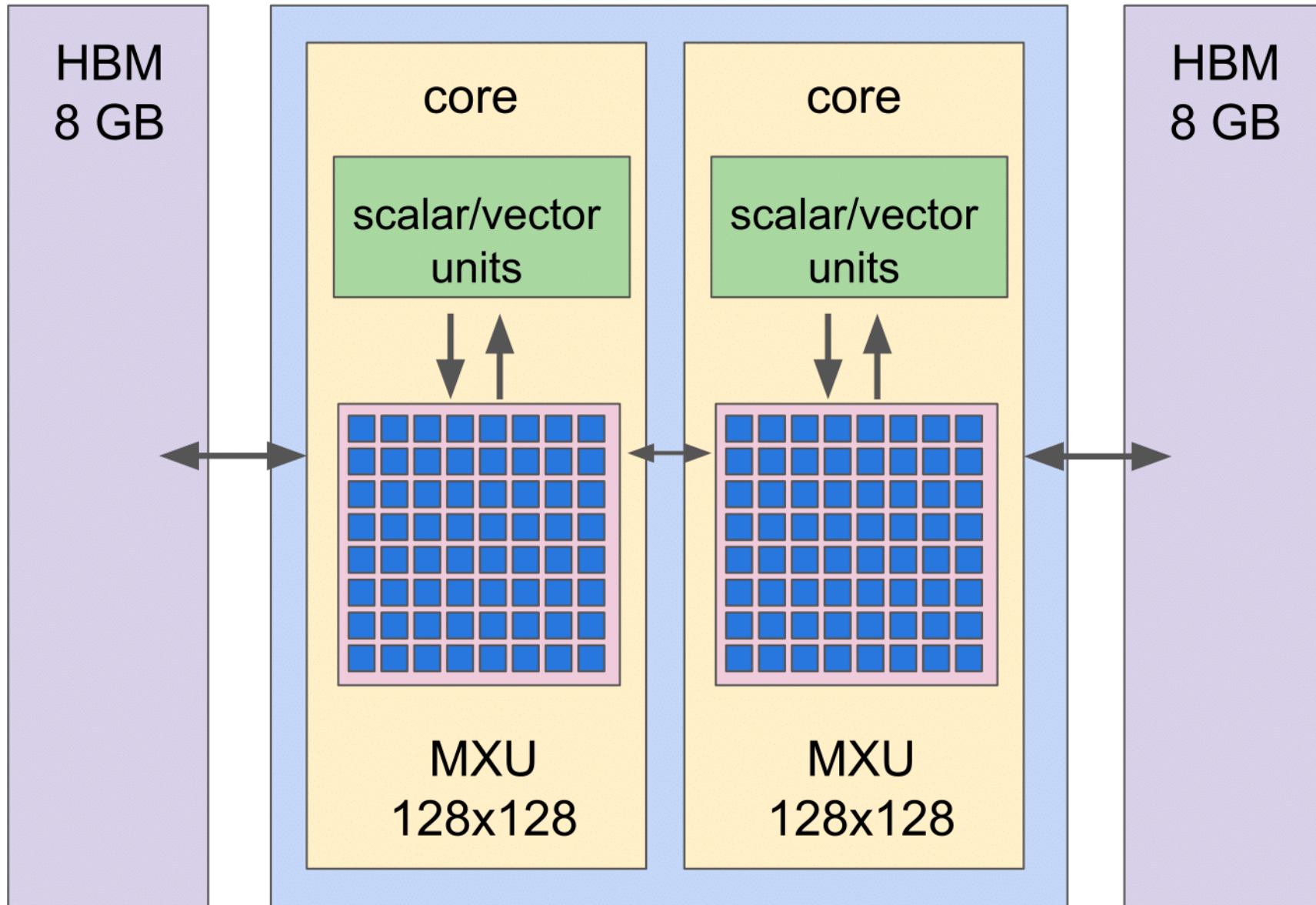
특징

- Matrix Machine
(Systolic Array Architecture)
- Cloud 기반

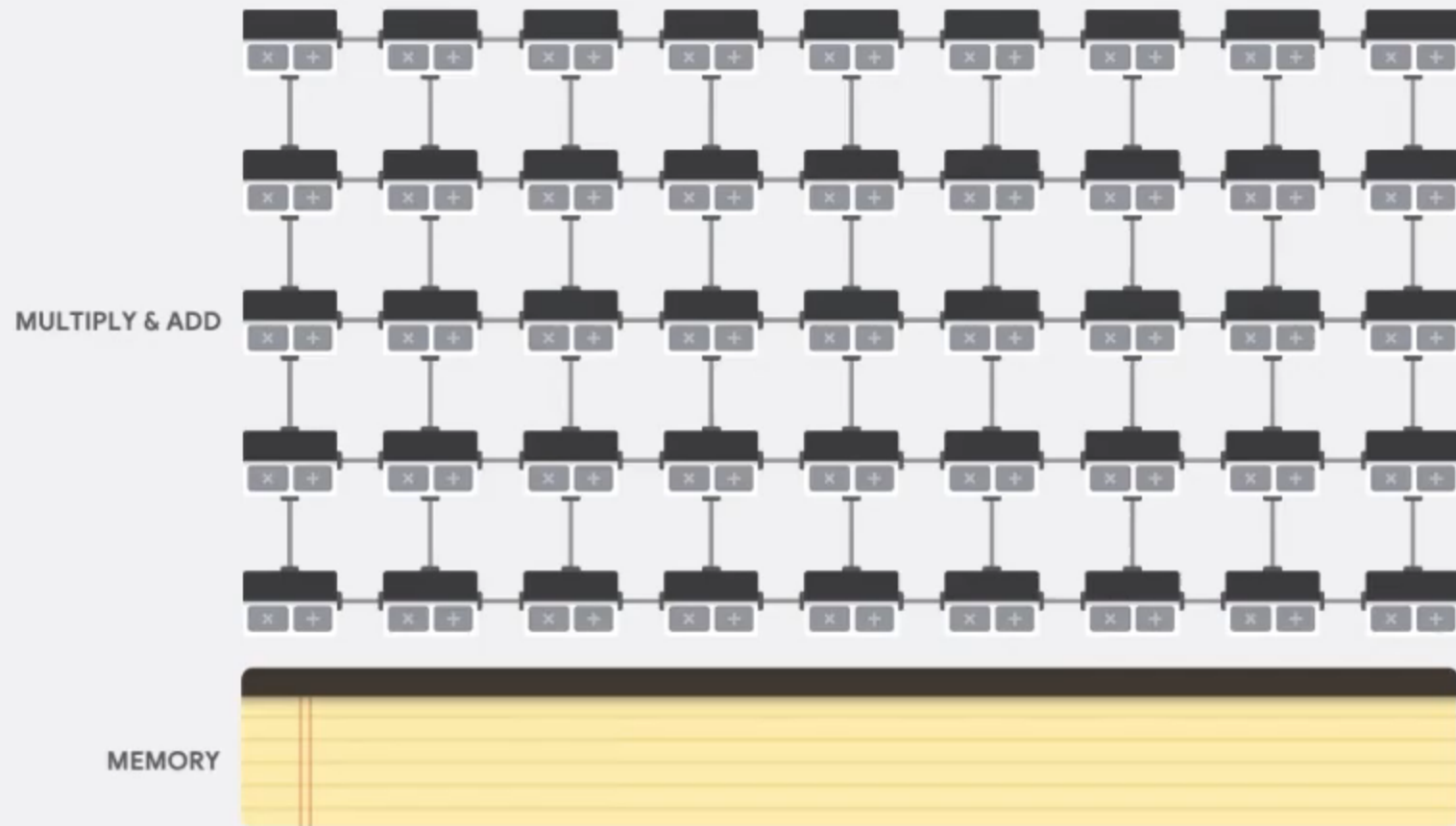


TPU가
뭐예요?

Systolic Array Architecture(2/8 core)



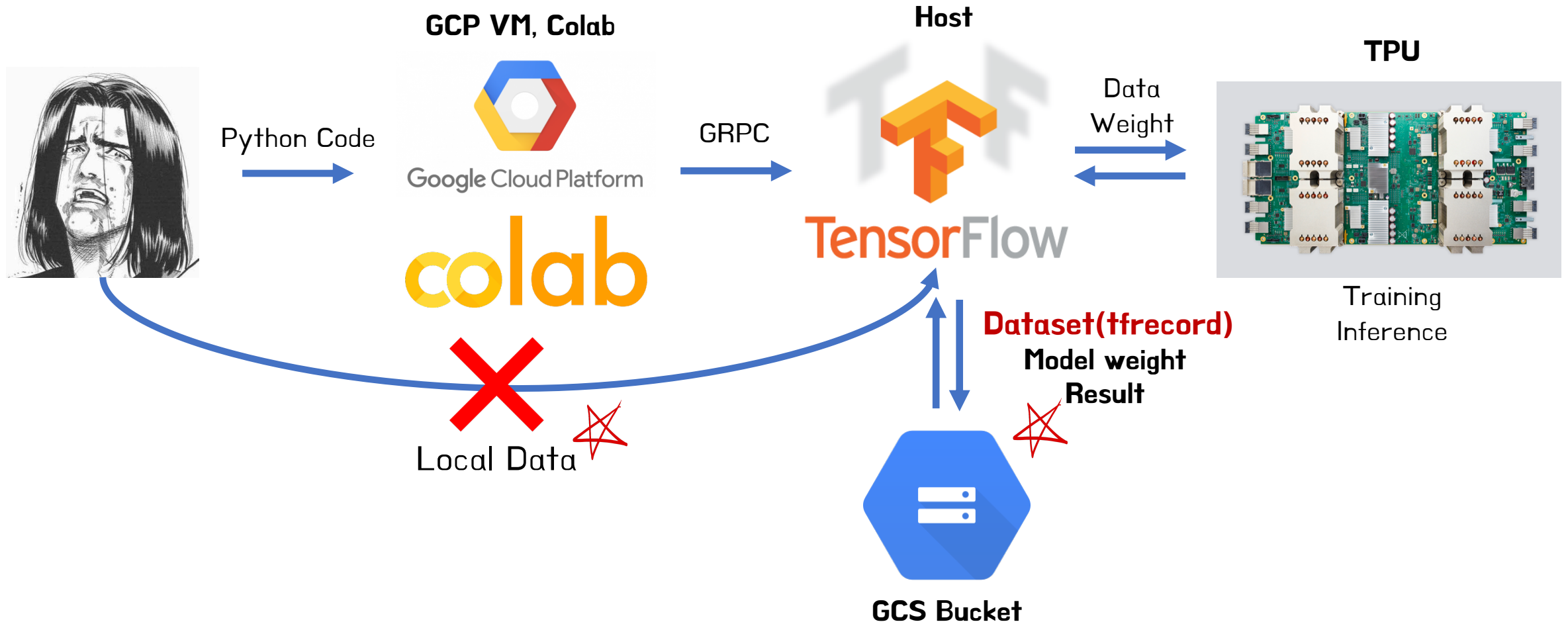
How TPU works





TPU가 뭐예요?

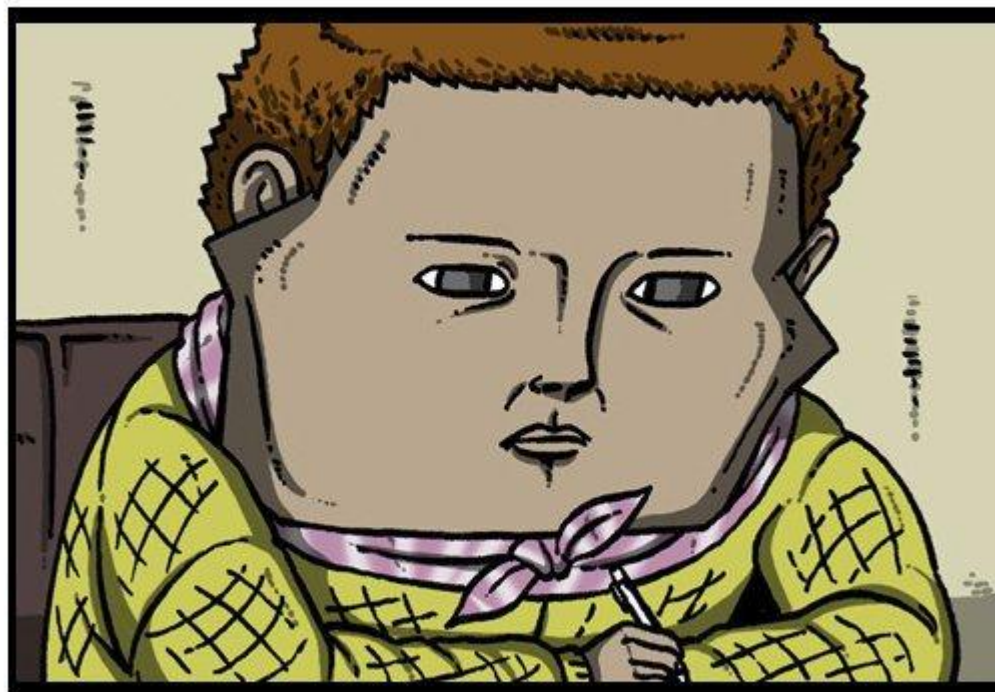
Cloud TPU



TPU가
뭐예요?

Cloud TPU Price

Version	v2	v3
비선점형	\$4.50	\$8.00
선점형	\$1.35	\$2.40





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TPU with colab

Highlighted Features

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Why colab for TPU?

Free!!

+ α

(for 12 hours)



에이 그래 가자 가 이놈들아!!

오예 고고!!

와하하하하하하하하하

Example usage - TPU Estimator

Below shows example usage of the TPU Estimator for a simple convolutional network.

```
import tensorflow as tf

from tensorflow.contrib.tpu.python.tpu import tpu_config
from tensorflow.contrib.tpu.python.tpu import tpu_estimator
from tensorflow.contrib.tpu.python.tpu import tpu_optimizer

def model_fn(features, labels, mode, params):
    # Define the model to construct the logits
    logits = # ...
    loss = tf.losses.softmax_cross_entropy(onehot_labels=labels, logits=logits)
    optimizer = tpu_optimizer.CrossShardOptimizer(
        tf.train.GradientDescentOptimizer(learning_rate=FLAGS.learning_rate))
    train_op = optimizer.minimize(loss, global_step=tf.train.get_global_step())
    return tf.estimator.EstimatorSpec(mode=mode, loss=loss, train_op=train_op)

def input_fn(params):
    # ...
    pass

def main():
    run_config = tpu_config.RunConfig(
        master=FLAGS.master,
        # ...
    )
    estimator = tpu_estimator.TpuEstimator(
        model_fn=model_fn,
        use_tpu=FLAGS.use_tpu,
        config=run_config,
        batch_size=FLAGS.batch_size)
    estimator.train(input_fn=input_fn, max_steps=FLAGS.train_steps)
```

For the complete [executable] example, see our open source TPU models.

세상에 공짜는 없나 봐요.



하지만...



TensorFlow
2.0.0 ALPHA 0



Keras



어떻게...?

ON AIR

LIVE



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Let's code with **colab**



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Tips & Caution

Highlighted Features

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colab Tips !

Docker 유지 시간 : 12 hours

- * 12시간 동안은 디스크 내부에 작업 파일 존재

런타임 연결 OUT 후 : 약 80분

- * 약 80분 내로 다시 연결 시 복원 가능

런타임 연결이 끊어짐
런타임 연결 제한시간이 초과되었습니다.

닫기 다시 연결

Colab 창 종료 후 : 약 80분

- * 창을 종료하더라도 다시 Colab으로 접속하면 복원



Caution !



GCS Caution !

Q. 한창 딥러닝 대회를 하고 있던 김모씨는 TPU v3 버전이 새로 나왔다는 소식을 듣고 한번 사용해보기위해 알아 보던 중 하필, 작업중이던 리전에는 v3가 없어서, 할 수 없이 다른 리전 (유럽)에 있는 TPU를 할당 받아서 사용했어요.

며칠 뒤, 김모씨는 과금된 영수증을 확인하고 기겁해 쓰러지고 말았어요!

무슨 일이 ??



GCS Caution !

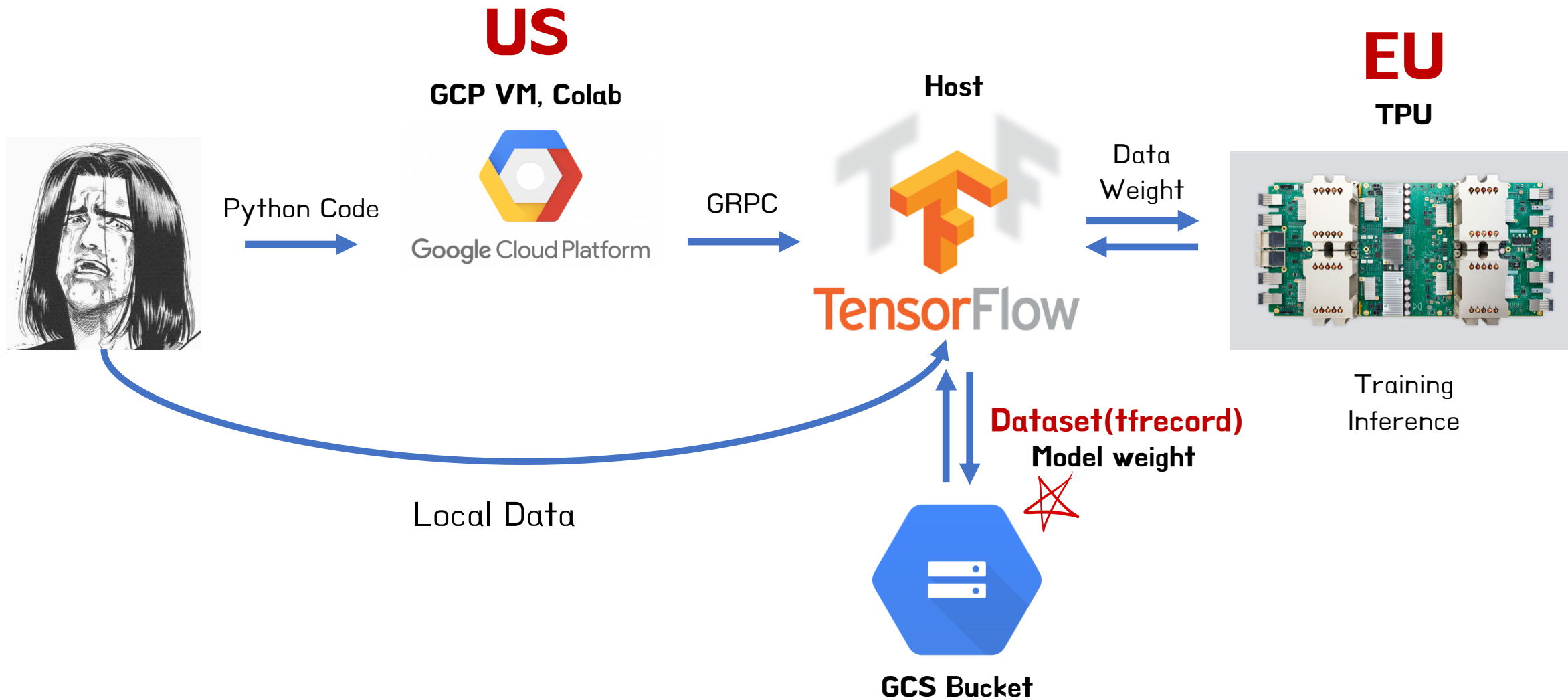
Q. 한창 딥러닝 대회를 하고 있던 김모씨는 TPU v3 버전이 새로 나왔다는 소식을 듣고 한번 사용해보기위해 알아 보던 중 하필, 작업중이던 리전에는 v3가 없어서, 할 수 없이 다른 리전 (유럽)에 있는 TPU를 할당 받아서 사용했어요.

며칠 뒤, 김모씨는 과금된 영수증을 확인하고 기겁해 쓰러지고 말았어요!

A. Network Egress

Tips & Caution

Network Egress



Tips & Caution

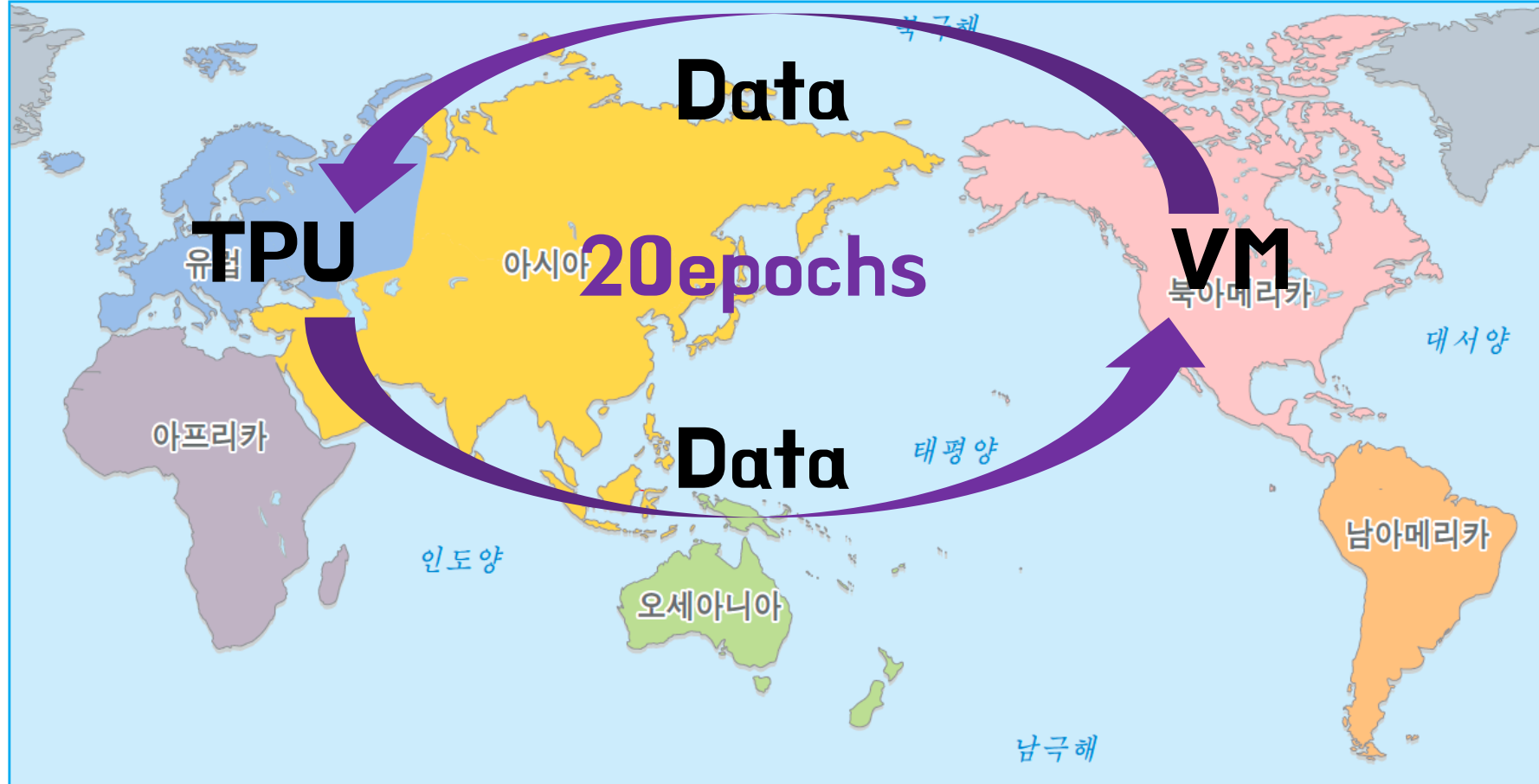
Network Egress

동일 위치 내(예: us-east1 에서 us-east1 으로, eu 에서 eu 로)	대륙 내 다른 위치 간(예: us-east1 에서 northamerica-northeast1 으로, us-east1 에서 us 로, us 에서 us-central1 으로)	세계 각지의 위치 간(예: us 에서 asia 로, australia-southeast1 에서 us-east1 으로)
무료	\$0.01/GB ¹	일반 네트워크 사용량 요금 적용

월별 사용량	전 세계 대상 위치 이그레스(아시아 및 오스트레일리아 제외) (1GB당)	아시아 대상 위치 이그레스(중국 제외, 홍콩 포함) (1GB당)	중국 대상 위치 이그레스(홍콩 제외) (1GB당)	오스트레일리아 대상 위치 이그레스 (1GB당)	인그레스
0~1TB	\$0.12	\$0.12	\$0.23	\$0.19	무료

Tips &
Caution

Network Egress



$$100\text{GB} * 20\text{epoch} * \$0.12 = \mathbf{\$240}$$





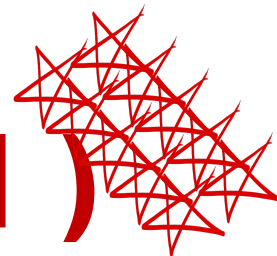
GCS Caution !

Q. Colab 환경에서 GCS Bucket과 연동하여 모델 학습 및 데이터 관리를 하고 싶다면?

A. GCS Bucket Region

||

Colab Region (us-central1)



Tips & Caution

What the Error !!

```
W0615 08:41:46.915936 139858515244928 tpu_strategy_util.py:56] TPU system %s has already been initialized.  
Model: "sequential"
```

Layer (type)	Output Shape	Param #
lstm (LSTM)	(None, 1024, 100)	48800
dense (Dense)	(None, 1024, 1)	101

```
Total params: 48,901  
Trainable params: 48,901  
Non-trainable params: 0
```

```
AbortedError                                Traceback (most recent call last)  
/usr/local/lib/python3.6/dist-packages/tensorflow/python/client/session.py in _do_call  
    1355         try:  
-> 1356             return fn(*args)  
    1357         except errors.OpError as e:
```

```
10 frames  
AbortedError: Session 3de99dcb7d452e4f is not found.
```

What the **Error !!**

이 세상 에러들이 아니에요.

정신건강에 그리 좋지 않습니다.



이유는 단 하나 ! 공짜



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정리

Highlighted Features

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정리

정리

장점

공짜
크롬 돌아갈 메모리면 OK
가격대비 성능 끝판왕

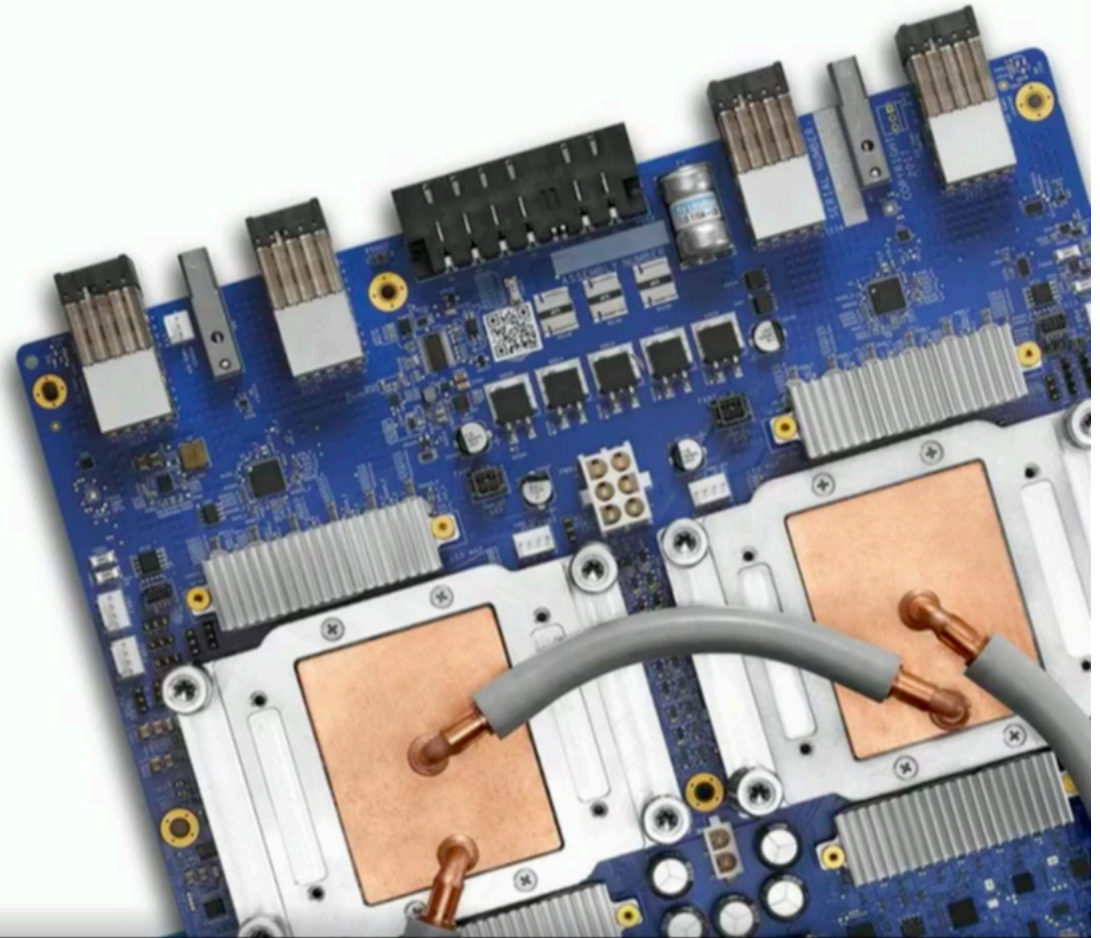
단점

멘탈 회복에 돈이 더 들어갈 수도...
현실은 Out Of Memory
언제 어떻게 바뀔지 아무도 모름

PyTorch + Cloud TPU

Collaboration in progress!

- Prototype training ResNet-50 now
- Planning to open source and expand functionality in collaboration with the community
- Email pytorch-tpu@googlegroups.com if interested!





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