# JADE: Java Deep Learning Library

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| 1.                   | 1.1 Linear  |   |  |  |  |  |
|                      |   |   |  |  |  |  |
|                      | <pre>NNModule linear = new Linear(in_features, out_features, bias);</pre> |   |  |  |  |  |
|                      |   |   |  |  |  |  |
|                      | y = xW + b  |   |  |  |  |  |
| 1.                   | 1.1 Example   |   |  |  |  |  |
|                      | <pre>NNModule linear = new Linear(2, 4, false);</pre>                     |   |  |  |  |  |
| 1.                   | 2 Conv1d  |   |  |  |  |  |
|                      | <pre>NNModule conv1d = new Conv1d(in_channels, out_channels,</pre>        |   |  |  |  |  |

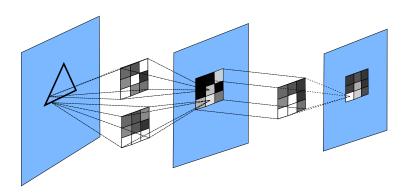
$$O_{ijk} = \sum_{p=1}^{C} \sum_{q=1}^{K} I'_{i,p,Sk+q-P} F_{j,p,q}$$
$$I'_{ijk} = \begin{cases} I_{ijk}, k >= 1 \land k <= H \\ 0, otherwise \end{cases}$$

#### 1.2.1 Example

NNModule conv1d = new Conv1d(2, 8, 3, 1, 0, true);

#### 1.3 Conv2d

$$\begin{split} O_{ijkl} &= \sum_{p=1}^{C} \sum_{q=1}^{K} \sum_{r=1}^{K} I'_{i,p,Sk+q-P,Sl+r-P} F_{j,p,q,r} \\ I'_{ijkl} &= \begin{cases} I_{ijkl}, k >= 1 \land k <= H \land l >= 1 \land l <= W \\ 0, otherwise \end{cases} \end{split}$$



#### 1.3.1 Example

```
NNModule conv2d = new Conv2d(4, 8, 3, true);
NNModule conv2d = new Conv2d(4, 8, 4, 1, 0, true);
NNModule conv2d = new Conv2d(4, 8, new int[] {4, 4},
new int[] {1, 1}, new int[] {0, 0}, true);
```

#### 1.4 MaxPool1d

NNModule maxpool1d = new MaxPool1d(kernel\_size);

$$O_{ijk} = \max\{I_{i,j,Kk+p}, p >= 0 \land p <= K\}$$

#### 1.4.1 Example

NNModule maxpool1d = new MaxPool1d(4);

#### 1.5 MaxPool2d

NNModule maxpool2d = new MaxPool2d(kernel\_size);

$$O_{ijkl} = \max\{I_{i,j,Kk+p,Kl+q}, p >= 0 \land p <= K \land q >= 0 \land q <= K\}$$

#### 1.5.1 Example

NNModule maxpool2d = new MaxPool2d(2);
NNModule maxpool2d = new MaxPool2d(new int[] {2, 2});

#### 1.6 BatchNorm1d

NNModule batchnorm1d = new BatchNorm1d(numFeatures, momentum);

NNModule batchnorm1d = new BatchNorm1d(numFeatures);

$$O_{ijk} = \frac{I_{ijk} - \mu_j}{\sqrt{\sigma_j^2 + \epsilon}} \gamma_j + \beta_j$$

#### 1.6.1 Example

NNModule batchnorm1d = new BatchNorm1d(16, 0.2);
NNModule batchnorm1d = new BatchNorm1d(16);

#### 1.7 BatchNorm2d

NNModule batchnorm2d = new BatchNorm2d(numFeatures,
momentum);

NNModule batchnorm2d = new BatchNorm2d(numFeatures);

$$O_{ijkl} = \frac{I_{ijkl} - \mu_j}{\sqrt{\sigma_j^2 + \epsilon}} \gamma_j + \beta_j$$

#### 1.7.1 Example

```
NNModule batchnorm2d = new BatchNorm2d(16, 0.2);
NNModule batchnorm2d = new BatchNorm2d(16);
```

#### 1.8 Dropout1d

NNModule dropout1d = new Dropout1d(p);

$$O_{ijk} = \begin{cases} 0 & ; random(0,1)$$

#### 1.8.1 Example

NNModule dropout1d = new Dropout1d(0.5);

#### 1.9 Dropout2d

NNModule dropout2d = new Dropout2d(p);

$$O_{ijkl} = \begin{cases} 0 & ; random(0,1)$$

#### 1.9.1 Example

NNModule dropout2d = new Dropout2d(0.5);

#### 1.10 Sigmoid

NNModule sigmoid = new Sigmoid();

$$y = \sigma(x) = \frac{1}{1 + e^{-x}}$$

#### 1.10.1 Example

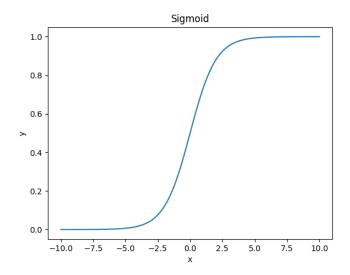
NNModule sigmoid = new Sigmoid();

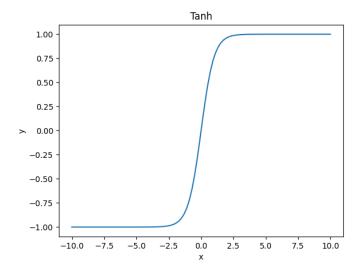
#### 1.11 Tanh

NNModule tanh = new Tanh();

$$y = \tanh(x) = \frac{e^x - e^{-x}}{e^x + e^{-x}}$$

#### 1.11.1 Example



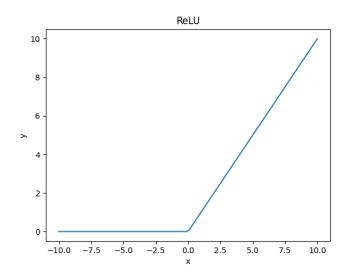


NNModule tanh = new Tanh();

## 1.12 ReLU

NNModule relu = new ReLU();

$$y = \begin{cases} 0 & \text{if } x < 0 \\ x & \text{if } x \ge 0 \end{cases}$$



#### 1.12.1 Example

NNModule relu = new ReLU();

## 1.13 LeakyReLU

NNModule leakyrelu = new LeakyReLU(alpha);

$$y = \begin{cases} \alpha x & \text{if } x < 0 \\ x & \text{if } x \ge 0 \end{cases}$$

#### 1.13.1 Example

NNModule leakyrelu = new LeakyReLU(0.01);

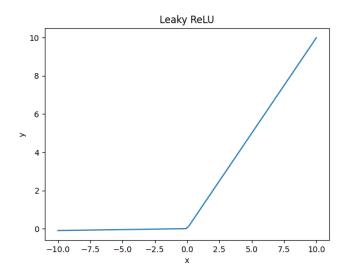
#### 1.14 Softmax

NNModule softmax = new Softmax();

$$y_i = \frac{e^{x_i}}{\sum_k e^{x_k}}$$

#### 1.14.1 Example

NNModule softmax = new Softmax();



### 1.15 LogSoftmax

NNModule logsoftmax = new LogSoftmax();

$$y_i = \log \frac{e^{x_i}}{\sum_k e^{x_k}}$$

#### 1.15.1 Example

NNModule logsoftmax = new LogSoftmax();

## 1.16 SiLU

NNModule silu = new SiLU();

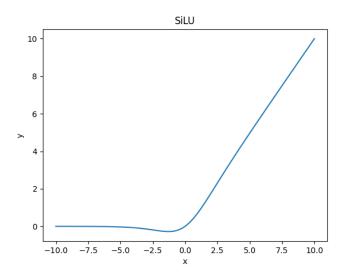
$$y = x\sigma(x) = \frac{x}{1 + e^{-x}}$$

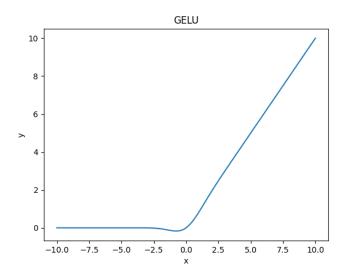
#### 1.16.1 Example

NNModule silu = new SiLU();

### 1.17 GELU

NNModule gelu = new GELU();





$$y \approx x\sigma(1.702x) = \frac{x}{1 + e^{-1.702x}}$$

### 1.17.1 Example

NNModule gelu = new GELU();

## 1.18 Sequential

```
NNModule sequential = new Sequential();
```

#### 1.18.1 Example

```
NNModule sequential = new Sequential();
model.add_module((NNModule) new Conv2d(1, 8, 3, true));
model.add_module((NNModule) new Sigmoid());
model.add_module((NNModule) new MaxPool2d(2));
model.add_module((NNModule) new Conv2d(8, 16, 3, true));
model.add_module((NNModule) new Sigmoid());
model.add_module((NNModule) new Flatten());
model.add_module((NNModule) new Linear(16, 10, true));
```

#### 2 Loss functions

#### 2.1 MSELoss

Loss loss\_fn = new MSELoss();

$$\mathcal{L}(y,t) = \frac{1}{N} \sum_{i=1}^{N} (y_i - t_i)^2$$

#### **2.1.1** Example

Loss loss\_fn = new MSELoss();

#### 2.2 CrossEntropyLoss

Loss loss\_fn = new CrossEntropyLoss();

$$\mathcal{L}(y,t) = -\sum_{i=1}^{N} t_i \log(y_i)$$

#### **2.2.1** Example

Loss loss\_fn = new CrossEntropyLoss();

#### 2.3 NLLLoss

Loss loss\_fn = new NLLLoss();

$$\mathcal{L}(y,t) = -\sum_{i=1}^{N} t_i y_i$$

#### **2.3.1** Example

```
Loss loss_fn = new NLLLoss();
```

### 3 Optimizers

#### 3.1 SGD

```
Optimizer optim = new SGD(parameters, hyperparameters);
3.1.1 Example

HashMap < String, Float > hyperparameters = new HashMap < > ()
;
hyperparameters.put("lr", 0.01f);
hyperparameters.put("momentum", 0.9f);
Optimizer optim = new SGD(model.parameters(),
hyperparameters);

3.2 Adam

Optimizer optim = new Adam(parameters, hyperparameters);
3.2.1 Example

HashMap < String, Float > hyperparameters = new HashMap < > ()
;
hyperparameters.put("lr", 0.01f);
Optimizer optim = new Adam(model.parameters(),
hyperparameters);
```

## 4 Example codes

#### 4.1 Linear Regression

```
import com.nn.*;
import com.optim.*;
import com.data.*;
import java.util.*;

public class SampleLinearRegression {
   public static void main(String args[]) {
     float[] X = new float[] { 1, 2, 3, 4, 5 };
     float[] y = new float[] { 7, 9, 11, 13, 15 };

Tensor x_train = new Tensor(new int[] { 5, 1 }, X);
   Tensor y_train = new Tensor(new int[] { 5, 1 }, y);

NNModule seq = new Sequential();
   seq.add_module((NNModule) new Linear(1, 1, true));

Loss loss_fn = new MSELoss();
```

```
Map<String, Float> optim_params = new HashMap<String
18
                , Float >();
            optim_params.put("lr", 0.01f);
19
            Optimizer optim = new SGD(seq.parameters(),
20
                optim_params);
            for (int epoch = 0; epoch < 1000; epoch++) {</pre>
22
                Tensor o = seq.forward(x_train);
23
                Tensor loss = loss_fn.criterion(o, y_train);
24
                if (epoch % 100 == 0) {
25
                     System.out.println(epoch + ": " + loss);
                optim.zero_grad();
28
                loss.backward();
29
                optim.step();
30
            }
31
32
            for (Tensor param : seq.parameters()) {
33
                param.print();
            }
35
       }
36
   }
37
```

#### 4.2 MLP Classification

```
import com.nn.*;
   import com.optim.*;
   import com.data.*;
   import com.utils.*;
   import java.util.*;
   import java.nio.file.Paths;
   public class SampleMLPClassification {
           public static void main(String[] args) {
10
                    Sequential model = new Sequential();
11
                    model.add_module(new Flatten());
12
                    model.add_module(new Linear(64, 32, true));
13
                    model.add_module(new Tanh());
14
                    model.add_module(new Linear(32, 16, true));
15
                    model.add_module(new Tanh());
16
                    model.add_module(new Linear(16, 10, true));
17
18
                    String path_to_digits = "./data/DIGITS/";
19
20
                    Tensor x_train = Misc.loadTensor(Paths.get(
                        path_to_digits,
                                     "x_train_digits.bin").
22
                                        toString());
                    Tensor y_train = Misc.loadTensor(Paths.get(
23
```

```
path_to_digits,
                                      "y_train_digits.bin").
24
                                         toString());
                    Tensor x_test = Misc.loadTensor(Paths.get(
25
                        path_to_digits,
                                     "x_test_digits.bin").
26
                                         toString());
                    Tensor y_test = Misc.loadTensor(Paths.get(
27
                        path_to_digits,
                                      "y_test_digits.bin").
28
                                         toString());
                    x_train = x_train.div(new Tensor(16.0f));
30
                    x_test = x_test.div(new Tensor(16.0f));
31
32
                    Dataset train_ds = new TensorDataset(x_train
33
                        , y_train);
                    DataLoader train_dl = new DataLoader(
                        train_ds, 32, true);
35
                    Dataset test_ds = new TensorDataset(x_test,
36
                        y_test);
                    DataLoader test_dl = new DataLoader(test_ds,
37
                         32, true);
38
                    HashMap < String , Float > hyperparams = new
39
                        HashMap < String , Float > ();
                    hyperparams.put("lr", 0.01f);
40
                    hyperparams.put("momentum", 0.9f);
41
                    Optimizer optim = new Adam(model.parameters
42
                        (), hyperparams);
                    Loss loss_fn = new CrossEntropyLoss();
44
                    Misc.train(model, train_dl, test_dl, optim,
45
                        loss_fn, 10);
           }
46
   }
47
```

#### Convolution Classification 4.3

```
import com.data.Tensor;
  import com.utils.*;
  import com.optim.*;
  import com.nn.*;
  import java.nio.file.Paths;
7 import java.util.HashMap;
  import java.util.Map;
public class SampleConvClassification {
```

```
public static void main(String args[]) {
11
                    Sequential model = new Sequential();
12
13
                    model.add_module((NNModule) new Conv2d(1, 8,
                         3, true));
                    model.add_module((NNModule) new Sigmoid());
15
                    model.add_module((NNModule) new MaxPool2d(2)
16
                        );
                    model.add_module((NNModule) new Conv2d(8,
17
                        16, 3, true));
                    model.add_module((NNModule) new Sigmoid());
                    model.add_module((NNModule) new Flatten());
19
                    model.add_module((NNModule) new Linear(16,
20
                        10, true));
21
                    String path_to_digits = "./data/DIGITS/";
22
                    DataLoader[] dl = com.vision.Datasets.
23
                        loadDIGITS(path_to_digits, 64);
24
                    HashMap < String , Float > hyperparams = new
25
                        HashMap < String , Float > ();
                    hyperparams.put("lr", 0.01f);
26
                    hyperparams.put("momentum", 0.9f);
27
                    Optimizer optim = new Adam(model.parameters
                        (), hyperparams);
                    Loss loss_fn = new CrossEntropyLoss();
29
30
                    Misc.train(model, dl[0], dl[1], optim,
31
                        loss_fn, 50);
           }
32
33
  }
```