# GPU parallel computing for machine learning in Python

how to build a parallel computer

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### GPU parallel computing for machine learning in Python a step-by-step approach to building a GPU parallel computer

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#### Introduction

This book illustrates how to build a GPU parallel computer. If you don't want to waste your time for building, you can buy a built-in-GPU desktop/laptop machine. All you need to do is to install GPU-enabled software for parallel computing. Imagine that we are in the midst of a parallel computing era. The GPU parallel computer is suitable for machine learning, deep (neural network) learning. For example, GeForce GTX1080 Ti is a GPU board with 3584 CUDA cores. Using the GeForce GTX1080 Ti, the performance is roughly 20 times faster than that of an INTEL i7 quad-core CPU. We have benchmarked the MNIST hand-written digits recognition problem (60,000 persons: hand-written digits from 0 to 9). The result of MNIST benchmark for machine learning shows that GPU of a single GeForce GTX1080 Ti board takes only less than 48 seconds while the INTEL i7 quad-core CPU requires 15 minutes and 42 seconds.

A CUDA core is most commonly referring to the single-precision floating point units in an SM (streaming multiprocessor). A CUDA core can initiate one single precision floating point instruction per clock cycle. CUDA is a parallel computing platform and application programming interface (API) model created by Nvidia. It allows software developers and software engineers to use a CUDA-enabled graphics processing unit (GPU) for general purpose processing. The GPU parallel computer is based on SIMD (single instruction, multiple data) computing.

The first GPU for neural networks was used by Kyoung-Su Oh, et al. for image processing published in 2004 (1). A minimum GPU parallel computer is composed of a CPU board and a GPU board.

This book contains the important issue on which CPU/GPU board you should buy and also illustrates how to integrate them in a single box by considering the heat problem. The power consumption of GPU is so large that we should take care of the temperature and heat from the GPU board in the single box. Our goal is to have the faster parallel computer with lower power dissipation.

Software installation is another critical issue for machine learning in Python. Two operating system examples including Ubuntu16.04 and Windows 10 system will be described. This book shows how to install CUDA and cudnnlib in two operating systems. Three frameworks including pytorch,

keras, and chainer for machine learning on CUDA and cudnnlib will be introduced. Matching problems between operating system (Ubuntu, Windows 10), library (CUDA, cudnnlib), and machine learning framework (pytorch, keras, chainer) are discussed.

#### Chapter 1 How to build a GPU parallel computer

In order to build a GPU parallel computer, it is easy to use a **barebones PC.** According to Wikipedia, the barebones PC is a **computer** that has minimal components. A typical **barebones system** includes a case, motherboard, CPU, hard drive, RAM, and power supply. Most **barebones** systems are sold as kits, in which the components must be assembled by the user.

We have investigated barebones PCs available in the market. We have decided to use an inexpensive barebones PC, shuttle SZ170R8V2 which can accommodate a NVIDIA GTX 1080 Ti and an INTEL i7 quad-core CPU with 500W power supply as shown in Fig. 1.1



Fig. 11 Shuttle SZ170R8V2 (barebones PC)

Fig. 2 shows a Shuttle SZ170R8V2 motherboard. Shuttle SZ170R8V2 motherboard can accommodate a CPU (i7 7700 quad-core) and 4 memory slots where 4 memory cards (DDR4 PC4-17000 16GB) are used. INTEL Core i7 7700 CPU should be chosen instead of INTEL Core i7 7700k. The power consumption of the maximum FPU load of INTEL Core i7 7700 CPU is 65W [1] while that of INTEL Core i7 7700k CPU is 95W [2]. i7-7700k supports overclocking designated by the "K" suffix. In order to reduce the power consumption, INTEL Core i7 7700 CPU is selected. INTEL Core i7 7700 CPU should be inserted to the center of the motherboard as shown in Fig. 1.2.

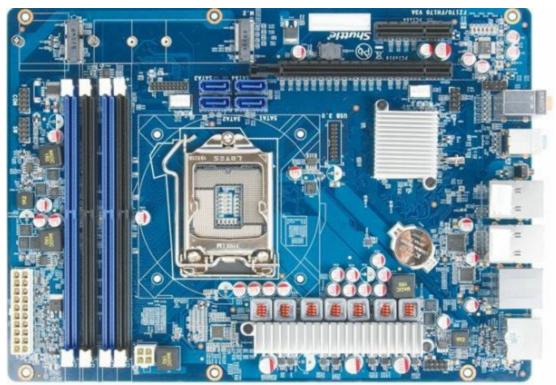


Fig. 1.2 Shuttle SZ170R8V2 motherboard

A minimum GPU parallel computer is composed of a motherboard with a CPU, a GPU board, and SSD or Hard disk storages. We use a 3.5 inch 2TB hard disk. We may replace the hard disk with SSD. Because of the BIOS problem, your SSD may not be recognized by the current BIOS of the motherboard. It is safer to use the cheap hard disk instead of the expensive SSD.

The latest GPU board of NVIDIA GeForce GTX 1080 Ti has 3584 CUDA cores. GeForce GTX has several series: GTX 1070, GTX 1080, and GTX 1080 Ti. Table 1 shows the detailed specification of NVIDIA GeForce GXT boards..

Table 1 Specification of NVIDIA GPU GTX boards

	1080 Ti	1080	1070
CUDA Cores	3584	2560	1920
Core Clock	1480MHz	1607MHz	1506MHz
Boost Clock	1582MHz	1733MHz	1683MHz
VRAM	11GB	8GB	8GB
Memory Clock	11GB/s	10Gb/s	8GB/s
Memory Bus Width	384-bit	256-bit	256-bit
Memory Bandwidth	484GB/s	320GB/s	256GB/s
TDP	250W	180W	150W
Power connector(s)	1x 8-pin, 1x 6-pin	1x 8-pin	1x 8-pin

You should be aware of the power consumption of every GPU board. For example, a single NVIDIA GeForce GTX 1080 Ti board requires 600W recommended by NVIDIA instead of 250W. However, the peak power is around 267W for NVIDIA GTX 1080 Ti where the maximum GPU temperature is 91 degree Celcius [3]. In order to use the NVIDIA GeForce GTX 1080 Ti board, six-pin/eight-pin PCI Express connectors are used as shown in Fig. 1.3.

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Fig 1.3 PCI Express connector

left: singular six-pin PCI Express connector right: singular eight-pin PCI Express connector

Once you build the Shuttle PC with INTEL Core i7 7700 CPU installed in the CPU socket, 4x16GB memory cards inserted, and the hard disk, you should add a NVIDIA GeForce GTX 1080 Ti board. You must download the latest Ubuntu 16.04 image from one of Ubuntu archive sites in your country. As of today (2017.6.16), ubuntu-16.04.2-desktop-amd64.iso should be burned to a DVD media.

In order to see what is going on in software installation, you need to use a HDMI display, a keyboard, and a mouse. Connect the DVD player with Ubuntu 16.04 media to the motherboard by a USB cable. Turn on the power of the motherboard. Follow the instruction of Ubuntu installation. Once you setup the IP address of the GPU parallel machine, you don't need the HDMI display. In order to use remote-login, you must install openssh-server by:

\$ sudo apt install openssh-server.

You should update and upgrade the Ubuntu system by:

\$ sudo apt update

\$ sudo apt upgrade

It is important to install vncserver on the GPU parallel machine. To install vncserver, you should type:

\$ sudo apt install tightvncserver

Once you installed tightvncserver, run tightvncserver

\$ vncserver

.vnc directory will be created

\$ cd .vnc

You should edit xstartup file by using nano or vi editor. cat command shows the content of xstartup file.

\$ cat xstartup
#!/bin/sh
MODE="GNOME"
unset SESSION\_MANAGER
metacity &
gnome-settings-daemon &
gnome-panel &

To kill tightvncserver, type \$ vncserver -kill :1 Note that 1 indicates tightvncserver process number.

To run tightvncserver again, type \$ vncserver

In order to remote login to the GPU parallel machine from the remote machine, you should install tightvncviewer.

To install tightvncviewer, download tightviewer from the following site: http://www.tightvnc.com/

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#### References:

- 1. http://www.tomshardware.com/reviews/intel-kaby-lake-core-i7-7700k-i7-7700-i5-7600k-i5-7600,4870-9.html
- 2. http://www.tomshardware.com/reviews/intel-kaby-lake-core-i7-7700k-i7-7700-i5-7600k-i5-7600,4870-8.html
- 3.https://www.techpowerup.com/reviews/NVIDIA/GeForce\_GTX\_1080\_Ti/28

## Chapter 2 How to install GPU software for machine learning

We need to install three kinds of software: CUDA, cudnnlib, and machine learning framework. In this book, two operating systems (Ubuntu 16.04 and Windows 10) are explained where different version of CUDA and cudnnlib should be installed depending on installed operating system. Three machine learning frameworks are introduced: pytorch, keras, and chainer. Chapter2.1 explains how to install GPU software on Ubuntu 16.04. Chapter2.2 shows how to install GPU software for Windows 10.

### Chapter 2.1 GPU parallel machine based on Ubuntu 16.04

In order to install CUDA software, you should access to the following site: https://developer.nvidia.com/cuda-downloads

#### **CUDA** installation

In Select Target Platform menu, pick "Linux", "x86\_64", "Ubuntu", "16.04", "deb (local)" respectively. The downloaded file is 1.9GB size.





Fig. 2.1.1 CUDA downloadable file for Ubuntu 16.04

Download the file, cuda-repo-ubuntu1604-8-0-local-ga2\_8.0.61-1\_amd64.deb The following command, dpkg, can install cuda software.

- $\$  sudo dpkg -i cuda-repo-ubuntu<br/>1604-8-0-local-ga<br/>2 $\$  8.0.61-1 $\$  amd<br/>64.deb
- \$ sudo apt update
- \$ sudo apt upgrade
- \$ sudo apt install cuda

#### Miniconda installation

\$ wget https://repo.continuum.io/miniconda/Miniconda2-latest-Linux-x86 64.sh

\$ bash Miniconda2-latest-Linux-x86 64.sh

Welcome to Miniconda 24.3.21 (by Continuum Analytics, Inc.)

In order to continue the installation process, please review the license agreement.

Please, press ENTER to continue

>>>

\$ conda update conda

#### virtualenv installation

\$ conda install virtualenv

Close terminal and reopen terminal

virtualenv command creates p27 environment (python2.7 environment)

\$ virtualenv p27 -p \$(which python)

#### cudnnlib installation

In order to download cudnnlib, you have to access to the following site:

https://developer.nvidia.com/cudnn

This is very important to select the right cuDNN library.

Since we have installed CUDA8.0, you have to pick cuDNN v6.0, cuDNN v5.1, or cuDNN v5 of CUDA8.0. Purchased GeForce GXT 1080 Ti is based on cuDNN v5.1 so that we have selected cuDNN v5.1 Library for Linux.

Download the following file cudnn-8.0-linux-x64-v5.1-tgz:

https://developer.nvidia.com/compute/machine-

learning/cudnn/secure/v5.1/prod\_20161129/8.0/cudnn-8.0-linux-x64-v5.1-tgz

\$ mv cudnn-8.0-linux-x64-v5.1-tgz cudnn-8.0-linux-x64-v5.1.tgz

The following tar command creates two directories.

\$ tar xvf cudnn-8.0-linux-x64-v5.1.tgz

created folder: cuda/include cuda/lib64

Copy several important files: cudnn.h and libcudnn\*

chmod a+r command adds read permission for all classes

\$ sudo cp cuda/include/cudnn.h /usr/include/

\$ sudo cp cuda/lib64/libcudnn\* /usr/local/cuda/lib64

\$ sudo chmod a+r /usr/local/cuda/lib64/libcudnn\*

Download two files although they are for Ubuntu14.04:

https://developer.nvidia.com/compute/machine-

learning/cudnn/secure/v5.1/prod 20161129/8.0/libcudnn5 5.1.10-

1+cuda8.0 amd64-deb

https://developer.nvidia.com/compute/machine-

learning/cudnn/secure/v5.1/prod 20161129/8.0/libcudnn5-dev 5.1.10-

1+cuda8.0 amd64-deb

And install two files by dpkg -i command:

\$ sudo dpkg -i libcudnn5\_5.1.10-1+cuda8.0\_amd64.deb

\$ sudo dpkg -i libcudnn5-dev 5.1.10-1+cuda8.0 amd64.deb

\$ sudo echo "/usr/local/cuda-8.0/lib64">/etc/ld.so.conf.d/cuda-8-0.conf

\$ sudo 1dconf

#### keras (machine learning framework)

In order to activate p27 environment (python2.7 environment), run the following source command:

\$ source p27/bin/activate

Once p27 is activated, prompt will be (p27).

In order to install keras and tensorflow-gpu, run the following command:

(p27) \$ pip install keras tensorflow-gpu

"python -V" command shows python version.

(p27) \$ python -V

python 2.7.12

"pip -V" command shows pip version.

(p27) \$ pip -V

pip 9.0.1 from /home/takefuji/p27/lib/python2.7/site-packages (python 2.7)

To run mnist\_cnn.py, run the following command:

(p27) \$ python mnist cnn.py

Using TensorFlow backend.

x train shape: (60000, 28, 28, 1)

60000 train samples

10000 test samples

Train on 60000 samples, validate on 10000 samples

Epoch 1/12

...

Test loss: 0.0271579699688

Test accuracy: 0.9911

#### pytorch (machine learning framework)

In order to install pytorch framework, access to the following site for installation information:

http://pytorch.org/

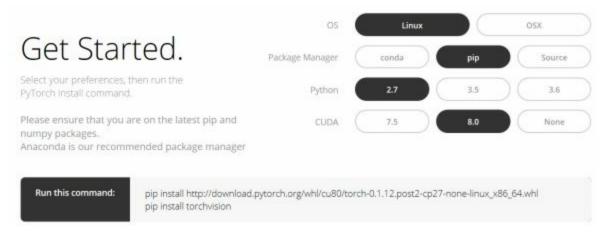


Fig. 2.1.2 how to install pytorch

In order to install pytorch framework, run the following command as shown in Fig. 2.1.2:

- (p27) \$ pip install http://download.pytorch.org/whl/cu80/torch-0.1.12.post2-cp27-none-linux\_x86\_64.whl
- (p27) \$ pip install torchvision

Download examples from the following site:

https://github.com/pytorch/examples

- (p27) \$ wget https://github.com/pytorch/examples/archive/master.zip
- (p27) \$ unzip master.zip
- (p27) \$ cd examples-master/mnist

#### (p27) \$ pip install -r requirements.txt

To run an mnist benchmark problem, run the following command:

(p27) \$ python main.py

Train Epoch: 1 [0/60000 (0%)] Loss: 2.390087 Train Epoch: 1 [640/60000 (1%)] Loss: 2.350225

...

Test set: Average loss: 0.0505, Accuracy: 9826/10000 (98%)

Train Epoch: 12 [0/60000 (0%)] Loss: 0.034612

...

Train Epoch: 12 [59520/60000 (99%)] Loss: 0.219132 Test set: Average loss: 0.0511, Accuracy: 9832/10000 (98%)

#### **Chainer (machine learning framework)**

To install chainer, run the following command:

(p27) \$ pip install -U chainer

(p27) \$ pip install -U cupy

(p27) \$ wget https://github.com/pfnet/chainer/archive/master.zip

(p27) \$ unzip master.zip

(p27) \$ cd chainer-master/examples/mnist

In order to use GPU, "--gpu=0" for single GPU, run the following command:

(p27) \$ python train\_mnist.py --gpu=0

GPU: 0

# unit: 1000

# Minibatch-size: 100

# epoch: 20

epoch main/loss validation/main/loss main/accuracy validation/main/accuracy elapsed time

1 0.195361 0.084808 0.940017 0.974 8.60946

•••

20 0.00508269 0.102755 0.998483 0.982 34.3499

### Chapter 2.2 GPU paralle machine based on Windows 10

Instead of building a GPU parallel computer, you can use the laptop with an NVIDIA GPU card. There are several laptops with GTX 1070 GPU as shown in Table 2.2.1 or GTX 1080 GPU as shown in Table 2.2.2.

Table 2.2.1 NVIDIA GTX 1070 embedded laptops http://www.ultrabookreview.com/10939-laptops-nvidia-1070-1080/

Model	Screen	Hardware	Graphics	TB3	Weight
Acer Predator 15 G9-593	15.6-inch FHD GSync 60 Hz	Skylake Core HQ / max 64 GB RAM	GTX 1070	Yes	7.93 lbs / 3.6 kg
Acer Predator 17 G9-793	17.3-inch FHD or UHD GSync 60 Hz	Skylake Core HQ / max 64 GB RAM	GTX 1070	Yes	9.41 lbs / 4.27 kg
Alienware 15	15.6-inch FHD, QHD GSync 120 Hz or UHD	Kaby Lake Core HK / max 32 GB RAM	GTX 1070	Yes	7.69 lbs / 3.49 kg
Alienware 17	17.3-inch FHD, QHD GSync 120 Hz or UHD	Kaby Lake Core HK / max 32 GB RAM	GTX 1070	Yes	9.74 lbs / 4.42 kg
Aorus X7 v6	17.3-inch QHD 120 Hz or UHD 60 Hz	Kaby Lake Core HK / max 64 GB RAM	GTX 1070	No	6.4 lbs / 2.9 kg
Aorus X5 v6	15.6-inch FHD 120 Hz or WQHD+ 60 Hz	Kaby Lake Core HK / max 64 GB RAM	GTX 1070	No	5.5 lbs / 2.5 kg
Asus ROG G752VS	17.3-inch FHD GSync 75/120 Hz or UHD 60 Hz	Skylake Core HK / max 64 GB RAM	GTX 1070	Yes	9.5 lbs / 4.3 kg
Asus ROG GL502VS	15.6-inch FHD GSync 60 Hz	Kaby Lake Core HQ / max 32 GB RAM	GTX 1070	No	5.7 lbs / 2.6 kg
Asus ROG GL702VS	17.3-inch FHD GSync 75 Hz or 120 Hz	Kaby Lake Core HQ / max 32 GB RAM	GTX 1070	Yes	6.4 lbs / 2.9 kg

ξ		<u> </u>	12	35	3 <u>5                                    </u>
EVGA SC17	17.3-inch UHD GSync 60 Hz	Skylake Core HK / max 32 GB RAM	GTX 1070	No	9.9 lbs / 4.5 kg
Gigabyte P57X v6	17.3-inch FHD	Kaby Lake Core HQ / max 32 GB RAM	GTX 1070	No	6.6 lbs / 3.0 kg
Gigabyte P37X v6	17.3-inch FHD or UHD	Skylake Core HQ / max 32 GB RAM	GTX 1070	No	5.95 lbs / 2.7 kg
Gigabyte P35X v6	15.6-inch UHD	Kaby Lake Core HQ / max 32 GB RAM	GTX 1070	No	5.3 lbs / 2.4 kg
Gigabyte P56	15.6-inch UHD	Kaby Lake Core HQ / max 32 GB RAM	GTX 1070	Yes	_
HP Omen 17 Gamer	17.3-inch UHD GSync 60 Hz	Skylake Core HQ / max 32 GB RAM	GTX 1070	No	6.3 lbs / 2.8 kg
Lenovo IdeaPad Y910	17.3-inch FHD	Skylake Core HK / max 64 GB RAM	GTX 1070	Yes	10.1 lbs / 4.6 kg
MSI GT62VR RE Dominator	15.6-inch FHD GSync 60 Hz or UHD	Kaby Lake Core HQ / max 64 GB RAM	GTX 1070	No	6.4 lbs / 2.9 kg
MSI GT72VR RE Dominator	17.3-inch FHD GSync 60 Hz or UHD	Kaby LakeCore HQ / max 64 GB RAM	GTX 1070	No	8.6 lbs / 3.9 kg
MSI GT83VR 6RE Titan	18.4-inch FHD GSync 60 Hz	Skylake Core HK / max 64 GB RAM	SLI GTX 1070	Yes	9.9 lbs / 4.5 kg
MSI GT73VR 6RE Titan	17.3-inch FHD GSync 120 Hz or UHD	Skylake Core HQ and HK / max 64 GB RAM	single or SLI GTX 1070	Yes	8.4 lbs / 3.8 kg
Origin PC EON15-X	15.6-inch FHD GSync 120 Hz or UHD	Skylake Core K / max 64 GB RAM	GTX 1070	No	7.5 lbs / 3.4 kg
_	15.6-inch FHD GSync 60 Hz	Kaby LakeCore HQ or HK / max 64 GB RAM	GTX 1070	No	5.84 lbs / 2.63 kg
Sager NP9152 / Clevo P750DM2	15.6-inch FHD GSync 60 Hz	Kaby Lake Core K / max 64 GB RAM	GTX 1070	Yes	7.5 lbs / 3.4 kg

Table 2.2.2 NVIDIA GTX 1080 embedded laptops

Model	Screen	Hardware	Graphics	TB3	Weight
Acer Predator 17 X GX- 792	17.3-inch FHD or UHD GSync 60 Hz	Kaby Lake Core HQ / max 64 GB RAM	GTX 1080	Yes	10.03 lbs / 4.54 kg
Acer Predator 21 X	21-inch curved GSync	Kabylake Core HQ / max 64 GB RAM	SLI GTX 1080	No	17.8 lbs /8 kg
Acer Triton 700	15.6-inch GSync	Kaby Lake Core HQ / max 32 GB RAM	GTX 1080	Yes	5.73 lbs / 2.6 kg
Alienware 17	17.3-inch QHD GSync 120 Hz	Kaby Lake Core HK / max 64 GB RAM	GTX 1080	Yes	9.74 lbs / 4.42 kg
Aorus X7 DT v6	17.3-inch QHD 120 Hz or UHD 60 Hz	Kaby LakeCore HK / max 64 GB RAM	GTX 1080	No	7.1 lbs / 3.2 kg
Asus ROG GX800VH	18.4-inch FHD or UHD	Skylake Core HK / max 64 GB RAM	SLI GTX 1080	No	12.5 lbs / 5.7 kg
Asus ROG GX800VI	18.4-inch FHD or UHD	Skylake Core HK / max 64 GB RAM	GTX 1080	No	12.1 lbs / 5.5 kg
Asus ROG GX701VI	17.3-inch FHD GSync 120 Hz	Skylake Core HK / max 64 GB RAM	GTX 1080	Yes	8.4 lbs / 3.8 kg
MSI GT83VR 6RF Titan Pro	18.4-inch FHD GSync 60 Hz	Skylake Core HK / max 64 GB RAM	SLI GTX 1080	Yes	13.1 lbs / 4.5 kg
MSI GT73VR 6RF Titan Pro	17.3-inch FHD GSync 120 Hz or UHD	Skylake Core HQ and HK / max 64 GB RAM	GTX 1080	Yes	8.4 lbs / 3.8 kg
Origin PC EON17-X	17.3-inch FHD GSync 120 Hz or UHD	Skylake Core K / max 64 GB RAM	GTX 1080	Yes	8.6 lbs / 3.9 kg
Origin PC EON17-SLX	17.3-inch FHD GSync 120 Hz or UHD	Skylake Core K / max 64 GB RAM	SLI GTX 1080	Yes	12 lbs / 5.4 kg

Razer Blade Pro	17.3-inch UHD IGZO GSync touch		GTX 1080	Yes	7.8 lbs / 3.54 kg
Schenker XMG U727 / Clevo / Avant P870	17.3-inch GSync FHD, QHD or UHD	Skylake Core T and K / max 64 GB RAM	SLI GTX 1080	Yes	12.1 lbs / 5.5 kg
Schenker XMG U716 / Clevo P775 / Sager NP9152	· ·	Skylake Core T and K / max 64 GB RAM	GTX 1080	Yes	8.6 lbs / 3.9 kg

In this Chapter 2.2, ASUS ROG GL502VS is used in this book.

#### cygwin installation

On Windows 10 using GeForce GTX 1070 Ti (core 1920), first we need to install cygwin on Windows 10. In order to install cygwin, download the file setup-x86 64.exe from the following site:

https://cygwin.com/setup-x86\_64.exe

In cygwin installation, you should install openssh, unzip, tar, wget, vim.

#### cuda installation

Download cuda\_8.0.61\_win10.exe from <a href="https://developer.nvidia.com/cuda-downloads">https://developer.nvidia.com/cuda-downloads</a>

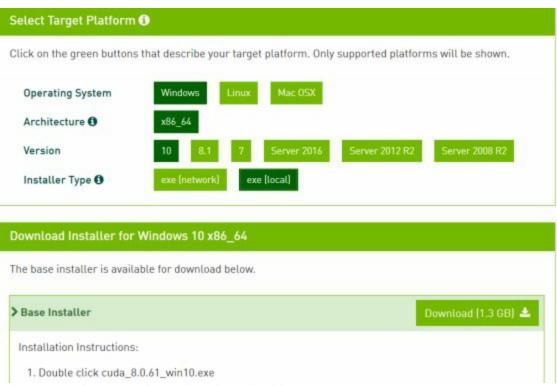


Fig. 2.2.1 how to download cuda file

- 1. Double-click cuda 8.0.61 win10.exe file for installation.
- 2. Download python3.5.2 from the following site: https://www.python.org/ftp/python/3.5.2/python-3.5.2-amd64.exe
- 3. Double-click python-3.5.2-amd64.exe file for installation.

#### virtualeny installation

- 4. In order to install virtualeny, run the following command
- \$ sudo pip install -U pip
- \$ sudo pip install virtualenv
- 5. In order to make python3.5 environment, run the following command:
- \$ virtualenv p35 -p \$(which python3.5)

or

- \$ virtualenv p35
- 6. In order to activate p35 environment, run the following command:
- \$ source p35/Scripts/activate (p35)\$
- 7. Download binary files (scipy, numpy) from:

http://www.lfd.uci.edu/~gohlke/pythonlibs/

scipy-0.19.0-cp35-cp35m-win amd64.whl

numpy-1.13.0+mkl-cp35-cp35m-win\_amd64.whl

#### keras installation

- 8. Install scipy, numpy, keras respectively by the following commands:
- (p35) \$ pip install -U pip
- (p35) \$ pip install scipy\*.whl
- (p35) \$ pip install numpy\*.whl
- (p35) \$ pip install -U keras
- 9. Download tensorflow-gpu file from the following site using wget command:

 $\underline{https://storage.googleap is.com/tensorflow/windows/gpu/tensorflow\_gpu-}$ 

- 1.2.0rc1-cp35-cp35m-win\_amd64.whl
- (p35) \$ wget <a href="https://storage.googleapis.com/tensorflow/windows/gpu/tensorflow\_gpu-1.2.0rc1-cp35-cp35m-win\_amd64.whl">https://storage.googleapis.com/tensorflow/windows/gpu/tensorflow\_gpu-1.2.0rc1-cp35-cp35m-win\_amd64.whl</a>
- 10. Install tensorflow-gpu by pip command:
- (p35) \$ pip install tensorflow\_gpu-1.2.0rc1-cp35-cp35m-win\_amd64.whl
- $(p35)\ \$\ pip\ install\ --ignore-installed\ --upgrade\ tensorflow\_gpu-1.2.0rc\ 1-cp35-cp35m-win\_amd64.whl$
- 11. Download mnist\_cnn.py for benchmarking GPU using wget command (p35) \$ wget https://raw.githubusercontent.com/fchollet/keras/master/examples/mnist\_cnn.py
- 12. Run mnist\_cnn.py using keras framework:
- (p35) \$ python mnist cnn.py