




The Machine Learning Package

Nov. 2023, Max Kleiner

- MLP as Package with out of the box demos
- IDE / RAD / CLI / Shell / Scripts
- CIFAR-10 Image Classifier 
- <https://github.com/maxkleiner/neural-api>
- This session shows you various ways of using the MLP in your application.

Agenda

- Artificial Neural Networks (ANNs) in a Delphi Form as a Component.
- ML Package for Delphi and Lazarus.
- CIFAR-10 Image Classifier
- Loading and testing a pre-trained model
- *In the archive **MachineLearningPackage.zip** you find the script, model and data you need, which works with Lazarus, Delphi, Jupyter and maXbox.*



NN Research

- Neural networks are composed of a large number of interconnected units divided into input, output, and hidden nodes. A single processing unit merely sums up the weighted activation on its inputs, transforms this sum according to an activation function, and passes the resulting function to its output.
- https://www.kau.edu.sa/Files/320/Researches/52692_22998.pdf
- <https://entwickler-konferenz.de/blog/machine-learning-mit-cai/>

Cross-platform ANN component

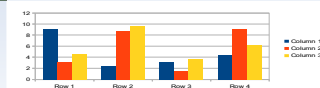
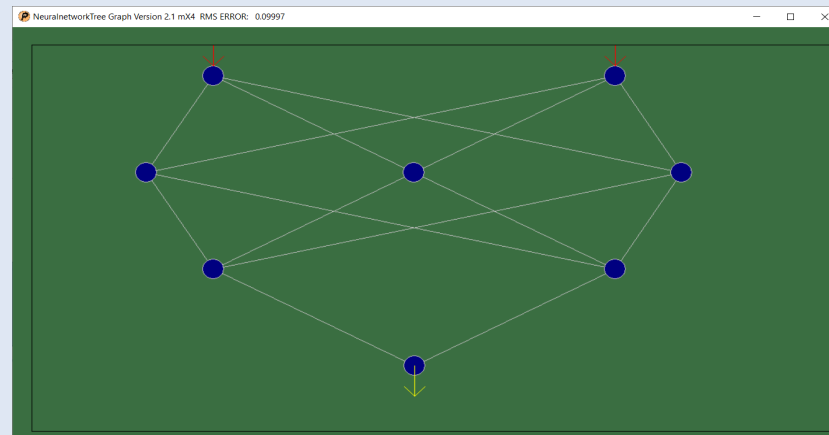
- Defining the Network Structure.
- Initialization (structure).
- Specifying minimum and maximum values for inputs and outputs.
- Training data (with loss function).
- After Training testing.
- Using the Trained Network

<https://github.com/maxkleiner/maXbox/blob/master/logisticregression2.ipynb>



Defining NN Structure

- To define structure of a network run-time, just add following lines:
- `nn1.Network.clear;`
- `nn1.Network.Add('2');` // Number of inputs
- `nn1.Network.Add('3');` // Number of hidden neurons
- `nn1.Network.Add('2');`
- `nn1.Network.Add('1');` // Num. of outputs
- `Nn1.Initialize(true);` // Initialize neural network





Be aware of

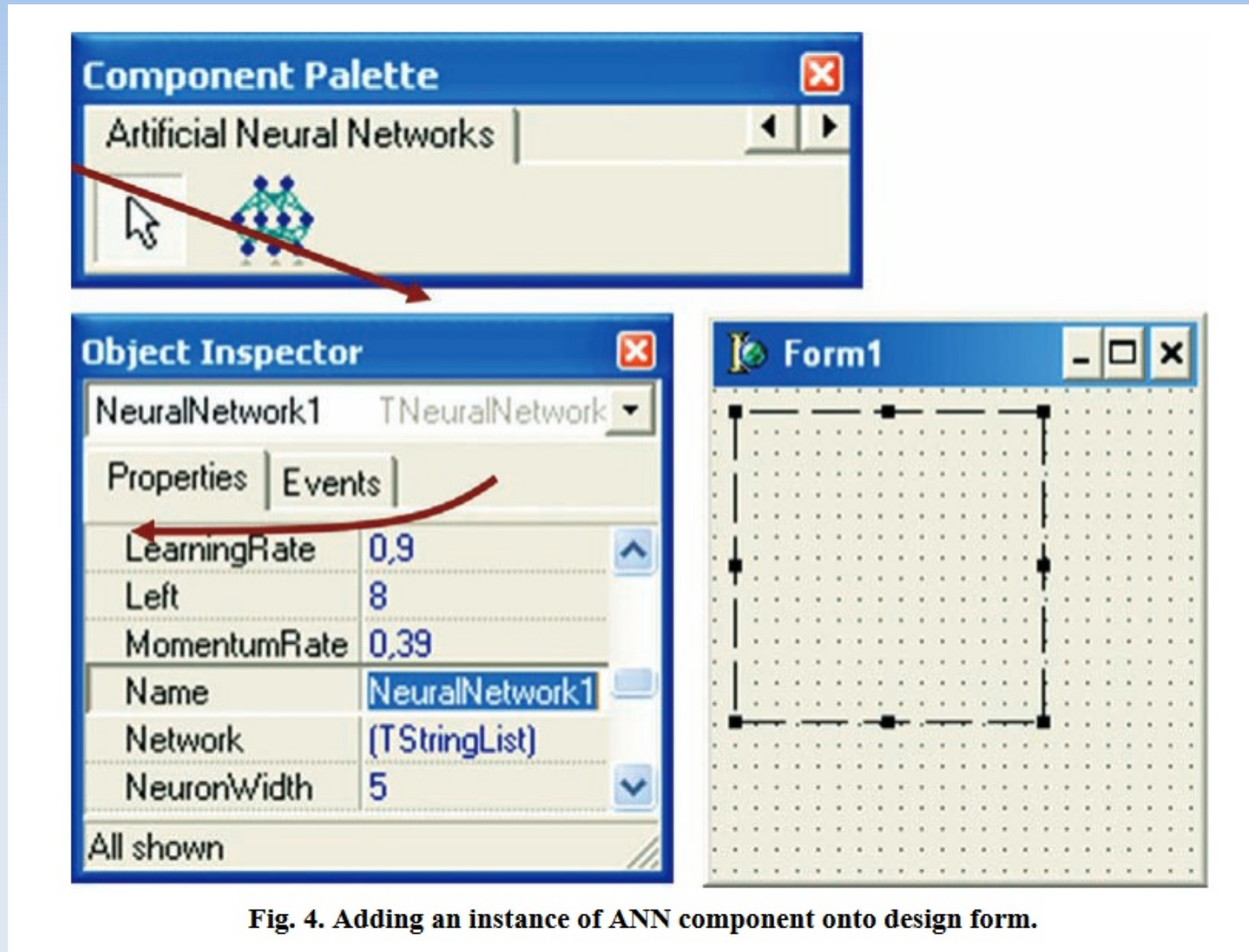


Fig. 4. Adding an instance of ANN component onto design form.

Demo: 1234_NeuralNetwork2_XOR_test12_EKON27.pas



Graph Control

NeuralnetworkTree Graph Version 2.2 EU mX4 XOR Sample RMS ERROR: 0.04974

Messages

Started at 19/07/2023 23:49:12
Finished learn at 19/07/2023 23:49:18
Started at 19/07/2023 23:49:21
Finished learn at 19/07/2023 23:49:24
Started at 19/07/2023 23:49:25
Finished learn at 19/07/2023 23:49:30
Started at 19/07/2023 23:49:32
Finished learn at 19/07/2023 23:49:38
Started at 19/07/2023 23:49:38
Finished learn at 19/07/2023 23:49:40
Started at 19/07/2023 23:49:41
Finished learn at 19/07/2023 23:49:49
Started at 19/07/2023 23:49:50
Finished learn at 19/07/2023 23:49:54
Started at 19/07/2023 23:49:55
Finished learn at 19/07/2023 23:49:56
Started at 19/07/2023 23:50:43
Finished learn at 19/07/2023 23:50:46
Started at 19/07/2023 23:50:47
Finished learn at 19/07/2023 23:50:48
Started at 19/07/2023 23:50:52
Finished learn at 19/07/2023 23:50:54

Neuron Size Load Network Save Network Draw Network

Learn Stop Learning Save Network Image as Bitmap

Input 1
 Close Form

Calculate Output

Inputs and Outputs Use '5's as minimum, and '10's as maximum values

Number of Training:
RMS Error:

RMS Error

Iteration



Flow & Graph Control II

NeuralnetworkTree Graph Version 2.2 EU mX4 XOR Sample RMS ERROR: 0.04974

Messages

Finished learn at 19/07/2023 23:49:38
Started at 19/07/2023 23:49:38
Finished learn at 19/07/2023 23:49:40
Started at 19/07/2023 23:49:41
Finished learn at 19/07/2023 23:49:49
Started at 19/07/2023 23:49:50
Finished learn at 19/07/2023 23:49:54
Started at 19/07/2023 23:49:55
Finished learn at 19/07/2023 23:49:56
Started at 19/07/2023 23:50:43
Finished learn at 19/07/2023 23:50:46
Started at 19/07/2023 23:50:47
Finished learn at 19/07/2023 23:50:48
Started at 19/07/2023 23:50:52
Finished learn at 19/07/2023 23:50:54
Started at 19/07/2023 23:52:30
Finished learn at 19/07/2023 23:52:35
Started at 19/07/2023 23:52:43
Finished learn at 19/07/2023 23:52:48
Started at 19/07/2023 23:52:48
Finished learn at 19/07/2023 23:52:51
Started at 19/07/2023 23:52:54
Finished learn at 19/07/2023 23:52:57
Started at 19/07/2023 23:53:08
Finished learn at 19/07/2023 23:53:11
Started at 19/07/2023 23:53:14
Finished learn at 19/07/2023 23:53:36
Started at 19/07/2023 23:54:21
Finished learn at 19/07/2023 23:55:00

Neuron Size Load Network Save Network Draw Network

Learn Stop Learning Save Network Image as Bitmap

Input 1
 Close Form

Calculate Output

Inputs and Outputs Use '5's as minimum, and '10's as maximum values

Number of Training:
RMS Error:

RMS Error

Iteration



ML Package

- IDE for Console or Terminal

The screenshot shows a terminal window titled "Terminal — fp — 80x24". The window has a menu bar with "File", "Edit", "Search", "Run", "Compile", "Debug", "Tools", "Options", "Window", and "Help". The main area is a blue terminal with a white cursor. The text in the terminal is:

```
[*] noname01.pas 1-[*]  
begin  
  writeln("Free Pascal is very Turbo Pascal compatible!");  
end.  
* 2:58 *
```

At the bottom of the terminal, there is a status bar with the following text: "F1 Help F2 Save F3 Open Alt+F9 Compile F9 Make Alt+F10 Local menu".



MLP

- The neural-api or CAI API (Conscious Artificial Intelligence) is
- something like TensorFlow for Pascal and is platform-independent open source
- library for artificial intelligence or machine learning in the field of
- speech recognition, image classification, OpenCL, big data, data science, sentiment-analysis
- and computer vision2 with more or less SVG.

Using MLP

- To be able to run this example, you'll need to load an already trained neural network file and then select the image you intend to classify.
- *TRAINPATH = '.\model\ClassifyCNNResize40_84.nn'*
- CAI stores both architecture and weights into the same *.nn file!
- Dropout is a simple and powerful regularization technique for neural networks and deep learning models.
- Download the package:

<https://github.com/maxkleiner/neural-api/blob/master/examples/SimpleImageClassifier/MachineLearningPackage.zip>

- Just unpack the zip and start exe



Let's compile

- As the name implies, it is a CNN-model. A Convolutional Neural Network (CNN) is a type of deep learning algorithm that is particularly for image recognition and object-detection tasks. It is made up of multiple layers, including convolution layers, pooling layers, and fully connected layers.
- `Const PICPATH = '.\data\';`
- `TRAINPATH = '.\model\ClassifyCNNModel_70.nn';`
- The main procedure to classify incoming images loads the model, decides dropout or not (later more) and creates input- and output-volumes with a shape of 32;32;3 or a 32x32x3 volume:
- Demo: *1135_classify_cifar10images1_5.pas*



The Main

```
begin
  NN:= THistoricalNets.create; //TNNet.Create();
  NN.LoadFromFile (TRAINPATH);
  label2.caption:= 'load: '+TRAINPATH;

  if chkboxdrop.checked then
    NN.EnableDropouts(true) else
    NN.EnableDropouts(false);
  pInput:= TNNetVolume.Create0(32, 32, 3, 1);
  pOutPut:= TNNetVolume.Create0(10, 1, 1, 1);

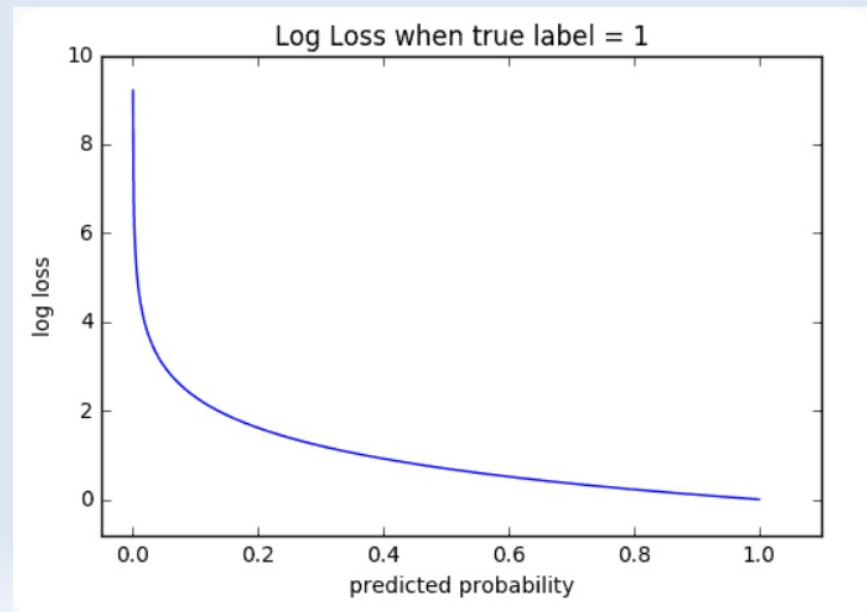
  LoadPictureIntoVolume(imagel.picture, pinput);
  pInput.RgbImgToNeuronalInput(csEncodeRGB);
  NN.Compute65(pInput,0);
  NN.GetOutput(pOutPut);
  writeln('result get class type: '+itoa(pOutPut.GetClass()));
```

Loading 10K images from file "C:\Program
Files\Streaming\maxbox4\maxbox47590\maxbox4\cifar-10-batches-bin\test_batch.bin" ...
GLOBAL MIN MAX -2 1.984375
Testbatch size: 48000000
dbug volumescount: 10000
Ver: 4.7.6.50 (476). Workdir: C:\Program
Files\Streaming\maxbox4\maxbox47590\maxbox4\resized\MLPackage
Testbatch score: Rate:0.8000, Loss:-0.0639, ErrorSum:467.7171



Pretrained

- The *.nn file in TRAINPATH serves as a pre-trained file (FAvgWeight) to classify/predict images we trained on. Also the CIFAR-10 with experiments/testcnnalgo/testcnnalgo.lpr and a number of CIFAR-10 classification examples are available on /experiments.
-
- Imagine the accuracy goes up and the loss-function (error-rate) goes down. The loss function is the bread & butter of modern machine learning; it takes your algorithm from theoretical to practical and transforms matrix multiplication into deep learning.





Electron Web App

Form1 maXbox CAI_Classify 1.61

predicts: ship Score 82.80%
dropout:

.\data\ship140.bmp

Classify

type	probability +-[-60,90]
airplane	4.90592002868652
automobile	2.50888991355896
bird	-2.487948179245
cat	-2.37353849411011
deer	-3.59395837783813
dog	-2.81476211547852
frog	-1.23185789585114
horse	-4.9587574005127
ship	13.8925495147705
truck	-0.694586515426636

- Unit classify_cifar10_images2lazTutor42_1_61;



Form Create

```
procedure TForm1FormCreate(Sender: TObject);  
var k,t: integer;  
    items: TStringList;  
begin  
    items:= TStringList.create;  
    for k:= 0 to 9 do  
        StringGrid1.Cells[0, k+1]:= cs10Labels[k];  
  
    //FindAllFiles(ComboBox1.Items, 'csdata');  
    FindFiles(exepath+'data', '*.bmp', items);  
    writeln(items.text);  
    for t:= 1 to items.count-1 do  
        ComboBox1.Items.add(items[t]);  
    if ComboBox1.Items.Count > 0 then begin  
        ComboBox1.text:= ComboBox1.Items[0];  
        if FileExists(ComboBox1.text) then begin  
            Image1.Picture.LoadFromFile(ComboBox1.text);  
            Image2.Picture.LoadFromFile(ComboBox1.text);  
            labell1.Caption:= extractfilename(ComboBox1.text);  
        end;  
    end;  
end;
```




Performance

- Loss functions are different based on a problem statement to which deep learning is being applied. The cost function is another term used interchangeably for the loss function, but it holds a more different meaning.
- A loss function is for a single training example, while a cost function is an average loss over a complete train dataset.
- train neural network start..:15000 iterators, train neural network finished:
- RMS ERROR: 0.004679808474835: evaluate neural network..
- i:0 j:0 0.095534542493845
- i:0 j:1 0.931946667637693
- i:1 j:0 0.914564807733864
- i:1 j:1 0.005510785410457

debug inf nncount:3 mX4 executed: 14/08/2023 09:33:01 Runtime: 0:0:6.1 Memload: 54% use



Web Platforms

- As a Jupyter Notebook:
- https://github.com/maxkleiner/maXbox/blob/master/EKON24_SimpleImageClassificationCPU.ipynb
- and the same in Colab.research:
- https://colab.research.google.com/github/maxkleiner/maXbox/blob/master/EKON24_SimpleImageClassificationCPU.ipynb

The whole package with app, script, tutorial, data and model:

<https://github.com/maxkleiner/neural-api/blob/master/examples/SimpleImageClassifier/MachineLearningPackage.zip>

<https://github.com/maxkleiner/maXbox/blob/master/objectdetector3.ipynb>



Conclusion

- Only CNN is available but diff. structures possible, implement some of these well known architectures with CAI:
 - For example Yann LeCun LeNet-5: **Method: Classification**
 - `NN := TNNet.Create();` **Model: CNN + CIFAR-10**
 - `NN.AddLayer(TNNetInput.Create(28, 28, 1));` **Metric: RMS**
`NN.AddLayer(TNNetConvolution.Create(6, 5, 0, 1));`
`NN.AddLayer(TNNetMaxPool.Create(2));`
`NN.AddLayer(TNNetConvolution.Create(16, 5, 0, 1));`
`NN.AddLayer(TNNetMaxPool.Create(2));`
`NN.AddLayer(TNNetFullConnect.Create(120));`
`NN.AddLayer(TNNetFullConnect.Create(84));`
`NN.AddLayer(TNNetFullConnectLinear.Create(10));`
`NN.AddLayer(TNNetSoftMax.Create());`



MLP

Thanks for coming!

Materials:

http://www.softwareschule.ch/download/maxbox_starter105.pdf

<https://github.com/breitsch2/maXbox4/tree/master/assets>