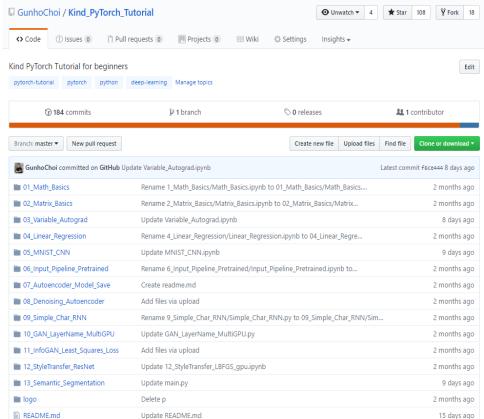
Deep Learning & Pytorch

2017.07.15

최건호

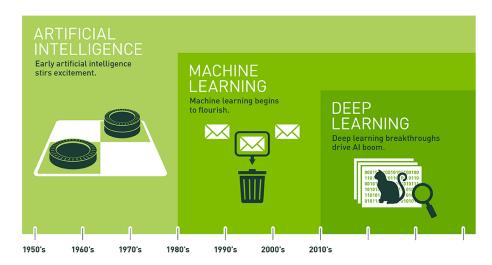






INDEX

02 03 Deep Learning PyTorch Packages Installation 정의 - 프레임워크 소개 torch.Tensor CUDA 이유 - 비교 Cudnn torch.nn 활용 torch.optim PyTorch torch.autograd



Since an early flush of optimism in the 1950s, smaller subsets of artificial intelligence – first machine learning, then deep learning, a subset of machine learning – have created ever larger disruptions.

(출처: 엔비디아 블로그)

Artificial Intelligence

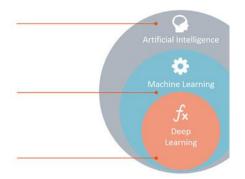
Any technique which enables computers to mimic human behavior.

Machine Learning

Subset of AI techniques which use statistical methods to enable machines to improve with experiences.

Deep Learning

Subset of ML which make the computation of multi-layer neural networks feasible.



(출처: rapid miner)

The term **"artificial intelligence"** is applied when a machine mimics "cognitive" functions that humans associate with other human minds, such as "learning" and "problem solving" (출처:위키피디아)

인식,인지

The term **"artificial intelligence"** is applied when a machine mimics "<u>cognitive</u>" functions that humans associate with other human minds, such as "learning" and "problem solving" (출처:위키피디아)

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The term "artificial intelligence" is applied when a machine mimics "cognitive" functions that humans associate with other human minds, such as "learning" and "problem solving" (출처:위키피디아)

학습

인식,인지

The term **"artificial intelligence"** is applied when a machine mimics "<u>cognitive</u>" functions that humans associate with other human minds, such as "<u>learning</u>" and "<u>problem solving</u>" (출처:위키피디아)

학습

문제 해결

인식,인지 (정보 -> 지식)

The term **"artificial intelligence"** is applied when a machine mimics "<u>cognitive</u>" functions that humans associate with other human minds, such as "<u>learning</u>" and "<u>problem solving</u>" (출처:위키피디아)

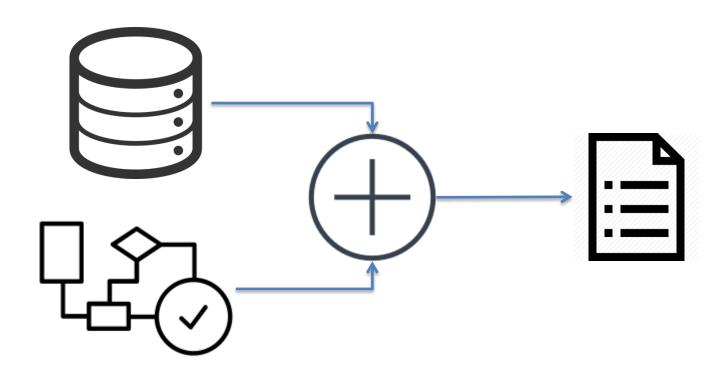
학습

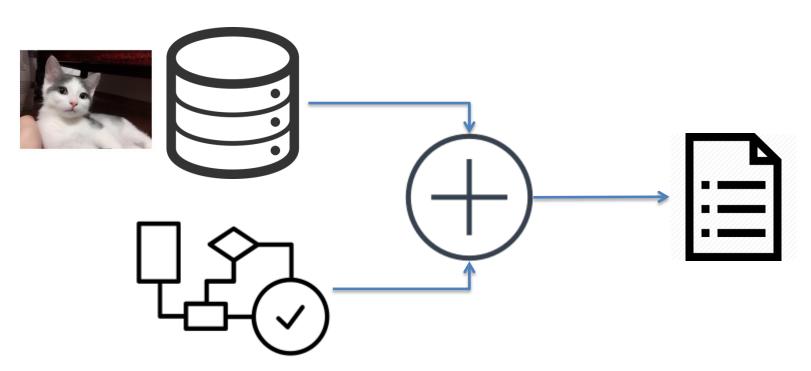
문제 해결

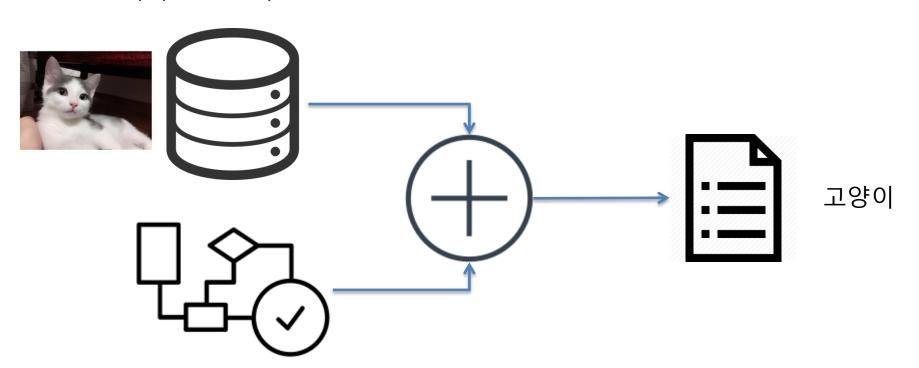
Machine learning is the subfield of computer science that, according to Arthur Samuel in 1959, gives "computers the ability to learn without being explicitly programmed." (출처:위키피디아)

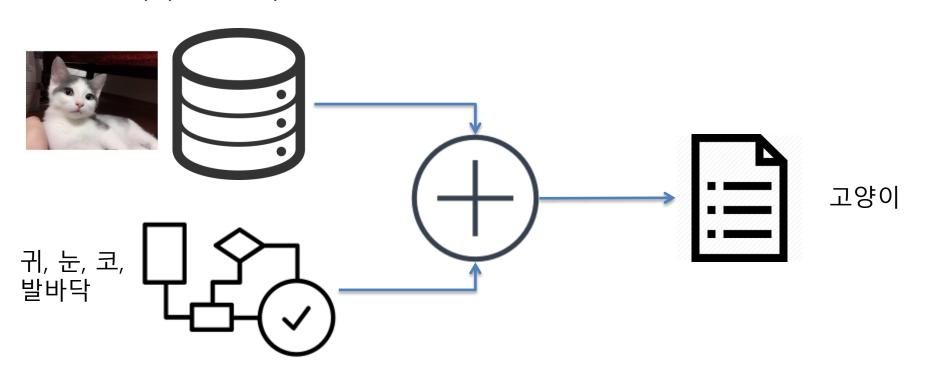
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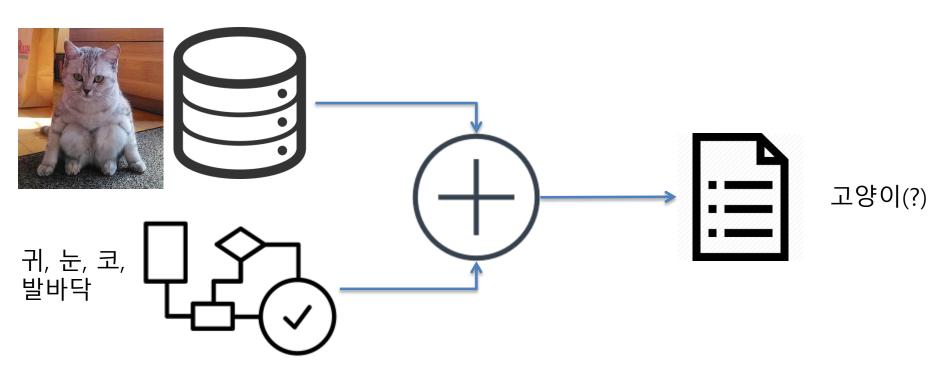
명시적 프로그래밍 X









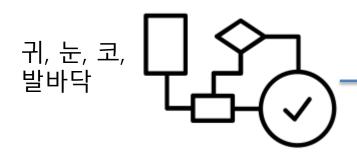


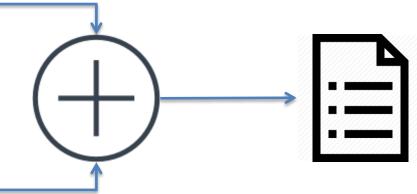
명시적 프로그래밍











고양이(?)

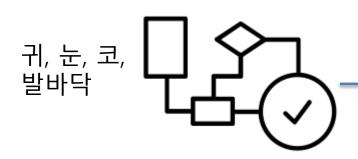
명시적 프로그래밍

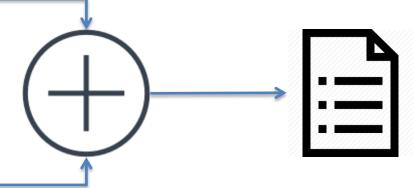












고양이(??)

명시적 프로그래밍

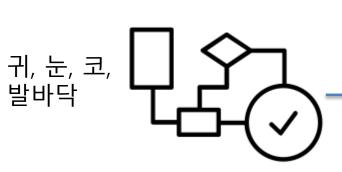


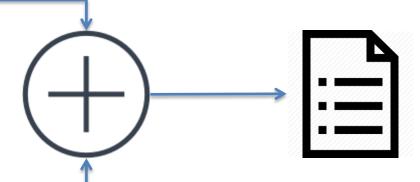












고양이(??)

명시적 프로그래밍

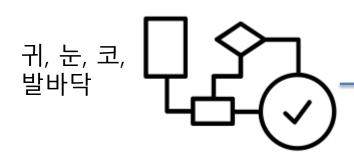


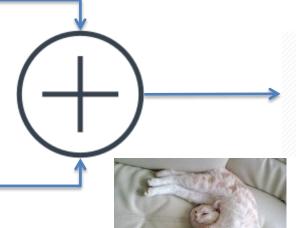






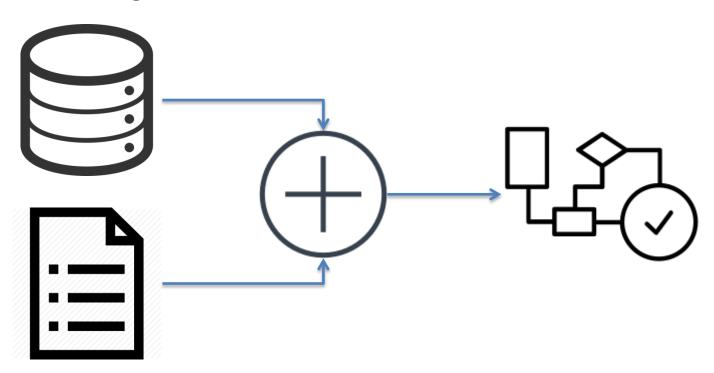


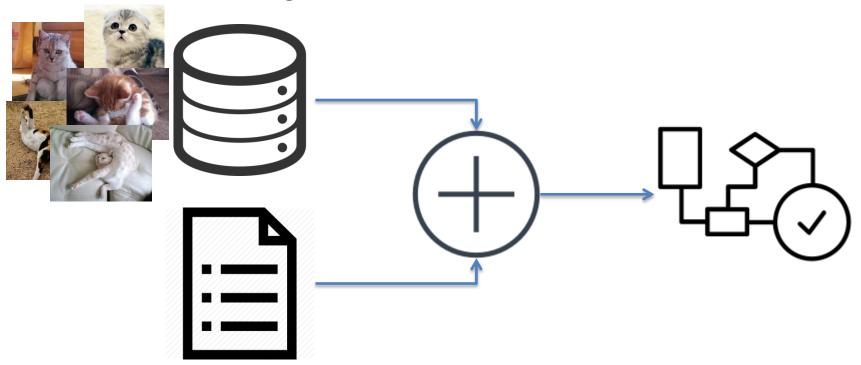


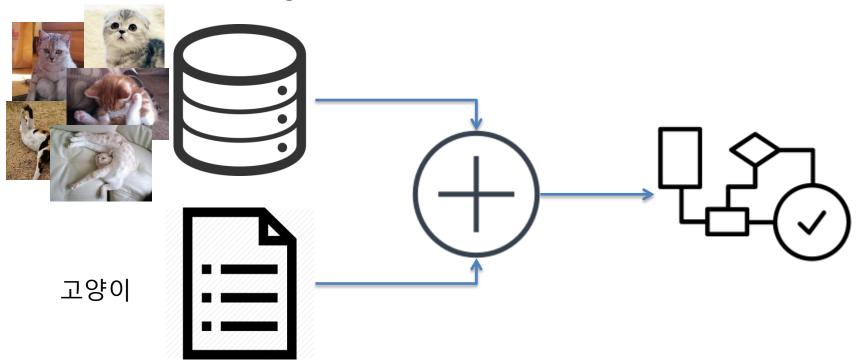


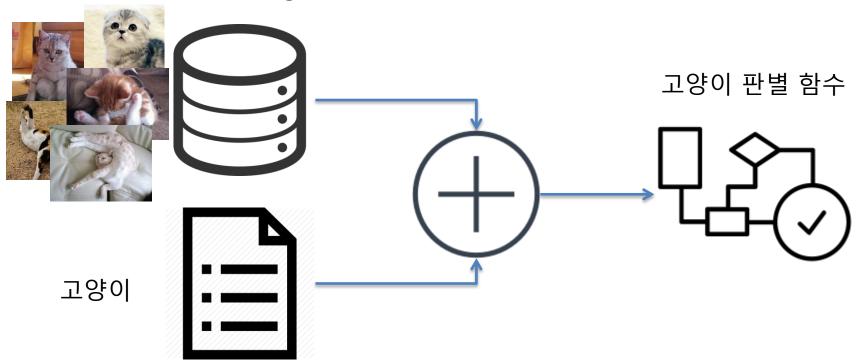


고양이(???)



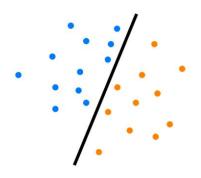






Supervised

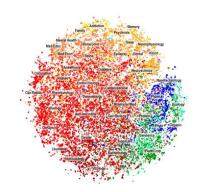
Learning known patterns



(위의 고양이판별 예시에 해당)

Unsupervised

Learning unknown patterns



Reinforcement

Generating data

Learning patterns



(출처: http://adgefficiency.com)

Deep learning is the study of artificial neural networks and related machine learning algorithms that contain more than one hidden layer.

인공 신경망

Deep learning is the study of <u>artificial neural</u> <u>networks</u> and related machine learning algorithms that contain more than one hidden layer.

인공 신경망

Deep learning is the study of <u>artificial neural</u> <u>networks</u> and related machine learning algorithms that contain <u>more than one hidden layer</u>.

은닉 층

뜨게 된 이유

뜨게 된 이유



(출처:luluafrikani.wordpress.com)

뜨게 된 이유

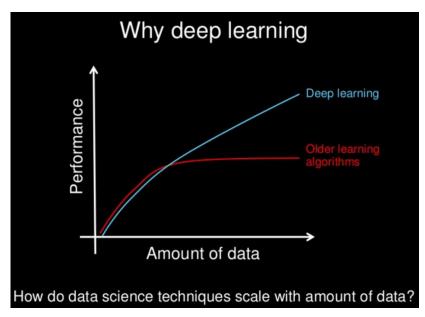


(출처:luluafrikani.wordpress.com)

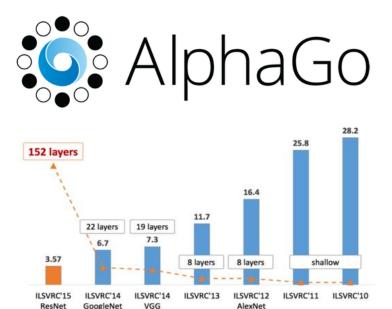


(출처:http://wccftech.com)

공부해야 하는 이유

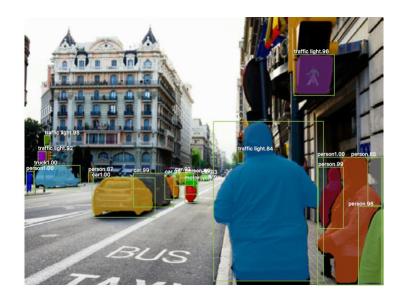


(출처: Andrew Ng)



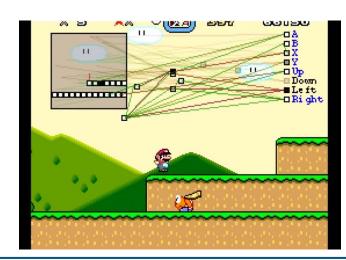
(출처: Kaming He)

활용 분야



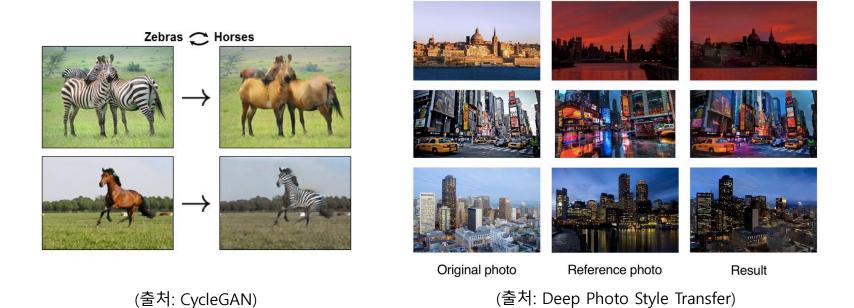
(출처: Mask R-CNN)





(출처: Marl/O)

활용 분야



PyTorch





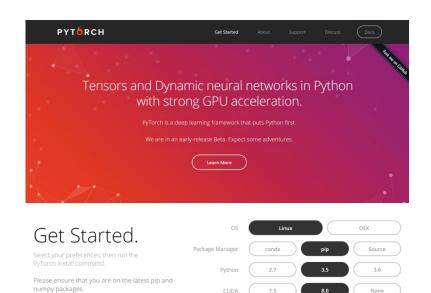


Yann LeCun
DIRECTOR OF AI RESEARCH
Facebook AI Research (FAIR)



Soumith Chintala
RESEARCH ENGINEER
Facebook AI Research (FAIR)





pip install http://download.pytorch.org/whl/cu80/torch-0.1.12.post2-cp35-cp35m-linux_x86_64.whl

Anaconda is our recommended package manager

Run this command:

<파이토치의 특징>

- Python first
- GPU acceleration
- Linux/osx





```
In [4]: import numpy as np
        from datetime import datetime
        start = datetime.now()
        np.random.seed(0)
        N.D = 3.4
        x = np.random.randn(N, D)
        y = np.random.randn(N, D)
        z = np.random.randn(N,D)
        a = x \cdot v
        b = a + z
        c = np.sum(b)
        grad_c = 1.0
        grad_b = grad_c * np.ones((N,D))
        grad_a = grad_b.copv()
        grad_z = grad_b.copv()
        grad_y = grad_a * y
        grad_x = grad_a * x
        print(grad_x)
        print(grad_y)
        print(grad_z)
        print(datetime.now()-start)
        [ 1.86755799 -0.97727788  0.95008842 -0.15135721]
         [-0.10321885 0.4105985 0.14404357 1.45427351];
        [[ 0.76103773  0.12167502  0.44386323  0.33367433]
          1,49407907 -0,20515826 0,3130677 -0,85409574]
         [-2.55298982 0.6536186 0.8644362 -0.74216502]]
        \{[1, 1, 1, 1, 1, 1, 1]
         [ 1. 1. 1. 1.]
        [ 1. 1. 1. 1.]]
        0:00:00.003751
```

```
In [6]: import torch
        from torch.autograd import Variable
        from datetime import datetime
        start = datetime.now()
        N.D = 3.4
        x = Variable(torch.randn(N.D).cuda(), requires_grad=True)
        y = Variable(torch.randn(N,D).cuda(), requires_grad=True)
       z = Variable(torch.randn(N.D).cuda(), requires_grad=True)
        a = x * y
        b = a + z
        c = torch.sum(b)
        c.backward(gradient=torch.cuda.FloatTensor([1.0]))
        print(x.grad)
        print(y.grad)
        print(z.grad)
        print(datetime.now()-start)
        Variable containing:
        -0.6048 0.6640 -1.8035 1.0894
        -0.0731 -0.0702 -0.0474 -1.7546
        -0.3247 0.6293 2.5135 -0.5967
        [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
        Variable containing:
        0.1152 1.1809 1.4522 1.9417
         1.0845 0.1587 -1.6526 0.4031
         1.9585 -0.4729 -1.4024 -0.7388
        [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
        Variable containing:
        1 1 1 1
        1 1 1 1
        [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
        0:00:00.003434
```



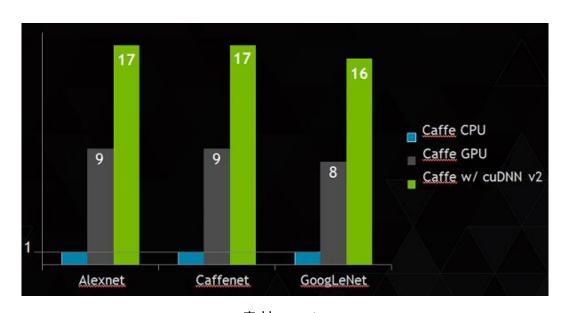
VS

```
In [6]: import torch
In [4]: import numpy as np
                                                                                                     from torch.autograd import Variable
        from datetime import datetime
                                                                                                     from datetime import datetime
        start = datetime.now()
                                                                                                     start = datetime.now()
        np.random.seed(0)
                                                                Gradient
                                                                                                     N.D = 3.4
        N.D = 3.4
                                                                                                     x = Variable(torch.randn(N.D).cuda(), requires_grad=True)
                                                                                                     y = Variable(torch.randn(N,D).cuda(), requires_grad=True)
                                                                 Calculation
        x = np.random.randn(N, D)
                                                                                                     z = Variable(torch.randn(N.D).cuda(), requires_grad=True)
        y = np.random.randn(N, D)
                                                                                                     a = x * y
        z = np.random.randn(N,D)
                                                                                                     b = a + z
                                                                                                     c = torch.sum(b)
        a = x \cdot v
        b = a + z
                                                                                                     c.backward(gradient=torch.cuda.FloatTensor([1.0]))
        c = np.sum(b)
        grad_c = 1.0
                                                                                                     print(y.grad)
        grad_b = grad_c * np.ones((N,D))
                                                                                                     print(z.grad)
        grad_a = grad_b.copv()
                                                                                                     print(datetime.now()-start)
        grad_z = grad_b.copv()
                                                                                                     Variable containing:
        grad_y = grad_a * y
                                                                                                     -0.6048 0.6640 -1.8035 1.0894
        grad_x = grad_a * x
                                                                                                     -0.0731 -0.0702 -0.0474 -1.7546
                                                                                                     -0.3247 0.6293 2.5135 -0.5967
        print(grad_x)
                                                                                                     [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
        print(grad_y)
                                                                                                     Variable containing:
        print(grad_z)
                                                                                                      0.1152 1.1809 1.4522 1.9417
        print(datetime.now()-start)
                                                                                                      1.0845 0.1587 -1.6526 0.4031
                                                                                                      1.9585 -0.4729 -1.4024 -0.7388
        [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
         [ 1.86755799 -0.97727788  0.95008842 -0.15135721]
         [-0.10321885 0.4105985 0.14404357 1.45427351]
                                                                                                     Variable containing:
        [[ 0.76103773  0.12167502  0.44386323  0.33367433]
                                                                                                      1 1 1 1
           1,49407907 -0,20515826 0,3130677 -0,85409574]
                                                                                                      1 1 1 1
         [-2.55298982 0.6536186 0.8644362 -0.74216502]]
        \{[1, 1, 1, 1, 1, 1, 1]
                                                                                                     [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
         [ 1. 1. 1. 1.]
         [ 1. 1. 1. 1. 1.]]
                                                                                                     0:00:00.003434
        0:00:00.003751
```



VS

```
In [6]: import torch
In [4]: import numpy as np
                                                                                                   from torch.autograd import Variable
        from datetime import datetime
                                                                                                   from datetime import datetime
        start = datetime.now()
                                                                                                   start = datetime.now()
        np.random.seed(0)
                                                               Gradient
                                                                                                   N.D = 3.4
        N.D = 3.4
                                                                                                   x = Variable(torch.randn(N.D).cuda(), requires_grad=True)
                                                                                                   y = Variable(torch.randn(N,D).cuda(), requires_grad=True)
                                                               Calculation
        x = np.random.randn(N, D)
                                                                                                   z = Variable(torch.randn(N.D).cuda(), requires_grad=True)
        y = np.random.randn(N, D)
                                                                                                   a = x • y
        z = np.random.randn(N,D)
                                                                                                   b = a + z
                                                                                                   c = torch.sum(b)
        a = x \cdot v
        b = a + z
                                                                                                   c.backward(gradient=torch.cuda.FloatTensor([1.0]))
        c = np.sum(b)
        grad_c = 1.0
                                                                                                   print(y.grad)
        grad_b = grad_c * np.ones((N,D))
                                                                                                   print(z.grad)
        grad_a = grad_b.copv()
                                                                                                   print(datetime.now()-start)
        grad_z = grad_b.copv()
                                                                                                   Variable containing:
        grad_y = grad_a * y
                                                                                                   -0.6048 0.6640 -1.8035 1.0894
        grad_x = grad_a * x
                                                                                                   -0.0731 -0.0702 -0.0474 -1.7546
                                                                                                   -0.3247 0.6293 2.5135 -0.5967
        print(grad_x)
                                                                                                   [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
        print(grad_y)
                                                                                                   Variable containing:
        print(grad_z)
                                                                                                    0.1152 1.1809 1.4522 1.9417
        print(datetime.now()-start)
                                                                                                    1.0845 0.1587 -1.6526 0.4031
                                                                                                    1.9585 -0.4729 -1.4024 -0.7388
        [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
         [ 1.86755799 -0.97727788  0.95008842 -0.15135721]
         [-0.10321885 0.4105985 0.14404357 1.45427351]
                                                                                                   Variable containing:
        [[ 0.76103773  0.12167502  0.44386323  0.33367433]
                                                                                                    1 1 1 1
           1.49407907 -0.20515826 0.3130677 -0.854095741
                                                                                                   1 1 1 1
         [-2.55298982 0.6536186 0.8644362 -0.74216502]]
        [[ 1. 1. 1. 1.]
                                                                                                   [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
         [1, 1, 1, 1,]
         [ 1. 1. <u>1. 1.</u>]]
                                                                                                  0:00:00.003434
        0:00:00.003751
                                          걸리는 시간은 비슷(?)
```



(출처: Nvidia)

- <Numpy vs PyTorch>
- 연산량이 많을수록 성능 차이가 커짐
- Automatic Gradient calculation!!
- 모델 자체에 집중할 수 있음





```
In [5]: import tensorflow as tf
        import numpy as no
        from datetime import datetime
        start = datetime.now()
        with tf.device('/gpu:0'):
           x = tf.placeholder(tf.float32)
           v = tf.placeholder(tf.float32)
           z = tf.placeholder(tf.float32)
           a = x * v
           b = a + z
           c = tf.reduce_sum(b)
        grad_x, grad_v, grad_z = tf.gradients(c.[x.v.z])
        with tf.Session() as sess:
            values = {
               x: np.random.randn(N,D),
               y: np.random.randn(N,D),
               z: np.random.randn(N.D)
            out = sess.run([c,grad_x,grad_y,grad_z],feed_dict = values)
            c_val, grad_x_val, grad_v_val, grad_z_val = out
        print(grad_x_val)
        print(grad_y_val)
        print(grad_z_val)
        print(datetime.now()-start)
        [[-1.6138978 -0.21274029 -0.89546657 0.38690251]
         [-0.51080513 -1.18063223 -0.02818223 0.42833188]
          0.06651722 0.30247191 -0.63432211 -0.3627411711
        [-1.04855299 -1.42001796 -1.70627022 1.95077538]
          [-0.5096522 -0.43807429 -1.25279534 0.77749038]]
        [[ 1, 1, 1, 1, 1, 1]
         [ 1, 1, 1, 1, ]
         [ 1. 1. 1. 1.]]
        0:00:00.046684
```

```
In [6]: import torch
        from torch, autograd import Variable
        from datetime import datetime
        start = datetime.now()
        N.D = 3.4
        x = Variable(torch.randn(N.D).cuda(), requires_grad=True)
        v = Variable(torch.randn(N.D).cuda(), requires_grad=True)
        z = Variable(torch.randn(N.D).cuda().requires_grad=True)
        a = x * y
        b = a + z
        c = torch.sum(b)
        c.backward(gradient=torch.cuda.FloatTensor([1.0]))
        print(x.grad)
        print(v.grad)
        print(z.grad)
        print(datetime.now()-start)
        Variable containing:
        -0.6048 0.6640 -1.8035 1.0894
        -0.0731 -0.0702 -0.0474 -1.7546
        -0.3247 0.6293 2.5135 -0.5967
        [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
        Variable containing:
         0.1152 1.1809 1.4522 1.9417
         1.0845 0.1587 -1.6526 0.4031
         1.9585 -0.4729 -1.4024 -0.7388
        [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
        Variable containing:
         1 1 1 1
         1 1 1 1
         1 1 1 1
        [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
        0:00:00.003434
```





```
In [6]: import torch
In [5]: import tensorflow as tf
                                                                                                                   from torch,autograd import Variable
        import numpy as no
                                                                                                                    from datetime import datetime
                                                                           Define and Run
        from datetime import datetime
                                                                                                                   start = datetime.now()
        start = datetime.now()
                                                                                                                   N.D = 3.4
        with tf.device('/gpu:0'):
            x = tf.placeholder(tf.float32)
                                                                                                                   x = Variable(torch.randn(N.D).cuda(), requires_grad=True)
           y = tf.placeholder(tf.float32)
                                                                                                                   v = Variable(torch.randn(N,D).cuda(),requires_grad=True)
            z = tf.placeholder(tf.float32)
                                                                                                                   z = Variable(torch.randn(N.D).cuda().requires_grad=True)
            a = x \cdot y
                                                                                                                   a = x * y
           b = a + z
                                                                                                                   b = a + z
           c = tf.reduce_sum(b)
                                                                                                                   c = torch.sum(b)
        grad_x, grad_y, grad_z = tf.gradients(c,[x,y,z])
                                                                                                                   c.backward(gradient=torch.cuda.FloatTensor([1.0]))
        with tf.Session() as sess:
                                                                                                                   print(x.grad)
            values = {
                                                                                                                   print(v.grad)
               x: np.random.randn(N,D),
                                                                                                                   print(z.grad)
               y: np.random.randn(N,D),
                                                                                                                   print(datetime.now()-start)
               z: np.random.randn(N.D)
                                                                                                                   Variable containing:
                                                                                                                   -0.6048 0.6640 -1.8035 1.0894
            out = sess.run([c,grad_x,grad_y,grad_z],feed_dict = values)
                                                                                                                   -0.0731 -0.0702 -0.0474 -1.7546
            c_val, grad_x_val, grad_v_val, grad_z_val = out
                                                                                                                   -0.3247 0.6293 2.5135 -0.5967
                                                                                                                   [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
       print(grad_x_val)
        print(grad_y_val)
                                                                                                                   Variable containing:
        print(grad_z_val)
                                                                                                                    0.1152 1.1809 1.4522 1.9417
       print(datetime.now()-start)
                                                                                                                    1.0845 0.1587 -1.6526 0.4031
                                                                                                                    1.9585 -0.4729 -1.4024 -0.7388
        [[-1.6138978 -0.21274029 -0.89546657 0.38690251]
                                                                                                                   [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
         [-0.51080513 -1.18063223 -0.02818223 0.42833188]
          0.06651722 0.30247191 -0.63432211 -0.3627411711
                                                                                                                   Variable containing:
        1 1 1 1
         [-1.04855299 -1.42001796 -1.70627022 1.95077538]
          [-0.5096522 -0.43807429 -1.25279534 0.77749038]]
                                                                                                                    1 1 1 1
        [[ 1, 1, 1, 1, 1, 1]
                                                                                                                    1 1 1 1
                                                                                                                    [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
         [ 1, 1, 1, 1, ]
         Î.L. 1. 1. 1. 1. 1.
                                                                                                                   0:00:00.003434
        0:00:00.046684
```





```
In [6]: import torch
In [5]: import tensorflow as tf
                                                                                                                   from torch.autograd import Variable
        import numpy as no
                                                                                                                   from datetime import datetime
                                                                           Define and Run
        from datetime import datetime
                                                                                                                  start = datetime.now()
        start = datetime.now()
                                                                                                                  N.D = 3.4
        with tf.device('/gpu:0'):
            x = tf.placeholder(tf.float32)
                                                                                                                  x = Variable(torch.randn(N.D).cuda().requires_grad=True)
           y = tf.placeholder(tf.float32)
                                                                                                                  y = Variable(torch.randn(N,D).cuda(),requires_grad=True)
            z = tf.placeholder(tf.float32)
                                                                                                                  z = Variable(torch.randn(N.D).cuda(), requires_grad=True)
           a = x * y
           b = a + z
                                                                                                                  b = a + z
            c = tf.reduce_sum(b)
                                                                                                                  c = torch.sum(b)
        grad_x, grad_y, grad_z = tf.gradients(c,[x,y,z])
                                                                                                                  c.backward(gradient=torch.cuda.FloatTensor([1.0]))
                                                                           Define by Run
        with tf.Session() as sess:
                                                                                                                  print(x.grad)
            values = {
                                                                                                                  print(v.grad)
               x: np.random.randn(N,D),
                                                                                                                  print(z.grad)
               y: np.random.randn(N,D),
                                                                                                                  print(datetime.now()-start)
               z: np.random.randn(N.D)
                                                                                                                  Variable containing:
                                                                                                                  -0.6048 0.6640 -1.8035 1.0894
            out = sess.run([c,grad_x,grad_y,grad_z],feed_dict = values)
                                                                                                                  -0.0731 -0.0702 -0.0474 -1.7546
            c_val, grad_x_val, grad_v_val, grad_z_val = out
                                                                                                                  -0.3247 0.6293 2.5135 -0.5967
                                                                                                                  [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
        print(grad_x_val)
        print(grad_y_val)
                                                                                                                  Variable containing:
        print(grad_z_val)
                                                                                                                   0.1152 1.1809 1.4522 1.9417
        print(datetime.now()-start)
                                                                                                                   1.0845 0.1587 -1.6526 0.4031
                                                                                                                   1.9585 -0.4729 -1.4024 -0.7388
        [[-1.6138978 -0.21274029 -0.89546657 0.38690251]
                                                                                                                  [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
         [-0.51080513 -1.18063223 -0.02818223 0.42833188]
          0.06651722 0.30247191 -0.63432211 -0.3627411711
                                                                                                                  Variable containing:
        1 1 1 1
         [-1.04855299 -1.42001796 -1.70627022 1.95077538]
          [-0.5096522 -0.43807429 -1.25279534 0.77749038]]
                                                                                                                   1 1 1 1
        [[ 1, 1, 1, 1, 1, 1]
                                                                                                                   1 1 1 1
                                                                                                                   [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
         [ 1, 1, 1, 1, ]
         Î.L. 1. 1. 1. 1. 1.
                                                                                                                  0:00:00.003434
        0:00:00.046684
```



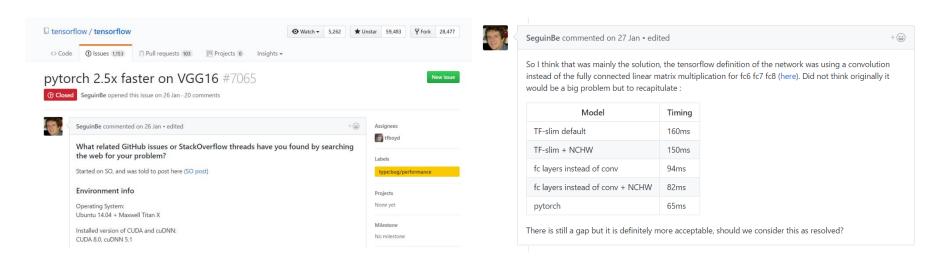


```
In [6]: import torch
In [5]: import tensorflow as tf
                                                                                                                from torch.autograd import Variable
        import numpy as no
                                                                                                                from datetime import datetime
                                                                          Define and Run
        from datetime import datetime
                                                                                                                start = datetime.now()
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                                                                                                                N.D = 3.4
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           x = tf.placeholder(tf.float32)
                                                                                                                x = Variable(torch.randn(N.D).cuda(), requires_grad=True)
           y = tf.placeholder(tf.float32)
                                                                                                                y = Variable(torch.randn(N,D).cuda(),requires_grad=True)
           z = tf.placeholder(tf.float32)
                                                                                                                z = Variable(torch.randn(N.D).cuda().requires_grad=True)
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                                                                                                                b = a + z
           c = tf.reduce_sum(b)
                                                                                                                c = torch.sum(b)
       grad_x, grad_y, grad_z = tf.gradients(c,[x,y,z])
                                                                                                                c.backward(gradient=torch.cuda.FloatTensor([1.0]))
                                                                         Define by Run
        with tf.Session() as sess:
                                                                                                                print(x.grad)
           values = {
                                                                                                                print(v.grad)
               x: np.random.randn(N,D),
                                                                                                                print(z.grad)
               y: np.random.randn(N,D),
                                                                                                                print(datetime.now()-start)
               z: np.random.randn(N.D)
                                                                                                                Variable containing:
                                                                                                                -0.6048 0.6640 -1.8035 1.0894
           out = sess.run([c,grad_x,grad_y,grad_z],feed_dict = values)
                                                                                                                -0.0731 -0.0702 -0.0474 -1.7546
           c_val, grad_x_val, grad_v_val, grad_z_val = out
                                                                                                                -0.3247 0.6293 2.5135 -0.5967
                                                                                                                [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
       print(grad_x_val)
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                                                                                                                 0.1152 1.1809 1.4522 1.9417
       print(datetime.now()-start)
                                                                                                                 1.0845 0.1587 -1.6526 0.4031
                                                                                                                 1.9585 -0.4729 -1.4024 -0.7388
       [[-1.6138978 -0.21274029 -0.89546657 0.38690251]
                                                                                                                [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
         [-0.51080513 -1.18063223 -0.02818223 0.42833188]
          0.06651722 0.30247191 -0.63432211 -0.3627411711
                                                                                                                Variable containing:
        1 1 1 1
        [-1.04855299 -1.42001796 -1.70627022 1.95077538]
         [-0.5096522 -0.43807429 -1.25279534 0.77749038]]
                                                                                                                 1 1 1 1
       [[ 1. 1. 1. 1.]
                                                                                                                 1 1 1 1
                                                                                                                [torch.cuda.FloatTensor of size 3x4 (GPU 0)]
         [ 1. 1. 1. 1.]
                                                                                                                0:00:00.003434
       0:00:00.046684
                                                         TF가 10배 이상 느리다??
```





PYTORCH



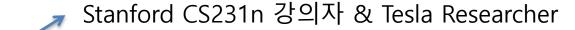
"좀 자극적인 제목 + 실험 환경 확인불가"이지만 파이토치가 빠르긴 빠르다.



- Define and Run
- Static graph
- 사용자 많음
- 자체 운영 포럼 없음
- TF-KR

- Define by Run
- Dynamic graph
- 늘어나는 추세
- 자체적 포럼 운영
- PyTorch-KR









I've been using PyTorch a few months now and I've never felt better. I have more energy. My skin is clearer. My eye sight has improved.

③ 영어 번역하기

317

1,239

마음에 들어요















오전 11:56 - 2017년 5월 26일













NVIDIA Driver Downloads

Product Type:	GeForce	▼	
Product Series:	GeForce 10 Series	•	
Product:	NVIDIA TITAN Xp	•	
Operating System:	Windows 10 64-bit	•	
Language:	English (US)	v	SEARCH
otion 2: Automatic	ally find drivers for my NVIDIA pro	oducts.	Leam Mor
	,		GRAPHICS DRIVERS



NVIDIA Driver Downloads

Option 1: Manually f	ind drivers for my NVIDIA products.		Help
Product Type:		▼	
Product Series:	GeForce 10 Series	▼	
Product:	NVIDIA TITAN Xp	•	
Operating System:	Windows 10 64-bit	•	
Language:	English (US)	•	SEARCH

Option 2: Automatically find drivers for my NVIDIA products.

Learn More
GRAPHICS DRIVERS







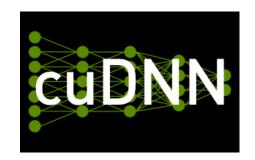


병렬컴퓨팅 플랫폼이자 API. 일반적인 GPU를 그래픽스만이 아닌 범용으로 쓸 수 있게 해준다. GPGPU (General-Purpose computing on Graphics Processing Units)



NVIDIA Driv	er Downloads		
Option 1: Manually f	ind drivers for my NVIDIA products.		Help
Product Type:	GeForce	¥	
Product Series:	GeForce 10 Series	•	
Product:	NVIDIA TITAN Xp	•	
Operating System:	Windows 10 64-bit	▼	
Language:	English (US)	▼	SEARCH
Option 2. Automatic	ally find drivers for my NVIDIA produc	J	GRAPHICS DRIVERS
_	◎ N	VIDIA	

CUDA®





딥러닝에 특화된 NVIDIA GPU 라이브러리. CuDNN을 사용하면 CUDA만을 썼을때보다 2~3배 빨라진다고 함



NVIDIA Driver Downloads

 Option 1: Manually find drivers for my NVIDIA products.

 Product Type: GeForce
 ▼

 Product Series: GeForce 10 Series
 ▼

 Product: NVIDIA TITAN Xp
 ▼

 Operating System: Windows 10 64-bit
 ▼

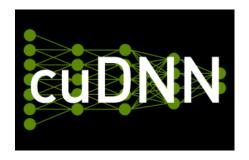
 Language: English (US)
 ▼

SEARCH

Option 2: Automatically find drivers for my NVIDIA products.

Learn More

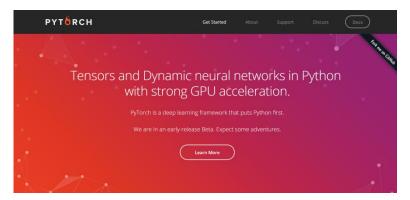
GRAPHICS DRIVERS













파이썬, 엔비디아 그래픽 드라이버, CUDA, CUDNN 모두 설치한 후에 pip 또는 conda로 설치하면 드디어 쓸 수 있습니다.

노트북에도 깔고 회사 서버에도 깔고, 친구 깔아주고 서버 터지면 다시 깔고 총 50~60번은 설치를 시도했던 것 같습니다.

각자 노트북 사양에 맞게 깔아야 하는 거라 엄청 세세한 부분은 생략했습니다.

(참고링크: https://alliseesolutions.wordpress.com/2016/09/08/install-gpu-tensorflow-from-sources-w-ubuntu-16-04-and-cuda-8-0/)

Package	Description
torch	a Tensor library like NumPy, with strong GPU support
torch.autograd	a tape based automatic differentiation library that supports all differentiable Tensor operations in torch
torch.nn	a neural networks library deeply integrated with autograd designed for maximum flexibility
torch.optim	an optimization package to be used with torch.nn with standard optimization methods such as SGD, RMSProp, LBFGS, Adam etc.
torch.multiprocessing	python multiprocessing, but with magical memory sharing of torch Tensors across processes. Useful for data loading and hogwild training.
torch.utils	DataLoader, Trainer and other utility functions for convenience
torch.legacy(.nn/.optim)	legacy code that has been ported over from torch for backward compatibility reasons



Package	Description
RandomSerializatParallelis	, Slicing, Joining, Mutating Ops sampling tion

Package	Description
torch.autograd	a tape based automatic differentiation library that supports all differentiable Tensor operations in torch
- Variable Function	

Package	Description
torch.nn	a neural networks library deeply integrated with autograd designed for maximum flexibility
- Pooling L - Non-line - Normaliz - Recurrent - Linear La - Dropout - Sparse La	ion Layers Layers ar Activations ation Layers t Layers yers Layers Layers ayers functions ctions yers

Package	Description
torch.optim	an optimization package to be used with torch.nn with standard optimization methods such as SGD, RMSProp, LBFGS, Adam etc.
How to use an optimizer	

How to use an optimizer Algorithms

Package	Description
torch.multiprocessing	python multiprocessing, but with magical memory sharing of torch Tensors across processes. Useful for data loading and hogwild training.
- Sharing	Management CUDA tensors strategies

Package	Description
torch.utils	DataLoader, Trainer and other utility functions for convenience
- utils.ffi.create_extension - utils.data - Utils.model_zoo	

Package	Description
torch.legacy(.nn/.optim)	legacy code that has been ported over from torch for backward compatibility reasons



기존 torch 함수들

torchvision Reference

- torchvision
- torchvision.datasets
- torchvision.models
- torchvision.transforms
- torchvision.utils

torchvision Reference

- torchvision
- torchvision.datasets
- torchvision.models
- torchvision.transforms
- torchvision.utils

많이 사용되는 데이터들

- ImageFolder(data loader)
- MNIST
- COCO
- LSUN
- Imagenet-12
- CIFAR10 and CIFAR100
- STL10

torchvision Reference

- torchvision
- torchvision.datasets
- torchvision.models
- torchvision.transforms
- torchvision.utils

많이 사용되는 데이터들

많이 사용되는 모델들

- AlexNet
- VGG
- ResNet
- SqueezNet
- DenseNet

torchvision Reference

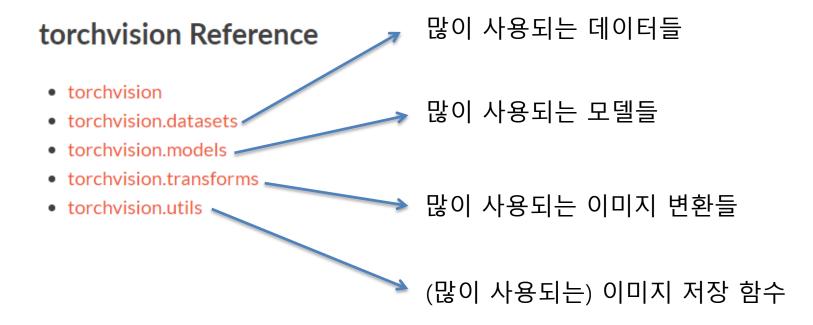
많이 사용되는 데이터들

- torchvision
- torchvision.datasets
- torchvision.models
- · torchvision.transforms
- torchvision.utils

많이 사용되는 모델들

많이 사용되는 이미지 변환들

- Scale
- Pad
- Crop
- Normalize
- Flip



Q&A