## **Deep Learning for Business**

Deep Learning Computing Systems & Software Google AlphaGo

# Google AlphaGo

- Developed by Google DeepMind (London, U.K.)
- AlphaGo is the first Go game program to defeat professional human players
  - Go is a Chinese board game played on a 19x19 grid with White & Black stones
  - Considered the most challenging of classic games due to (19x19)!=361! possibilities





- 2015 October
  - AlphaGo wins all 5 games over the European Go champion Fan, Hui
  - "AlphaGo Fan" used 1,202 CPUs & 176 GPUs
    - ✓ CPU: Central Processing Unit
    - √ GPU: Graphics Processing Unit

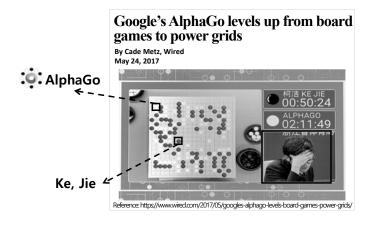
# Google AlphaGo

- 2016 March
  - AlphaGo won all but the fourth game (4-1) against Lee, Sedol of S. Korea, who is one of the world's top Go players
  - "AlphaGo Lee" used 50 first generation TPUs
     ✓ TPU: Tensor Processing Unit

- 2017 January
  - AlphaGo won all 60 unofficial online matches over the world's top Go players
  - "AlphaGo Master" used one 2<sup>nd</sup> Generation TPU
     ✓ TPU: Tensor Processing Unit

# Google AlphaGo

- 2017 May
  - AlphaGo wins all three games against the world No.1 ranked player Ke, Jie



#### **TPU (Tensor Processing Unit)**

- Google's ML (Machine Learning) ASIC (Application-Specific Integrated Circuit) processor designed specifically for TensorFlow
- TPU 1st Generation Integer calculations
  - 700 MHz clock speed



Google supercharges machine

AlphaGo Lee

learning-tasks-with-custom-chip.html/

#### Google AlphaGo

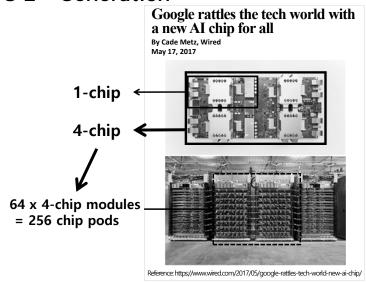
#### **TPU (Tensor Processing Unit)**

- TPU 2nd Generation
  - Total performance 11.5 PFLOPS

 $= 11.5 \times 10^{15} \text{ FLOPS}$ 

- √256 chip pods
- √ 64 integrated 4-chip modules per chip pod
- √ 1-chip module is rated at  $45 \text{ TFLOPS} = 45 \times 10^{12} \text{ FLOPS}$
- FLOPS: Floating Point Operations Per Second

#### TPU 2<sup>nd</sup> Generation



# Google AlphaGo

# **TPU (Tensor Processing Unit)**

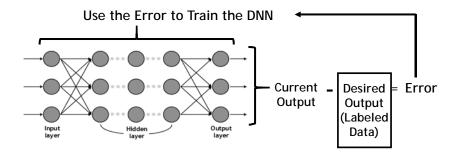
- AlphaGo key technologies
  - ATS (Advanced Tree Search)
  - DNN (Deep Neural Network)
- AlphaGo Networks
  - Policy Network
    - $\checkmark$  DNN that selects the next move to play
  - Value Network
    - ✓ DNN that predicts the game winner

#### **Training Process**

- Training based on ATS and DNN
  - Initial training was based on Supervised Learning using data from 160,000 games (30 million human moves)
  - Advanced training (for AlphaGo Master) was based on Reinforcement Learning by playing games against itself

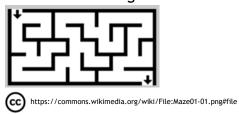
#### **Training Methods**

- Learning is a method used in training the weights of the DNN to make it perform in a desired way
- Supervised Learning
  - Training that uses labeled data (desired outputs)



#### **Training Methods**

- Reinforcement Learning
  - ✓ From Trial-and-Error, the best operation method
    is discovered by the DNN
  - √ Feedback is given back into the system
  - ✓ No labeled data is used
    - Different from Supervised Learning
  - ✓ Example: Maze Path Finding



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References

#### References

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