






# CIFAR-10

```
In[7]:= cifar10 = ResourceObject["CIFAR-10"];  
trainingData = ResourceData[cifar10, "TrainingData"];  
testData = ResourceData[cifar10, "TestData"];  
RandomSample[trainingData, 5]
```

Out[8]= {  → horse,  → cat,  → airplane,  → cat,  → truck }

```
In[9]:= classes = Union@Values[trainingData]
```

Out[9]= {airplane, automobile, bird, cat, deer, dog, frog, horse, ship, truck}

## Logistic Regression

```
In[46]:= training1000 = RandomSample[trainingData, 1000];
testing100 = RandomSample[testData, 100]
```

```
Out[47]:= {  

 → ship,  → bird,  → ship,  → frog,  → ship,  → cat,  

 → automobile,  → deer,  → airplane,  → airplane,  → dog,  

 → deer,  → automobile,  → airplane,  → cat,  → horse,  

 → bird,  → frog,  → airplane,  → ship,  → horse,  

 → automobile,  → deer,  → dog,  → bird,  → automobile,  

 → bird,  → bird,  → horse,  → airplane,  → truck,  → horse,  

 → dog,  → dog,  → automobile,  → airplane,  → truck,  

 → horse,  → airplane,  → cat,  → horse,  → truck,  → dog,  

 → airplane,  → truck,  → truck,  → horse,  → airplane,  

 → horse,  → deer,  → ship,  → automobile,  → horse,  

 → airplane,  → horse,  → deer,  → cat,  → frog,  → airplane,  

 → dog,  → deer,  → horse,  → dog,  → horse,  → dog,  

 → dog,  → airplane,  → ship,  → cat,  → cat,  → bird,  

 → dog,  → automobile,  → automobile,  → truck,  → truck,  

 → dog,  → deer,  → dog,  → bird,  → cat,  → cat,  

 → dog,  → dog,  → dog,  → horse,  → truck,  → frog,  

 → deer,  → bird,  → horse,  → dog,  → horse,  → cat,  

 → bird,  → frog,  → dog,  → cat,  → frog,  → automobile}
```

```
AbsoluteTiming[(logit = Classify[training1000, Method → "LogisticRegression"])]
```

```
In[53]:= predLabel = logit[Keys@testing100];
```

```

In[54]:= realLabel = Values[testing100];

In[55]:= Counts[MapThread[Equal, {predLabel, realLabel}]]
Out[55]= <| True → 78, False → 22 |>

In[57]:= accuracy =  $\frac{78}{100}$  // N
Out[57]= 0.78

In[73]:= logitFunction = Association@@Normal[logit]
In[74]:= Keys[logitFunction]
Out[74]= {Basic, Input, Output, Combiner, Decision, Models, Log}

In[80]:= ts = logitFunction["Models"][[1]]["Theta"];
In[81]:= Dimensions[ts]
Out[81]= {10, 440}

In[67]:= ClassifierInformation[logit]

```

Out[67]=

Classifier information	
<b>Method</b>	Logistic regression
<b>Number of classes</b>	10
<b>Number of features</b>	1
<b>Number of training examples</b>	1000
<b>L1 regularization coefficient</b>	0
<b>L2 regularization coefficient</b>	10.

```

In[66]:= ClassifierInformation[logit, "Models"]
Out[66]= Missing[PropertyNotAvailable, Models]

```

## Naive CNN model

```

In[23]:= naiveCNN = NetChain[{ConvolutionLayer[20, 5], 10, SoftmaxLayer[]},
  "Output" → NetDecoder[{"Class", classes}],
  "Input" → NetEncoder[{"Image", {32, 32}}]]

```

Out[23]=

NetChain [		image
	Input	3-tensor (size: 3 × 32 × 32)
1	ConvolutionLayer	3-tensor (size: 20 × 28 × 28)
2	LinearLayer	vector (size: 10)
3	SoftmaxLayer	vector (size: 10)
	Output	class
		(uninitialized)
		]

```

In[24]:= cnn1layer =
  NetTrain[naiveCNN, trainingData, ValidationSet → testData, MaxTrainingRounds → 3];

```

In[25]:= `predClass = cnn1layer /@ (Keys@testData)`

Out[25]= {frog, airplane, ship, ship, ship, ship, ship, ship, ship, airplane, airplane,  
ship, ship, truck, airplane, ship, airplane, ship, ship, ship, ship, dog,  
ship, ship, ship, ... 9952 ..., automobile, truck, truck, truck, ship,  
frog, truck, ship, truck, truck, truck, truck, ship, truck, truck, horse, truck,  
automobile, frog, truck, automobile, truck, automobile, automobile, truck}

large output

show less

show more

show all

set size limit...

In[26]:= `realClass = Values[testData]`

Out[26]= {airplane, airplane, airplane, airplane, airplane, airplane, airplane, airplane, airplane,  
airplane, airplane, airplane, airplane, airplane, airplane, airplane, airplane,  
airplane, airplane, airplane, airplane, airplane, airplane, airplane, ... 9958 ...,  
truck, truck, truck, truck, truck, truck, truck, truck, truck, truck, truck, truck,  
truck, truck, truck, truck, truck, truck, truck, truck, truck, truck}

large output

show less

show more

show all

set size limit...


In[27]:= `Counts[MapThread[Equal, {predClass, realClass}]]`

Out[27]= {False → 6100, True → 3900}

In[28]:= `accuracy =  $\frac{3900}{10\,000}$  // N`

Out[28]= 0.39

In[29]:= `randomTestData = RandomSample[testData, 10]`

Out[29]= { → frog,  → automobile,  → deer,  → automobile,  → ship,  
 → frog,  → airplane,  → frog,  → cat,  → horse}

In[30]:= `Keys@randomTestData`

Out[30]= {, , , , , , , , , 

In[31]:= `cnn1layer[Keys@randomTestData]`

Out[31]= {cat, truck, dog, automobile, ship, deer, ship, cat, cat, frog}

## LeNet model

```
In[32]:= lenet = NetChain[{ConvolutionLayer[20, 5], Ramp, PoolingLayer[2, 2],
  ConvolutionLayer[50, 5], Ramp, PoolingLayer[2, 2], FlattenLayer[], 500,
  Ramp, 10, SoftmaxLayer[]}, "Output" → NetDecoder[{"Class", classes}],
  "Input" → NetEncoder[{"Image", {32, 32}}]]
```

```
Out[32]= NetChain [
  Input          image
                3-tensor (size: 3 × 32 × 32)
  1 ConvolutionLayer 3-tensor (size: 20 × 28 × 28)
  2 Ramp           3-tensor (size: 20 × 28 × 28)
  3 PoolingLayer   3-tensor (size: 20 × 14 × 14)
  4 ConvolutionLayer 3-tensor (size: 50 × 10 × 10)
  5 Ramp           3-tensor (size: 50 × 10 × 10)
  6 PoolingLayer   3-tensor (size: 50 × 5 × 5)
  7 FlattenLayer   vector (size: 1250)
  8 LinearLayer    vector (size: 500)
  9 Ramp           vector (size: 500)
  10 LinearLayer   vector (size: 10)
  11 SoftmaxLayer  vector (size: 10)
  Output          class
                  (uninitialized)
```

```
In[34]:= lenet = NetTrain[lenet, trainingData, ValidationSet → testData, MaxTrainingRounds → 3]
```

```
Out[34]= NetChain [
  Input          image
                3-tensor (size: 3 × 32 × 32)
  1 ConvolutionLayer 3-tensor (size: 20 × 28 × 28)
  2 Ramp           3-tensor (size: 20 × 28 × 28)
  3 PoolingLayer   3-tensor (size: 20 × 14 × 14)
  4 ConvolutionLayer 3-tensor (size: 50 × 10 × 10)
  5 Ramp           3-tensor (size: 50 × 10 × 10)
  6 PoolingLayer   3-tensor (size: 50 × 5 × 5)
  7 FlattenLayer   vector (size: 1250)
  8 LinearLayer    vector (size: 500)
  9 Ramp           vector (size: 500)
  10 LinearLayer   vector (size: 10)
  11 SoftmaxLayer  vector (size: 10)
  Output          class
```

```
In[35]:= predClass = lenet /@ (Keys@testData)
```

```
Out[35]= {ship, airplane, ship, airplane, airplane, airplane, airplane, airplane, airplane,
  airplane, airplane, dog, airplane, airplane, ship, airplane, airplane,
  ... 9966 ..., truck, automobile, truck, truck, truck, truck, truck, horse,
  automobile, truck, truck, truck, automobile, truck, truck, truck, truck}
```

[large output](#)
[show less](#)
[show more](#)
[show all](#)
[set size limit...](#)

```
In[36]:= realClass = Values[testData]
```

```
Out[36]=
```

```
{airplane, airplane, airplane, airplane, airplane, airplane, airplane, airplane,  
airplane, airplane, airplane, airplane, airplane, airplane, airplane,  
airplane, airplane, ... 9966 ..., truck, truck, truck, truck, truck, truck,  
truck, truck, truck, truck, truck, truck, truck, truck, truck, truck}
```

[large output](#)[show less](#)[show more](#)[show all](#)[set size limit...](#)

```
In[37]:= Counts[MapThread[Equal, {predClass, realClass}]]
```

```
Out[37]= <| False → 3883, True → 6117 |>
```

```
In[38]:= accuracy =  $\frac{6117}{10\,000}$  // N
```

```
Out[38]= 0.6117
```