

# Deep-Learning 공개소프트웨어

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소프트웨어 중심사회의 Think Tank  Software Policy & Research Institute

# OSS for DL

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- TensorFlow, Google, 2015. 11. 9
- DMTK(CNTK), Microsoft, 2015. 11. 12(2016. 1. 25)
- Torch, Facebook, 2015. 1. 16
- CaffeOnSpark, Yahoo, 2016. 2. 26
- Warp-CTC, Baidu, 2016. 1. 14
- Veles, 삼성전자, 2015. 11월
- DIGITS, NVIDIA, 2015. 3월
- DL4j, Skymind, 2014. 6월
- ...

# Source Open 이유: Give & Take

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## ● Give

- 공유: 개발과정의 시행착오 최소화, 누구나 쉽고 빠르게 접근
- 공헌: 집단지성에 의한 협력개발로 당분야 기술발전에 기여
- 공익: AI(DL) 기술의 잘못된 사용을 사전에 방지

## ● Take

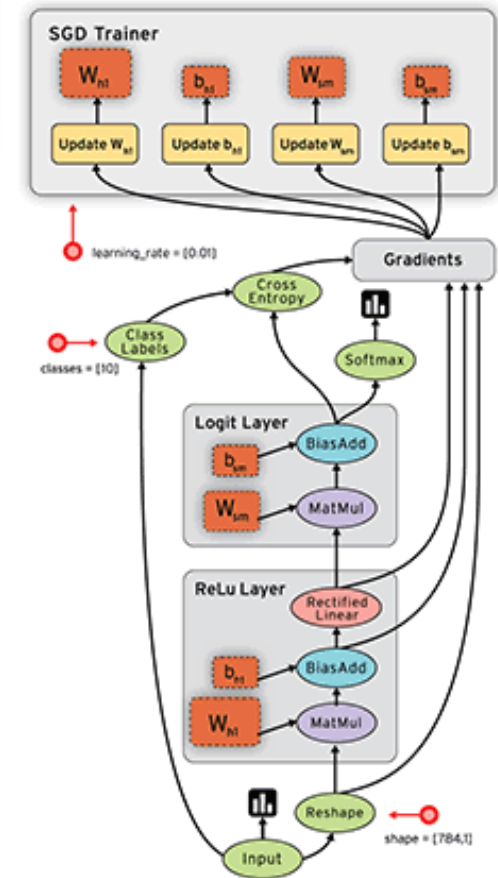
- 기술주도권 확보: 표준화, 다양한 응용 발굴, 시장영향력 확대
- 인력수급: User 확장, 인재 확보
- 기술개선: 외부연구자의 도움에 의한 feedback 및 기술개선 효과

# TensorFlow(1)

- Google Brain Team, 2015. 11. 9

“..., we hope to create an open standard for exchanging research ideas and putting machine learning in products”

- <https://www.tensorflow.org/>
- DL library based on Data Flow Graphs
- version-up from DistBelief(2011)
- Language options: Python, C++
- 64-bit Linux, Mac OS X, Android, iOS
- Apache 2.0 open source license



Data Flow Graph

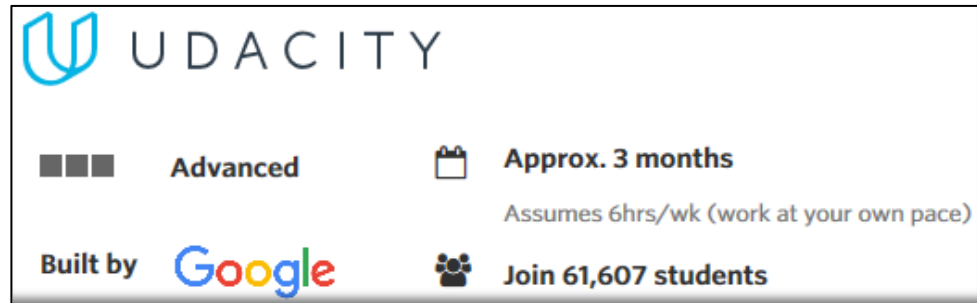
# TensorFlow(2)

- **Applications**

Gmail(smart reply, spam filtering), Speech recognition, Google Translate, Google Photos, Google DeepDream, Google RankBrain, ...

- **TensorFlow courseware in Udacity(MOOC)**

- <https://www.udacity.com/course/deep-learning--ud730>



UDACITY

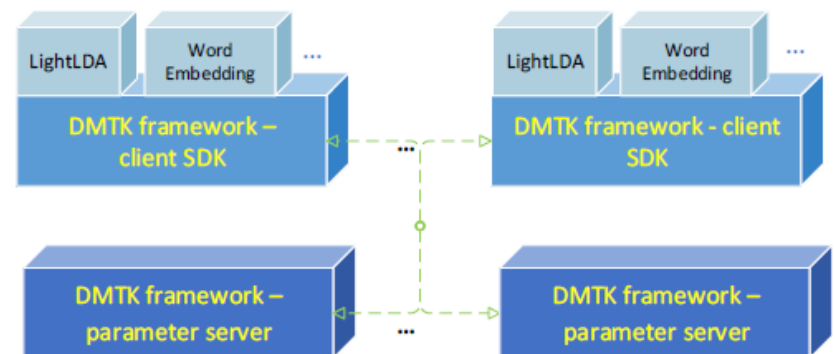
■■■ Advanced      📅 Approx. 3 months  
Assumes 6hrs/wk (work at your own pace)

Built by Google      👥 Join 61,607 students

- Prerequisites
  - Minimum 2 years of programming experience (preferably in Python)
  - Git and GitHub experience (assignment code is in a GitHub repo)
  - Basic machine learning knowledge (especially supervised learning)
  - Basic statistics knowledge (mean, variance, standard deviation, etc.)
  - Linear algebra (vectors, matrices, etc.)
  - Calculus (differentiation, integration, partial derivatives, etc.)

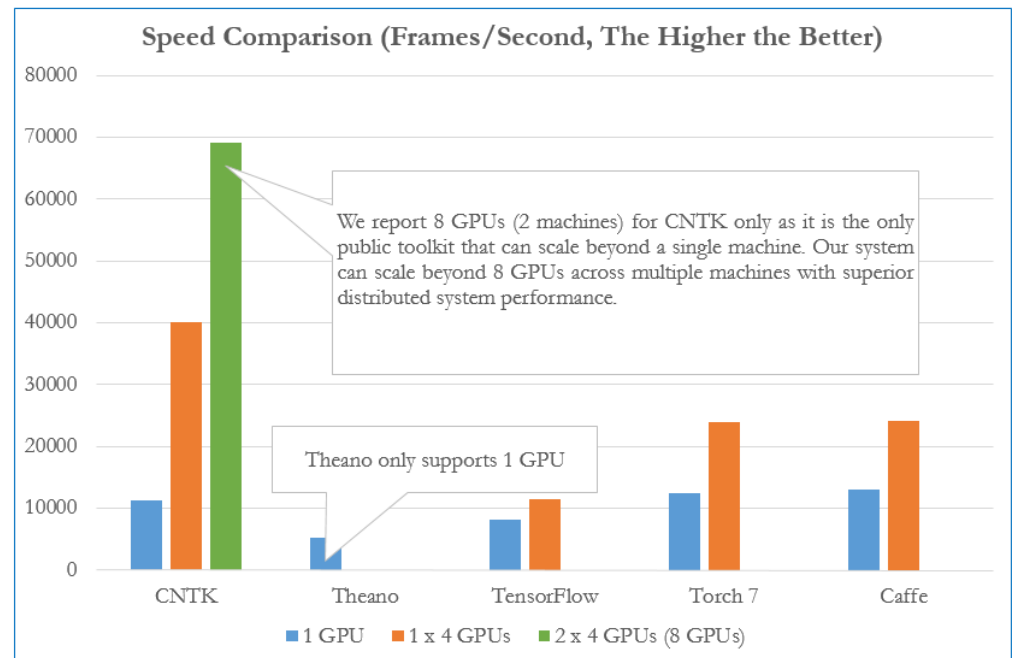
# DMTK

- Microsoft Asia research lab, 2015. 11. 12
- <http://www.dmtk.io/>, <https://github.com/Microsoft/DMTK>
- Distributed Machine Learning Toolkit
  - 빅데이터를 다수의 컴퓨터로 학습할 수 있는 library/framework
- Client/Server방식; C++기반 SDK
- Windows server 2012, or Ubuntu 12.04
- MS Visual studio 2013(Windows), or g++ 4.8(Linux)
- MIT open source license
- Applications
  - topic modeling, word embedding
  - computer vision, text/speech understanding



# CNTK

- Microsoft, 2016. 1. 25
- <http://www.cntk.ai/>
- **Computational Network Toolkit**
  - 복잡한 구조의 다계층 신경망을 구성할 수 있는 딥러닝 툴킷
  - High speed performance
- MS Cortana, skype 번역
- C++, (Python)



# Torch

- Facebook, 2015. 1. 16 (origin - 2002. 10월)
- <http://torch.ch/>
- Deep learning library for Lua/LuaJIT language
- Linux, Mac OS X, Android, iOS
- Used by FAIR, Google DeepMind, MS, NVIDIA, IBM, Twitter, ...
- **Key Features**
  - Large-scale Convolutional NN
  - Parallelization over Multiple GPUs
- **Optimized for NVIDIA GPU(CUDA)**
- **BSD open source license**



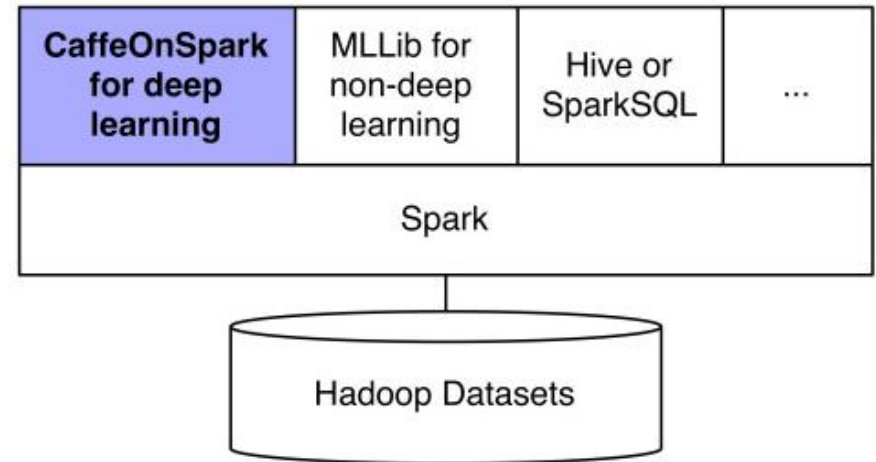


# CaffeOnSpark

- Yahoo, 2016. 2. 26
- <https://github.com/yahoo/CaffeOnSpark>
- Deep learning system written in C++

"..., we created CaffeOnSpark to allow deep learning training and testing to be embedded into Apache Spark applications"

- Yahoo flicker(photo sharing),  
음성인식, 비디오분석, ...
- Apache 2.0 open-source license
- Open data: 2000만 사용자의  
뉴스피드 정보(1.5TB)



# Caffe

- **BVLC(Berkeley Vision and Learning Center)**
- <https://github.com/BVLC/caffe>
- **Open source framework: fast way to apply deep learning**
  - C++/CUDA architecture (Python, Matlab interfaces)
  - Tools, reference models, demos, and fast & well-tested codes
  - Seamless switch between CPU and GPU
  - Optimized for Ubuntu(Linux) 14.04 and 12.04
- **BSD 2-Clause license**

Framework	License	Core language	Binding(s)	CPU	GPU	Open source	Training	Pretrained models	Development
Caffe	BSD	C++	Python, MATLAB	✓	✓	✓	✓	✓	distributed
cuda-convnet <sup>7</sup>	unspecified	C++	Python		✓	✓	✓		discontinued
Decaf <sup>2</sup>	BSD	Python		✓		✓	✓	✓	discontinued
OverFeat <sup>9</sup>	unspecified	Lua	C++,Python	✓				✓	centralized
Theano/Pylearn2 <sup>4</sup>	BSD	Python		✓	✓	✓	✓		distributed
Torch7 <sup>1</sup>	BSD	Lua		✓	✓	✓	✓		distributed

# Warp-CTC

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- **Baidu Silicon Valley AI Lab(SVAIL), 2016. 1. 14**

“..., we want to make end-to-end deep learning easier and faster so researchers can make more rapid progress.” (Andrew Ng)

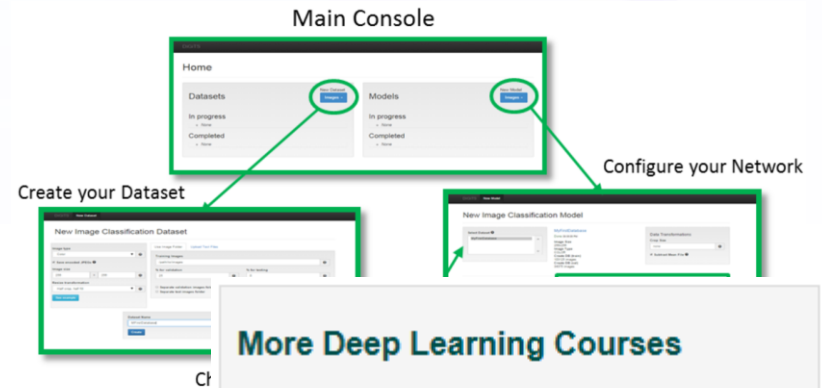
- <https://github.com/baidu-research/warp-ctc>
- a C library along with integration for Torch
- specialized for time-series data, such as speech recognition
- used for developing 'DeepSpeech2'
- Ubuntu 14.04 and OSX 10.10

# Veles

- 삼성전자, 2015. 11월
- <https://velesnet.ml/>
- **Distributed platform for rapid DL application development**
  - Platform - <https://github.com/Samsung/veles>
  - Zincz plugin – NN engine (all widely used NN topologies)
  - Mastodon – Java bridge for Hadoop, etc
  - SoundFeatureExtraction – audio signal library
- **support OpenCL and CUDA**
- **Flow-based programming using Python**
- **Apache 2.0 open-source license**

# DIGITS

- NVIDIA, 2015. 3. 17
- <https://developer.nvidia.com/digits>,  
<https://github.com/NVIDIA/DIGITS>
- Interactive system for developing, training and visualizing deep neural networks
- Integrates Caffe, utilizing cuDNN for GPU acceleration
- Deep learning courses for NVIDIA Developer Center
  - <https://developer.nvidia.com/deep-learning-courses>



## More Deep Learning Courses

Introduction to Deep Learning, by Andrew Ng  
([Coursera](#) | [YouTube](#))

NYU Course on Deep Learning, by Yann LeCun  
([TechTalks](#))

Neural Networks for Machine Learning" course, by Geoffrey Hinton ([Coursera](#))

Deep Learning for Computer Vision, a NIPS tutorial by Rob Fergus ([slides](#), [video](#))

CalTech's introductory deep learning course, by Yasser Abu-Mostafa ([YouTube](#))

Stanford CS224d: [Deep Learning for Natural Language Processing](#) (homepage)

# DL4j

- Skymind(startup), 2014. 6월

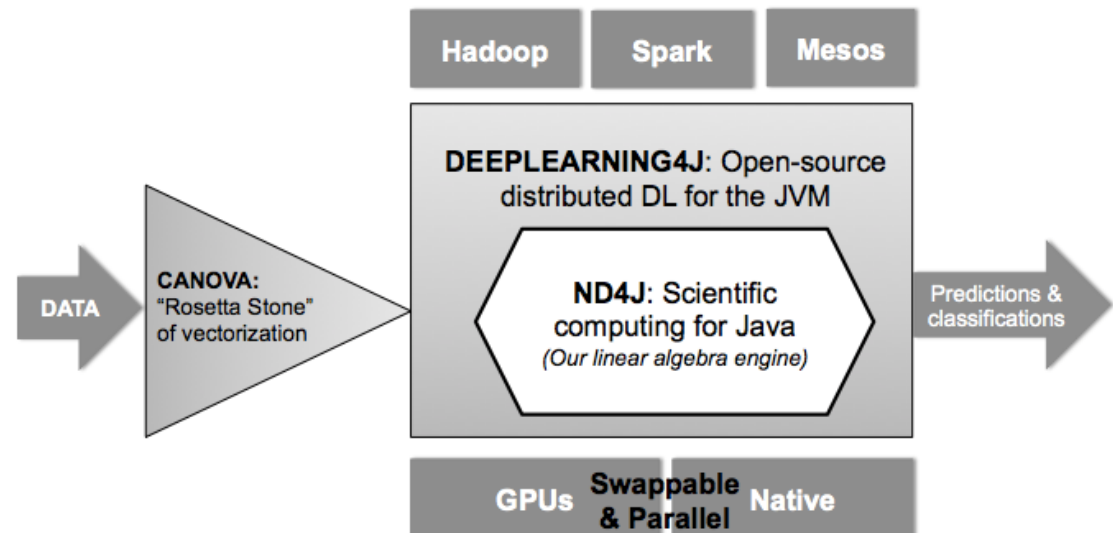
“... we just want to make deep learning applicable to everybody else”

- Java와 Scala로 작성된 첫 상용 수준의 오픈소스 분산처리 딥러닝 라이브러리 - <http://deeplearning4j.org/>

- Apache 2.0 open source license

- Applications

- Face/image recognition
- Voice search
- Speech-to-text (transcription)
- Spam filtering (anomaly detection)
- Fraud detection
- Recommender Systems (CRM)
- Regression



# DL OSS 선택 기준

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- Target applications – NN Models
- Open source license
- Data-oriented vs Model-oriented
- Language bindings, OS
- Multi-GPU?
- Business partnership

# Wikipedia Comparison

- [https://en.wikipedia.org/wiki/Comparison\\_of\\_deep\\_learning\\_software](https://en.wikipedia.org/wiki/Comparison_of_deep_learning_software)

Deep learning software by name

*This list is incomplete; you can help by expanding it.*

Software	Creator
Caffe	Berkeley Vision and Learning Center, community contributors
CNTK	Microsoft
Deeplearning4j	Various; originally Adam Gibson
Neural Designer	Artelnics
OpenNN	Artelnics
SystemML <sup>[22]</sup>	IBM Research, Databricks, Netflix
TensorFlow	Google Brain team
Theano	Université de Montréal
Torch	Ronan Collobert, Koray Kavukcuoglu, Clement Farabet

Software	Creator	Software license <sup>[3]</sup>	Open source	Platform	Written in
Caffe	Berkeley Vision and Learning Center, community contributors	BSD 2-Clause License	Yes	Ubuntu, OS X, AWS, <sup>[1]</sup> unofficial Android port, <sup>[2]</sup> Windows support by Microsoft Research, <sup>[3]</sup> unofficial Windows port <sup>[4]</sup>	C++, Python <sup>[5]</sup>
CNTK	Microsoft	Free <sup>[12]</sup>	Yes	Windows, Linux <sup>[13]</sup>	C++
Deeplearning4j	Various; originally Adam Gibson	Apache 2.0	Yes	Linux, OSX, Windows, Android, CyanogenMod (Cross-platform)	Java, Scala, C
Neural Designer	Artelnics	Proprietary	No	Windows, OS X, Linux	C++
OpenNN	Artelnics	GNU LGPL	Yes	Cross platform	C++
SystemML <sup>[22]</sup>	IBM Research, Databricks, Netflix <sup>[23]</sup>	Apache 2.0	Yes	Linux, Mac OS, Windows	Java, R
TensorFlow	Google Brain team	Apache 2.0	Yes	Linux, Mac OS X (no support for Windows yet <sup>[24]</sup> )	C++, Python
Theano	Université de Montréal	BSD license	Yes	Cross-platform	Python
Torch	Ronan Collobert, Koray Kavukcuoglu, Clement Farabet	BSD License	Yes	Linux, Android, <sup>[28]</sup> Mac OS X, iOS	C, Lua



# OpenAI

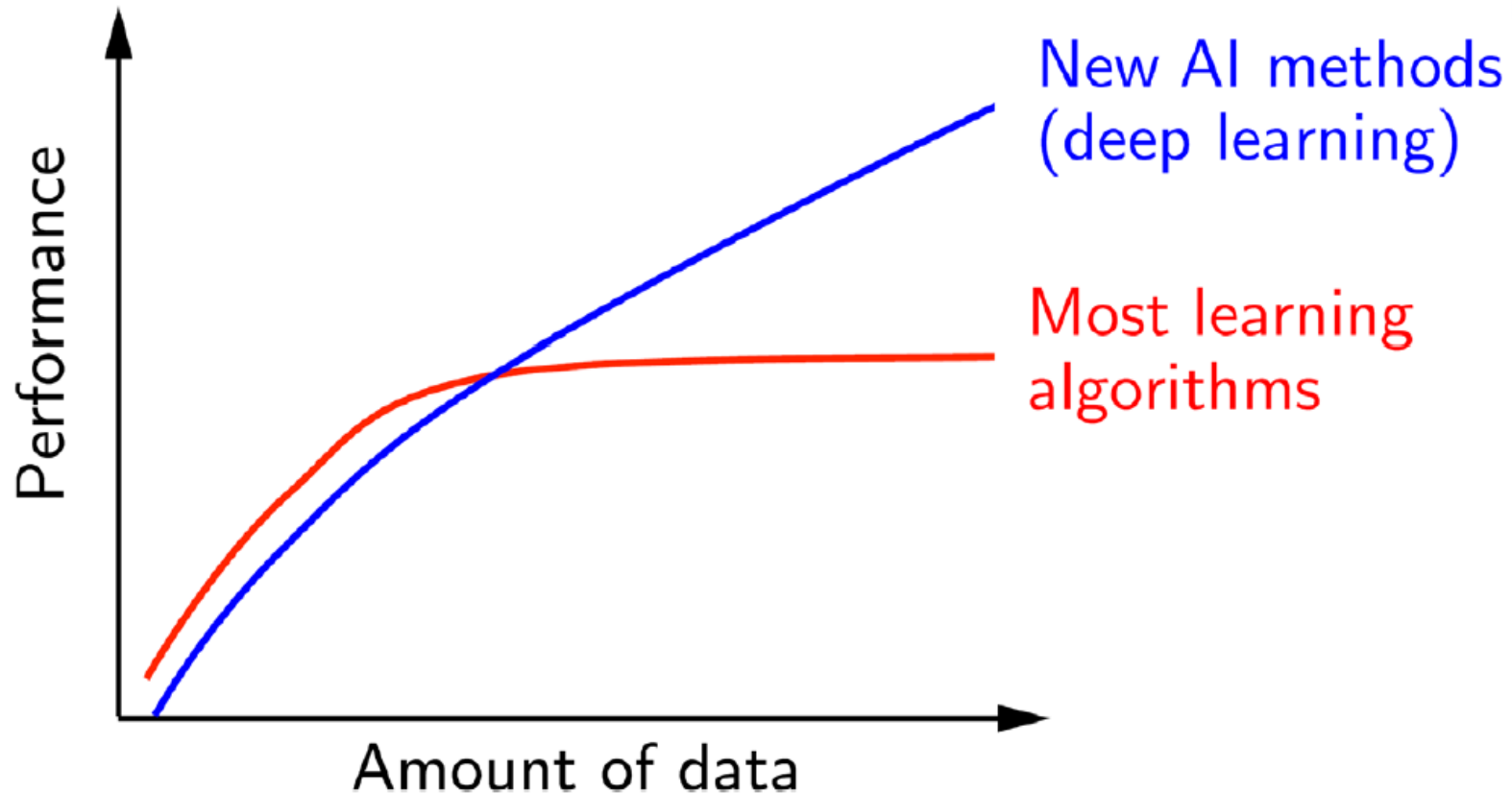
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- 2015. 12. 11 설립, [www.openai.com](http://www.openai.com)
- Non-profit AI organization with \$1B fund
  - Elon Musk(Tesla 창업자) & Sam Altman(Y combinator 대표)
  - Paypal, Amazon, Infosys, LinkedIn, ...
- Motivated by concerns about existential risk from advanced AI

“..., if advanced AI someday gains the ability to re-design itself at an ever-increasing rate, an unstoppable intelligence explosion could lead to human extinction” (Stephen Hawking, Stuart Russell, etc)
- Aims
  - promote and develop open-source friendly AI to benefit humanity
  - freely collaborate with other institutions and researcher by making its patents and research open to the public

# Deep Learning Breakthrough

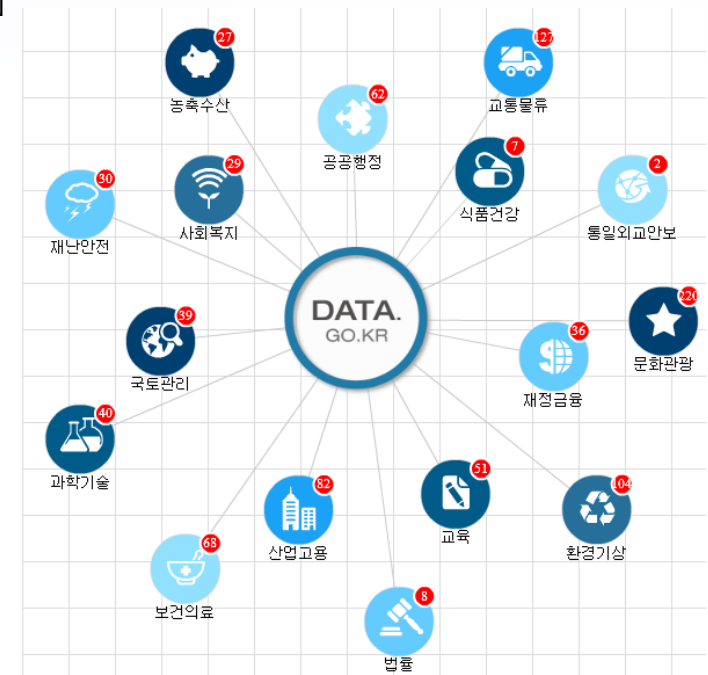
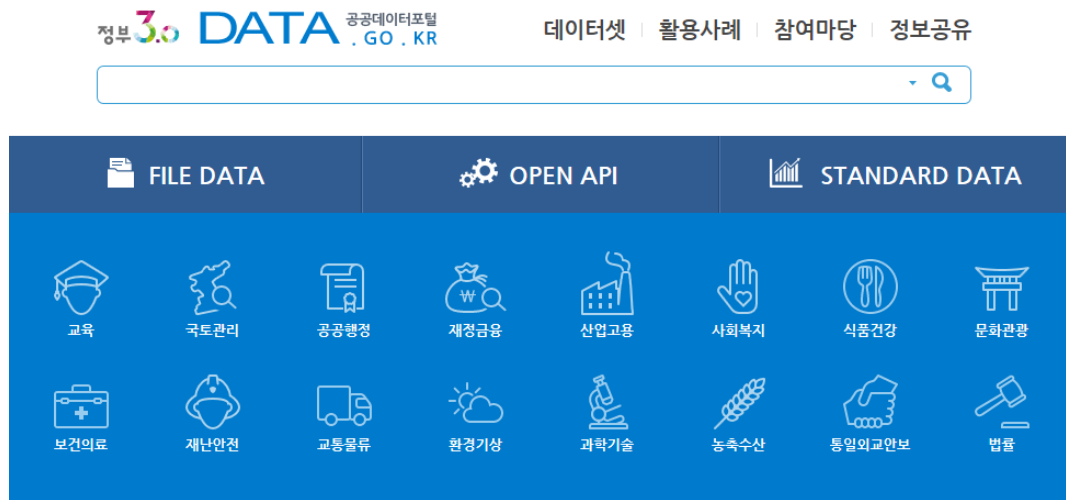
- Breakthrough = DL + BigData



[윤성로, 딥러닝 워크샵 2015]

# open Data

- 공공데이터 포털(행자부, 2011.6): [www.data.go.kr](http://www.data.go.kr)
  - 「공공데이터의 제공 및 이용 활성화에 관한 법률」 제21조(공공데이터포털의 운영)



- K-ICT 빅데이터센터(미래부, 2013.11): <https://kbig.kr/>

# 참고자료

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- 다시 주목받는 인공지능, 그리고 구글 텐서플로우 공개가 시사하는 점, SPRI 월간 SW중심사회 2015년 12월호, 안성원
- 기계학습의 원리, 능력과 한계, 기계학습과 알파고 세미나(2016. 3. 4), 김진형
- 딥러닝 워크샵(2015. 10. 15), 인공지능소사이어티, SKT타워
- 인공지능(AI), 오픈소스 경쟁 시작됐다, 미디어잇, 유진상, <http://www.it.co.kr/news/article.html?no=2816278>
- 페이스북 인공지능 '머신러닝' '딥러닝'의 현재와 미래, IT뉴스, 차원용, <http://www.itnews.or.kr/?p=16848>
- Deep Learning Software links, [http://deeplearning.net/software\\_links/](http://deeplearning.net/software_links/)
- Wikipedia, <http://www.wikipedia.org>