# New CA Classifiers (random colours)

## Wolfram Classes of ECAs

## Functions for creating net and random datasets (ECAs, all 4 classes)

```
RandomRuleC[n_Integer, W_Integer, H_Integer] :=
In[2]:=
       Image[ArrayPlot[CellularAutomaton[n, RandomInteger[1, W], H - 1],
         ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
            3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
            6 -> RandomColor[], 7 -> RandomColor[]}, Frame → False]]
      netC[W_Integer, H_Integer] := NetInitialize@
        NetChain[{ConvolutionLayer[16, {2, 3}], Ramp, PoolingLayer[{H, W} - {1, 2}],
           FlattenLayer[], LinearLayer[256], SoftmaxLayer[]},
         "Input" → NetEncoder[{"Image", {W, H}}],
         "Output" → NetDecoder[{"Class", Range[0, 255]}]]
      netTwoCC[W_Integer, H_Integer] := NetInitialize@
        NetChain[<|"conv1" → ConvolutionLayer[16, {2, 3}], "ramp1" → Ramp,
           "conv3" → ConvolutionLayer[16, {2, 3}], "ramp2" → Ramp,
           "pooling" → PoolingLayer[{H, W} - {2, 4}], "flatten" → FlattenLayer[],
           "linear" → 512, "linear2" → 4, "softmax" → SoftmaxLayer[]|>,
         "Input" → NetEncoder[{"Image", {W, H}}],
         "Output" → NetDecoder[{"Class", Range[1, 4]}]]
      dataC[W_Integer, H_Integer, n_Integer] := Table[
        RandomRuleC[i, W, H] → CAclasses[[i+1]], {i, RandomChoice[Range[0, 255], n]}]
```

```
netThreeCC[W_Integer, H_Integer] :=
In[6]:=
        NetInitialize@NetChain[<|"conv1" → ConvolutionLayer[16, {2, 3}],</pre>
           "ramp1" → Ramp, "conv2" → ConvolutionLayer[16, {2, 3}],
           "ramp2" → Ramp, "conv3" → ConvolutionLayer[16, {2, 3}], "ramp3" → Ramp,
           "pooling" → PoolingLayer[{H, W} - {4, 8}], "flatten" → FlattenLayer[],
           "linear" → 512, "linear2" → 4, "softmax" → SoftmaxLayer[]|>,
          "Input" → NetEncoder[{"Image", {W, H}}],
          "Output" → NetDecoder[{"Class", Range[1, 4]}]]
       netThreeCC1024[W_Integer, H_Integer] :=
In[7]:=
        NetInitialize@NetChain[<|"conv1" → ConvolutionLayer[16, {2, 3}],</pre>
           "ramp1" → Ramp, "conv2" → ConvolutionLayer[16, {2, 3}],
           "ramp2" \rightarrow Ramp, "conv3" \rightarrow ConvolutionLayer[16, {2, 3}], "ramp3" \rightarrow Ramp,
           "pooling" → PoolingLayer[{H, W} - {4, 8}], "flatten" → FlattenLayer[],
           "linear" → 1024, "linear2" → 4, "softmax" → SoftmaxLayer[]|>,
          "Input" → NetEncoder[{"Image", {W, H}}],
          "Output" → NetDecoder[{"Class", Range[1, 4]}]]
       netFourCC512[W_Integer, H_Integer] :=
In[8]:=
        NetInitialize@NetChain[<|"conv1" → ConvolutionLayer[32, {2, 3}],</pre>
           "ramp1" → Ramp, "conv3" → ConvolutionLayer[32, {2, 3}], "ramp2" → Ramp,
           "pooling" → PoolingLayer[{H, W} - {2, 4}], "flatten" → FlattenLayer[],
           "linear" → 512, "linear2" → 4, "softmax" → SoftmaxLayer[]|>,
          "Input" → NetEncoder[{"Image", {W, H}}],
          "Output" → NetDecoder[{"Class", Range[1, 4]}]]
       netFiveCC512[W_Integer, H_Integer] :=
In[9]:=
        NetInitialize@NetChain[<|"conv1" → ConvolutionLayer[32, {2, 3}],</pre>
           "bat1" → BatchNormalizationLayer[], "ramp1" → Ramp,
           "conv3" → ConvolutionLayer[32, {2, 3}],
           "bat2" → BatchNormalizationLayer[], "ramp2" → Ramp,
           "pooling" → PoolingLayer[{H, W} - {2, 4}], "flatten" → FlattenLayer[],
           "linear" → 512, "linear2" → 4, "softmax" → SoftmaxLayer[]|>,
          "Input" → NetEncoder[{"Image", {W, H}}],
          "Output" → NetDecoder[{"Class", Range[1, 4]}]]
       netSixCC512drop[W_Integer, H_Integer] :=
In[10]:=
        NetInitialize@NetChain[<|"drop1" → DropoutLayer[0.2], "conv1" →</pre>
             ConvolutionLayer[32, {3, 3}], "bat1" → BatchNormalizationLayer[],
           "ramp1" → Ramp, "conv3" → ConvolutionLayer[32, {3, 3}],
           "bat2" \rightarrow BatchNormalizationLayer[], "ramp2" \rightarrow Ramp,
           "pooling" → PoolingLayer[{H, W} - {4, 8}], "flatten" → FlattenLayer[],
           "linear" → 512, "drop2" → DropoutLayer[0.2], "linear2" → 4,
           "softmax" → SoftmaxLayer[]|>, "Input" → NetEncoder[{"Image", {W, H}}],
          "Output" → NetDecoder[{"Class", Range[1, 4]}]]
```

```
netSevenCC512drop[W_Integer, H_Integer] :=
In[11]:=
        NetInitialize@NetChain[<|"conv1" → ConvolutionLayer[24, {3, 3}],</pre>
           "bat1" → BatchNormalizationLayer[], "ramp1" → Ramp,
           "conv3" → ConvolutionLayer[24, {3, 3}],
           "bat2" → BatchNormalizationLayer[], "ramp2" → Ramp,
           "pooling" → PoolingLayer[{H, W} - {4, 8}], "flatten" → FlattenLayer[],
           "linear" \rightarrow 512, "drop2" \rightarrow DropoutLayer[0.2], "linear2" \rightarrow 4,
           "softmax" → SoftmaxLayer[]|>, "Input" → NetEncoder[{"Image", {W, H}}],
          "Output" → NetDecoder[{"Class", Range[1, 4]}]]
       netEightCC512drop[W_Integer, H_Integer] :=
In[12]:=
        NetInitialize@NetChain[<|"conv1" → ConvolutionLayer[24, {3, 3}],</pre>
           "bat1" → BatchNormalizationLayer[], "ramp1" → Ramp,
           "conv2" → ConvolutionLayer[16, {2, 3}], "bat2" → BatchNormalizationLayer[],
           "ramp2" → Ramp, "conv3" → ConvolutionLayer[24, {3, 3}],
           "bat3" → BatchNormalizationLayer[], "ramp3" → Ramp,
           "pooling" → PoolingLayer[{H, W} - {8, 16}], "flatten" → FlattenLayer[],
           "linear" → 1024, "drop2" → DropoutLayer[0.2], "linear2" → 4,
           "softmax" → SoftmaxLayer[]|>, "Input" → NetEncoder[{"Image", {W, H}}],
          "Output" → NetDecoder[{"Class", Range[1, 4]}]]
       netNineCC512drop[W_Integer, H_Integer] :=
In[13]:=
        NetInitialize@NetChain[<|"conv1" → ConvolutionLayer[24, {3, 3}],</pre>
           "bat1" → BatchNormalizationLayer[], "ramp1" → Ramp,
           "conv2" → ConvolutionLayer[24, {3, 3}], "bat2" → BatchNormalizationLayer[],
           "ramp2" → Ramp, "conv3" → ConvolutionLayer[24, {3, 3}],
           "bat3" → BatchNormalizationLayer[], "ramp3" → Ramp,
           "pooling" → PoolingLayer[{H, W} - {12, 12}], "flatten" → FlattenLayer[],
           "linear" → 512, "drop2" → DropoutLayer[0.2], "linear2" → 4,
           "softmax" → SoftmaxLayer[]|>, "Input" → NetEncoder[{"Image", {W, H}}],
          "Output" → NetDecoder[{"Class", Range[1, 4]}]]
```

# Functions for creating datasets (1D totalistic CAs)

### k=3, r=1 totalistic (class 4 only)

```
gen3TC[p_Integer, W_Integer, H_Integer] :=
In[14]:=
        Image[ArrayPlot[CellularAutomaton[{p, {3, 1}}, RandomInteger[1, W], H-1],
           ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame -> False]]
       data3T2C[W_Integer, H_Integer, n_Integer] := Table[gen3TC[i, W, H] → 4,
         {i, RandomChoice[{1635, 1815, 2007, 2043, 2049, 1388, 1041}, n]}]
```

## k=4, r=1 totalistic (class 4 only, 1 example)

```
gen4TC[p_Integer, W_Integer, H_Integer] :=
In[16]:=
        Image[ArrayPlot[CellularAutomaton[{p, {4, 1}}, RandomInteger[1, W], H-1],
           ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame -> False]]
       data4TC[W_Integer, H_Integer, n_Integer] := Table[gen4TC[1004600, W, H] → 4, n]
```

## k=2, r=2 totalistic (all 4 classes)

```
gen2r2C[p_Integer, W_Integer, H_Integer] :=
In[18]:=
        Image[ArrayPlot[CellularAutomaton[{p, {2, 1}, 2}, RandomInteger[1, W], H-1],
          ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame -> False]]
       data2r2c4C[W_Integer, H_Integer, n_Integer] :=
        Table[gen2r2C[i, W, H] → 4, {i, RandomChoice[{20, 52}, n]}]
       data2r2c3C[W_Integer, H_Integer, n_Integer] :=
        Table[gen2r2C[i, W, H] → 3, {i, RandomChoice[
            {2, 6, 10, 12, 14, 18, 22, 26, 28, 30, 34, 38, 42, 44, 46, 50}, n]}]
       data2r2c2C[W_Integer, H_Integer, n_Integer] :=
        Table[gen2r2C[i, W, H] \rightarrow 2, {i, RandomChoice[{8, 24, 56}, n]}]
       data2r2c1C[W_Integer, H_Integer, n_Integer] := Table[gen2r2C[i, W, H] → 1,
         {i, RandomChoice[{0, 4, 16, 32, 36, 40, 48, 54, 58, 60, 62}, n]}]
       genData2r2C[W Integer, H Integer, n Integer] := Join[data2r2c4C[W, H, n],
         data2r2c3C[W, H, n], data2r2c2C[W, H, n], data2r2c1C[W, H, n]]
```

## k=5, r=1 totalistic (class 4 only)

```
gen5T4C[p_Integer, W_Integer, H_Integer] :=
In[24]:=
        Image[ArrayPlot[CellularAutomaton[{p, {5, 1}}, RandomInteger[1, W], H-1],
           ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame -> False]]
       data5T4C[n_Integer, W_Integer, H_Integer] :=
        Table[gen5T4C[i, W, H] → 4, {i, RandomChoice[
            {781 130 654, 772 514 435, 1 151 319 452, 309 095 787, 880 862 046, 973 835 714,
             779 446 817, 345 466 505, 535 500 975, 793 363 571, 1052 373 865, 455 984 785,
             339 227 109, 1050 973 846, 513 368 817, 91 315 820, 113 925 357}, n]}]
```

## k=5, r=1 totalistic (classes 2/3/4)

```
gen5TC[p_Integer, W_Integer, H_Integer] :=
In[26]:=
        Image[ArrayPlot[CellularAutomaton[{p, {5, 1}, 1}, RandomInteger[1, W], H-1],
          ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame -> False]]
       data5T4CC[W_Integer, H_Integer, n_Integer] := Table[gen5TC[i, W, H] → 4,
         {i, RandomChoice[{644218533, 491739943, 6889640, 986144962, 1099816682,
             988 971 204, 300 829 994, 272 622 024, 304 100 638, 626 595 633}, n]}]
       data5T3CC[W_Integer, H_Integer, n_Integer] := Table[gen5TC[i, W, H] → 3,
         {i, RandomChoice[{889 082 395, 541 068 260, 807 907 479, 816 180 062, 650 485 139,
             643 827 745, 753 940 864, 871 525 323, 351 440 311, 83 501 460}, n]}]
       data5T2CC[W_Integer, H_Integer, n_Integer] :=
        Table[gen5TC[i, W, H] → 2, {i, RandomChoice[
            {525735659, 1022330944, 1007796739, 495633437, 1036827943}, n]}]
       genData5TCC[W_Integer, H_Integer, n_Integer] :=
        Join[data5T4CC[W, H, n], data5T3CC[W, H, n], data5T2CC[W, H, n]]
```

## Generate test datasets

## k=2, r=2 non-totalistic

```
genk2r2C[p_Integer, W_Integer, H_Integer] :=
In[31]:=
        Image[ArrayPlot[CellularAutomaton[{p, 2, 2}, RandomInteger[1, W], H-1],
           ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame -> False]]
       datak2r2C[W Integer, H Integer, n Integer] :=
        Table[genk2r2C[i, W, H] → i, {i, RandomChoice[Range[0, 4294967295], n]}]
```

## k=2, r=3 non-totalistic

```
genk2r3NT[p_Integer, W_Integer, H_Integer] :=
In[75]:=
        Image[ArrayPlot[CellularAutomaton[{p, 2, 3}, RandomInteger[1, W], H-1],
           ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame -> False]]
       datak2r3NT[W_Integer, H_Integer, n_Integer] :=
        Table[genk2r3NT[i, W, H] → i, {i, RandomInteger[2^2^7-1, n]}]
```

## k=3, r=1 non-totalistic

```
genk3r1NT[p_Integer, W_Integer, H_Integer] :=
In[87]:=
        Image[ArrayPlot[CellularAutomaton[{p, 3}, RandomInteger[1, W], H-1],
           ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame -> False]]
       datak3r1NT[W_Integer, H_Integer, n_Integer] :=
        Table[genk3r1NT[i, W, H] → i, {i, RandomInteger[3^3^3-1, n]}]
```

## k=3, r=2 totalistic

```
genk3r2C[p_Integer, W_Integer, H_Integer] :=
In[35]:=
        Image[ArrayPlot[CellularAutomaton[{p, {3, 1}, 2}, RandomInteger[1, W], H-1],
           ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame -> False]]
       datak3r2C[W_Integer, H_Integer, n_Integer] :=
        Table[genk3r2C[i, W, H] → i, {i, RandomChoice[Range[0, 177146], n]}]
```

## k=3, r=3 totalistic

```
genk3r3C[p_Integer, W_Integer, H_Integer] :=
In[37]:=
        Image[ArrayPlot[CellularAutomaton[{p, {3, 1}, 3}, RandomInteger[1, W], H-1],
          ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame -> False]]
       datak3r3C[W_Integer, H_Integer, n_Integer] :=
        Table[genk3r3C[i, W, H] → i, {i, RandomChoice[Range[0, 14348906], n]}]
```

#### k=4, r=1 non-totalistic

```
genk4r1NT[p_Integer, W_Integer, H_Integer] :=
In[91]:=
        Image[ArrayPlot[CellularAutomaton[{p, 4}, RandomInteger[1, W], H-1],
           ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame -> False]]
       datak4r1NT[W_Integer, H_Integer, n_Integer] :=
        Table[genk4r1NT[i, W, H] → i, {i, RandomInteger[4^4^3 - 1, n]}]
```

## k=4, r=1 totalistic

```
genk4r1C[p_Integer, W_Integer, H_Integer] :=
In[39]:=
        Image[ArrayPlot[CellularAutomaton[{p, {4, 1}}, RandomInteger[1, W], H-1],
           ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame -> False]]
       datak4r1C[W_Integer, H_Integer, n_Integer] :=
        Table[genk4r1C[i, W, H] → i, {i, RandomChoice[Range[0, 1048575], n]}]
```

## k=4. r=2 totalistic

```
genk4r2C[p_Integer, W_Integer, H_Integer] :=
In[41]:=
        Image[ArrayPlot[CellularAutomaton[{p, {4, 1}, 2}, RandomInteger[1, W], H-1],
           ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame -> False]]
       datak4r2C[W_Integer, H_Integer, n_Integer] :=
        Table[genk4r2C[i, W, H] \rightarrow i, {i, RandomChoice[Range[0, 4294967295], n]}]
```

### k=5, r=1 totalistic

```
gen5T2C[p_Integer, W_Integer, H_Integer] :=
In[43]:=
        Image[ArrayPlot[CellularAutomaton[{p, {5, 1}, 1}, RandomInteger[1, W], H-1],
          ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame -> False]]
       data5T2C[n_Integer, W_Integer, H_Integer] := Table[gen5T2C[i, W, H] → i,
         {i, RandomChoice[Range[0, 1220703125], n]}]
```

### k=6, r=1 totalistic

```
gen6TC[p_Integer, W_Integer, H_Integer] :=
In[45]:=
        Image[ArrayPlot[CellularAutomaton[{p, {6, 1}, 1}, RandomInteger[1, W], H-1],
           ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame -> False]]
       data6TC[n_Integer, W_Integer, H_Integer] := Table[gen6TC[i, W, H] → i,
         {i, RandomInteger[2821109907455, n]}]
```

## k=6, r=2 totalistic

```
gen6T2C[p_Integer, W_Integer, H_Integer] :=
In[47]:=
        Image[ArrayPlot[CellularAutomaton[{p, {6, 1}, 2}, RandomInteger[1, W], H-1],
           ImageSize \rightarrow {W, H}, ColorRules \rightarrow {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame -> False]]
       data6T2C[n_Integer, W_Integer, H_Integer] := Table[gen6T2C[i, W, H] → i,
         {i, RandomInteger[170581728179578208255, n]}]
```

## k=7, r=1 totalistic

```
gen7TC[p_Integer, W_Integer, H_Integer] :=
In[49]:=
        Image[ArrayPlot[CellularAutomaton[{p, {7, 1}, 1}, RandomInteger[1, W], H-1],
          ImageSize → {W, H}, ColorRules → {0 -> RandomColor[], 1 -> RandomColor[],
            3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
            6 -> RandomColor[], 7 -> RandomColor[]}, Frame → False]]
       data7TC[n_Integer, W_Integer, H_Integer] := Table[gen7TC[i, W, H] → i,
         {i, RandomInteger[11398895185373142, n]}]
```

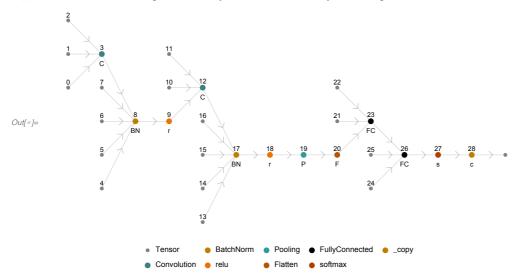
## k=8, r=1 totalistic

```
gen8TC[p_Integer, W_Integer, H_Integer] :=
In[51]:=
        Image[ArrayPlot[CellularAutomaton[{p, {8, 1}, 1}, RandomInteger[1, W], H - 1],
          ImageSize → {W, H}, ColorRules → {0 -> RandomColor[], 1 -> RandomColor[],
             3 -> RandomColor[], 4 → RandomColor[], 5 -> RandomColor[],
             6 -> RandomColor[], 7 -> RandomColor[]}, Frame → False]]
       data8TC[n_Integer, W_Integer, H_Integer] := Table[gen8TC[i, W, H] → i,
         {i, RandomInteger[73 786 976 294 838 206 463, n]}]
```

## Network XIII - Two convolutions, dropout on linear only, BatchNorm

```
In[*]:= netECA13 = netSevenCC512drop[128, 128]
                                               image
Out[*]= NetChain
                             Output port:
                              Number of layers:
```

#### In[\*]:= NetInformation[netECA13, "MXNetNodeGraphPlot"]



#### In[\*]:= NetInformation[netECA13, "SummaryGraphic"]



```
In[@]:= dataECA13 = dataC[128, 128, 8192];
```

In[@]:= dataTotalistic2BigC13 = genData2r2C[128, 128, 1024];

In[@]:= dataTotalistic3BigC13 = data3T2C[128, 128, 1024];

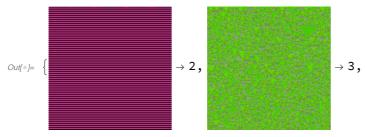
In[\*]:= dataTotalistic4BigC13 = data4TC[128, 128, 1024];

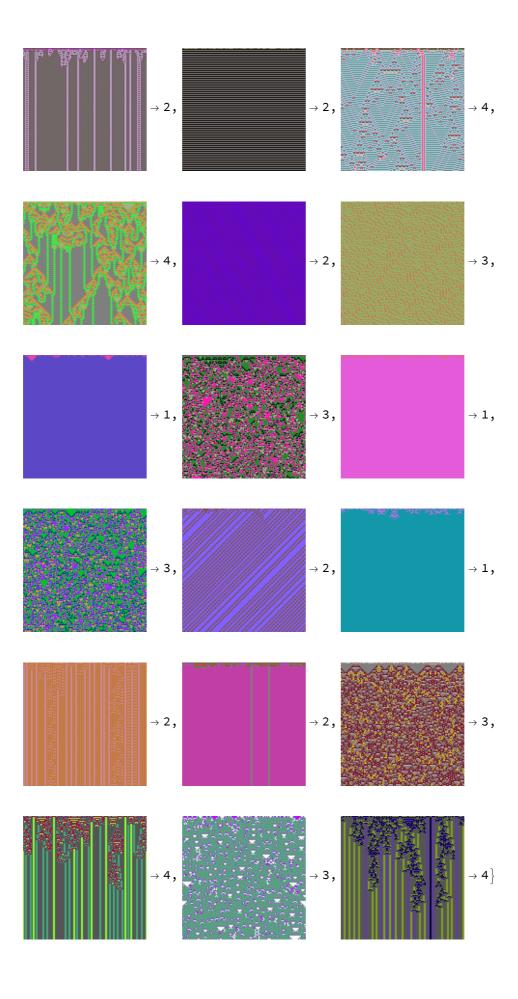
In[@]:= dataTotalistic5BigC13 = genData5TCC[128, 128, 4096];

In[@]:= fullTrainingBigC13 = Join[dataECA13, dataTotalistic2BigC13, dataTotalistic3BigC13, dataTotalistic4BigC13, dataTotalistic5BigC13]; Length[fullTrainingBigC13]

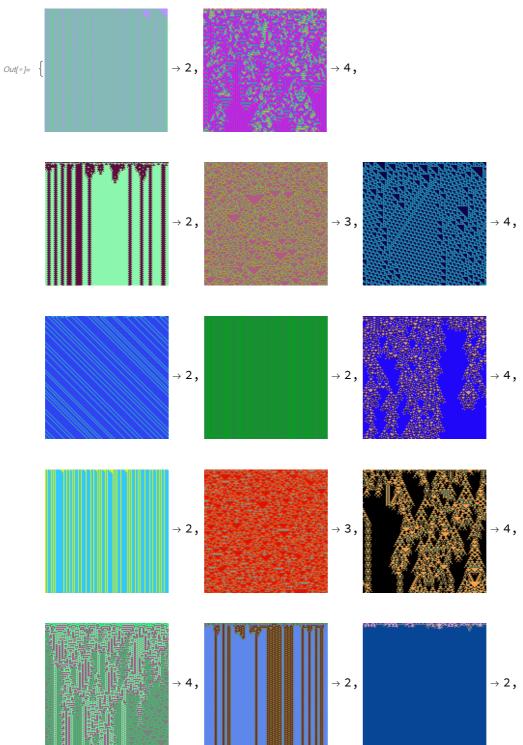
Out[\*]= 26624

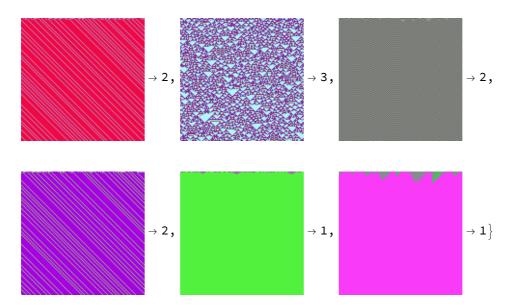
## In[\*]:= RandomSample[fullTrainingBigC13, 20]





# hn[\*]:= RandomSample[fullTrainingBigC13, 20]

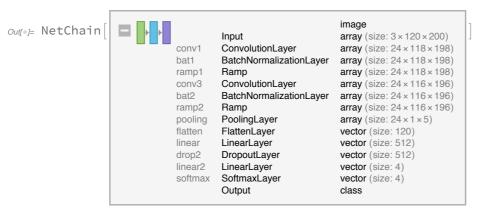




In[\*]:= dir = SetDirectory[NotebookDirectory[]]

Out[\*]= /Users/thorsilver/Downloads/Wolfram notebooks

#### In[@]:= netECA12 = Import["netECA12-r12.wlnet"]



## In[\*]:= netECA13 = NetTrain[netECA13, fullTrainingBigC13, MaxTrainingRounds → 20, BatchSize → 256 \* 4, TargetDevice → "CPU", TrainingProgressCheckpointing → {"Directory", dir}]



#### In[@]:= netECA13 = Import["netECA13-r20.wlnet"]

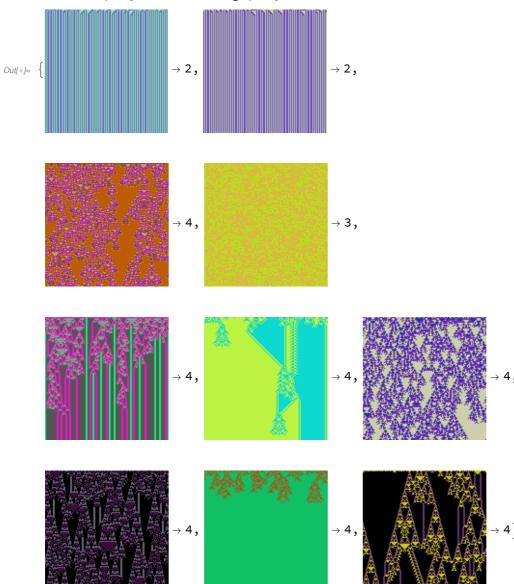


```
In[*]:= netECA13 = NetTrain[netECA13, fullTrainingBigC13,
       MaxTrainingRounds → 20, BatchSize → 256 * 4, TargetDevice → "CPU",
       TrainingProgressCheckpointing → {"Directory", dir}]
                                         image
                          Input port:
Out[*]= NetChain
                          Output port:
                                          class
                          Number of layers:
                                          12
```

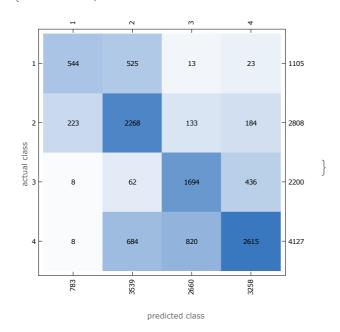
## Generate test data for Network XIII

```
In[*]:= testDataECABigC = dataC[128, 128, 1024];
    testData2TBigC = genData2r2C[128, 128, 1024];
    testData3TBigC = data3T2C[128, 128, 1024];
    testData4TBigC = data4TC[128, 128, 1024];
    testData5TBigC = genData5TCC[128, 128, 1024];
    fullTestSetBigC = Join[testDataECABigC,
        testData2TBigC, testData3TBigC, testData4TBigC, testData5TBigC];
    Length[fullTestSetBigC]
Out[ • ]= 10 240
```

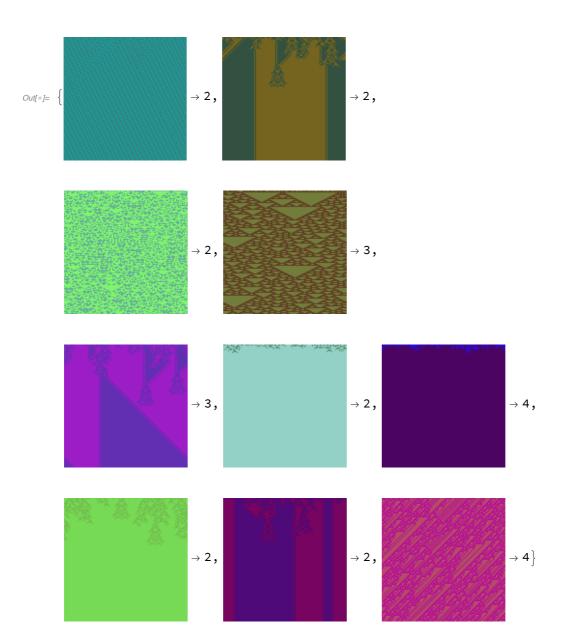
/// // RandomSample[fullTestSetBigC, 10]

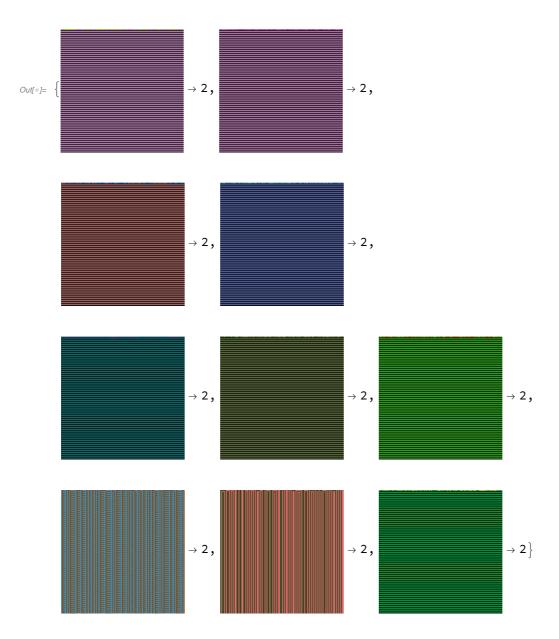


```
In[*]:= NetMeasurements[netECA13, fullTestSetBigC,
         {"Accuracy", "Precision", "ConfusionMatrixPlot"}]
\textit{Out[0]} = \left\{0.69541, \; \langle \, \big| \, 1 \rightarrow 0.694764, \, 2 \rightarrow 0.640859, \, 3 \rightarrow 0.636842, \, 4 \rightarrow 0.80264 \, \big| \, \rangle \right.,
```



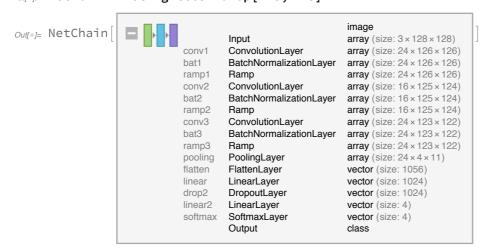
```
In[@]:= entropyImagesBigC = RandomSample[Keys[fullTestSetBigC], 500];
    entropiesBigC = netECA13[entropyImagesBigC, "Entropy"];
    highEntBigC = entropyImagesBigC[[Ordering[entropiesBigC, -10]]];
    lowEntBigC = entropyImagesBigC[[Ordering[entropiesBigC, 10]]];
    Thread[highEntBigC → netECA13[highEntBigC]]
    Thread[lowEntBigC → netECA13[lowEntBigC]]
```





# Network XIV - BatchNorm, 1024 linear, dropout

## In[\*]:= netECA14 = netEightCC512drop[128, 128]

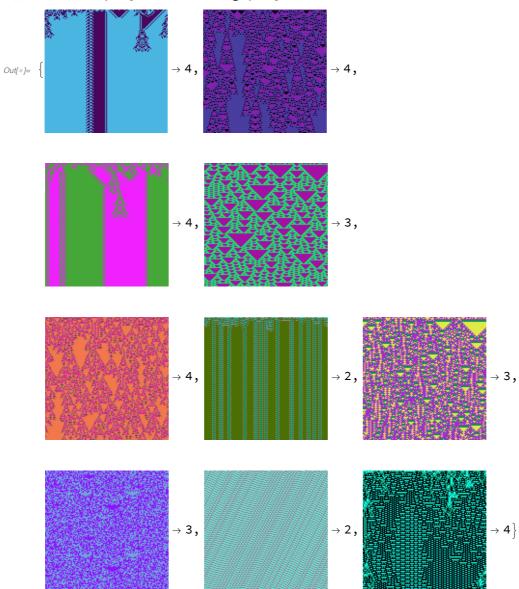


```
netECA14 = NetTrain[netECA14, fullTrainingBigC13,
         MaxTrainingRounds → 20, BatchSize → 256 * 4, TargetDevice → "CPU",
         TrainingProgressCheckpointing → {"Directory", dir}]
In[*]:= dir = SetDirectory[NotebookDirectory[]]
Out[*]= /Users/thorsilver/Downloads/Wolfram notebooks
In[*]:= netECA14 = Import["netECA14-r20.wlnet"]
Out[ ]= NetChain
                                                                array (size: 3 x 128 x 128)
                                         Input
                                                                array (size: 24 × 126 × 126)
                                         ConvolutionLaver
                                 conv1
                                                                array (size: 24 x 126 x 126)
                                         BatchNormalizationLayer
                                bat1
                                 ramp1
                                         Ramp
                                                                array (size: 24 x 126 x 126)
                                                                array (size: 16 x 125 x 124)
                                 conv2
                                         ConvolutionLayer
                                         BatchNormalizationLayer array (size: 16 x 125 x 124)
                                 bat2
                                ramp2
                                         Ramp
                                                                array (size: 16 x 125 x 124)
                                                                array (size: 24 x 123 x 122)
                                         ConvolutionLayer
                                conv3
                                         BatchNormalizationLayer array (size: 24 x 123 x 122)
                                bat3
                                 ramp3
                                         Ramp
                                                                array (size: 24 x 123 x 122)
                                 pooling
                                         PoolingLayer
                                                                array (size: 24 × 4 × 11)
                                 flatten
                                                                vector (size: 1056)
                                         FlattenLayer
                                 linear
                                         LinearLayer
                                                                vector (size: 1024)
                                                                vector (size: 1024)
                                drop2
                                         DropoutLayer
                                linear2
                                         LinearLayer
                                                                vector (size: 4)
                                 softmax
                                         SoftmaxLayer
                                                                vector (size: 4)
```

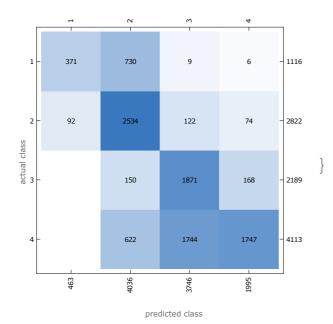
## Generating test data for Network XIV

```
In[*]:= testDataECABigC = dataC[128, 128, 1024];
     testData2TBigC = genData2r2C[128, 128, 1024];
     testData3TBigC = data3T2C[128, 128, 1024];
    testData4TBigC = data4TC[128, 128, 1024];
     testData5TBigC = genData5TCC[128, 128, 1024];
     fullTestSetBigC = Join[testDataECABigC,
        testData2TBigC, testData3TBigC, testData4TBigC, testData5TBigC];
    Length[fullTestSetBigC]
Out[ • ]= 10 240
```

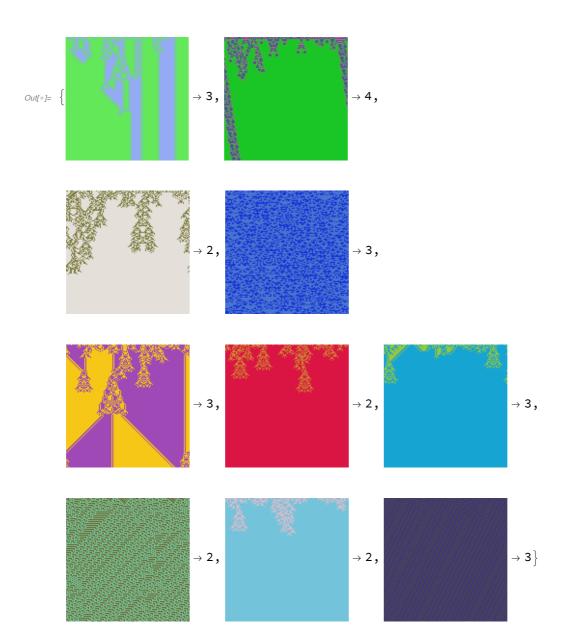
# /// // RandomSample[fullTestSetBigC, 10]

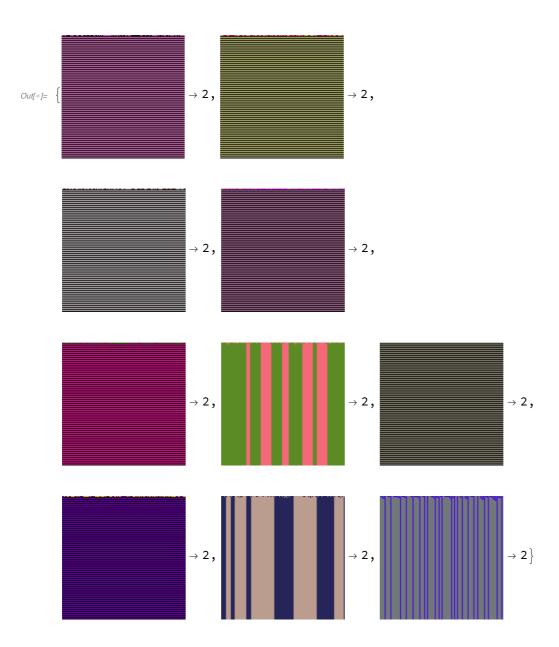


```
In[*]:= NetMeasurements[netECA14, fullTestSetBigC,
          {"Accuracy", "Precision", "ConfusionMatrixPlot"}]
\textit{Out[0]} = \left\{ \text{0.637012, } \langle \left| \text{1} \rightarrow \text{0.801296, 2} \rightarrow \text{0.627849, 3} \rightarrow \text{0.499466, 4} \rightarrow \text{0.875689} \right| \right\},
```



```
In[@]:= entropyImagesBigC = RandomSample[Keys[fullTestSetBigC], 500];
    entropiesBigC = netECA14[entropyImagesBigC, "Entropy"];
    highEntBigC = entropyImagesBigC[[Ordering[entropiesBigC, -10]]];
    lowEntBigC = entropyImagesBigC[[Ordering[entropiesBigC, 10]]];
    Thread[highEntBigC → netECA14[highEntBigC]]
    Thread[lowEntBigC → netECA14[lowEntBigC]]
```





# Network XV - Transfer learning with pre-trained image recognition net (VGG-16)

In[\*]:= netECA15 = NetModel["VGG-16 Trained on ImageNet Competition Data"]

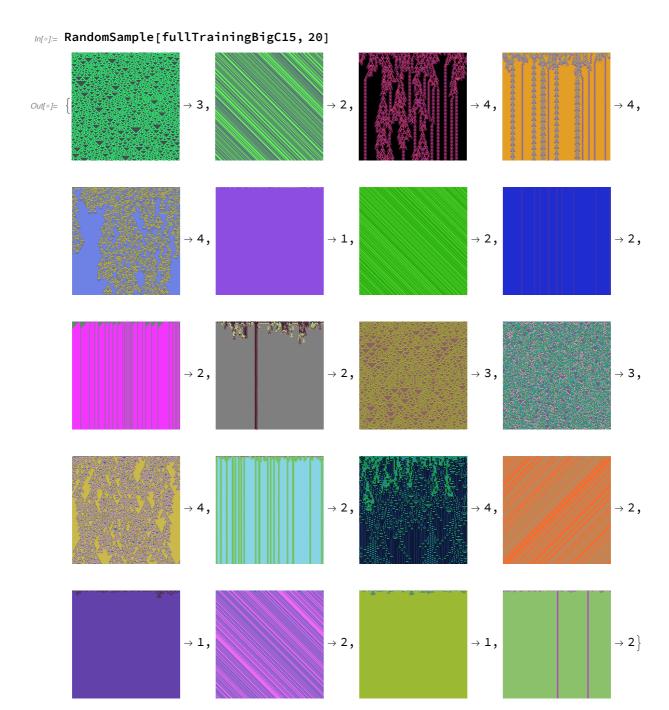
```
image
Out[•]= NetChain
                                                   Input
                                                                       array (size: 3 × 224 × 224)
                                                  ConvolutionLayer
                                                                       array (size: 64 x 224 x 224)
                                                                       array (size: 64 x 224 x 224)
                                       relu1_1
                                                   Ramp
                                                   ConvolutionLayer
                                                                       array (size: 64 × 224 × 224)
                                       conv1 2
                                                                       array (size: 64 x 224 x 224)
                                       relu1 2
                                                   Ramp
                                       pool1
                                                   PoolingLayer
                                                                       array (size: 64 x 112 x 112)
                                       conv2_1
                                                   ConvolutionLayer
                                                                       array (size: 128 x 112 x 112)
                                       relu2_1
                                                   Ramp
                                                                       array (size: 128 x 112 x 112)
                                       conv2 2
                                                   ConvolutionLayer
                                                                       array (size: 128 x 112 x 112)
                                       relu2_2
                                                   Ramp
                                                                       array (size: 128 x 112 x 112)
                                                                       array (size: 128 × 56 × 56)
                                                   PoolingLayer
                                       pool2
                                       conv3 1
                                                  ConvolutionLayer
                                                                      array (size: 256 x 56 x 56)
                                       relu3_1
                                                   Ramp
                                                                       array (size: 256 x 56 x 56)
                                       conv3_2
                                                   ConvolutionLayer
                                                                       array (size: 256 x 56 x 56)
                                                                       array (size: 256 × 56 × 56)
                                       relu3_2
                                                   Ramp
                                                   ConvolutionLayer
                                                                      array (size: 256 x 56 x 56)
                                       conv3 3
                                                                       array (size: 256 × 56 × 56)
                                       relu3 3
                                                   Ramp
                                                                       array (size: 256 × 28 × 28)
                                       pool3
                                                   PoolingLayer
                                       conv4 1
                                                   ConvolutionLayer
                                                                      array (size: 512 x 28 x 28)
                                       relu4_1
                                                                       array (size: 512 x 28 x 28)
                                       conv4_2
                                                   ConvolutionLayer
                                                                       array (size: 512 x 28 x 28)
                                       relu4_2
                                                                       array (size: 512 x 28 x 28)
                                                   Ramp
                                                   ConvolutionLaver
                                                                      arrav (size: 512 x 28 x 28)
                                       conv4 3
                                       relu4 3
                                                   Ramp
                                                                       array (size: 512 x 28 x 28)
                                       pool4
                                                   PoolingLayer
                                                                       array (size: 512 × 14 × 14)
                                                  ConvolutionLayer
                                       conv5_1
                                                                       array (size: 512 x 14 x 14)
                                       relu5_1
                                                                       array (size: 512 x 14 x 14)
                                                   Ramp
                                       conv5_2
                                                   ConvolutionLayer
                                                                       array (size: 512 x 14 x 14)
                                       relu5 2
                                                   Ramp
                                                                       array (size: 512 x 14 x 14)
                                                  ConvolutionLayer
                                                                      array (size: 512 × 14 × 14)
                                       conv5 3
                                       relu5 3
                                                   Ramp
                                                                       array (size: 512 x 14 x 14)
                                       pool5
                                                   PoolingLayer
                                                                       array (size: 512 × 7 × 7)
                                       flatten_0
                                                   FlattenLayer
                                                                       vector (size: 25088)
                                                   LinearLayer
                                                                      vector (size: 4096)
                                       relu6
                                                                       vector (size: 4096)
                                                   Ramp
                                                   .
DropoutLayer
                                       drop6
                                                                       vector (size: 4096)
                                       fc7
                                                   LinearLayer
                                                                       vector (size: 4096)
                                       relu7
                                                   Ramp
                                                                       vector (size: 4096)
                                                   DropoutLayer
                                       drop7
                                                                       vector (size: 4096)
                                                   LinearLayer
                                                                       vector (size: 1000)
                                                   SoftmaxLaver
                                                                       vector (size: 1000)
                                       prob
                                                   Output
                                                                       class
```

Number of lavers:

```
In[@]:= subNet = NetTake[netECA15, {"conv1_1", "flatten_0"}]
                           Input port:
                                           image
Out[ ]= NetChain
                           Output port:
                                           vector (size: 25088)
                           Number of layers:
In[@]:= joinedNet = NetJoin[subNet,
        NetChain@<|"linear_new" → LinearLayer[1024], "linear_out" → LinearLayer[4],
          "prob" → SoftmaxLayer[]|>, "Output" → NetDecoder[{"Class", Range[1, 4]}]]
                            Input port:
                                            image
Out[•]= NetChain
                            Output port:
                                            class
```

35

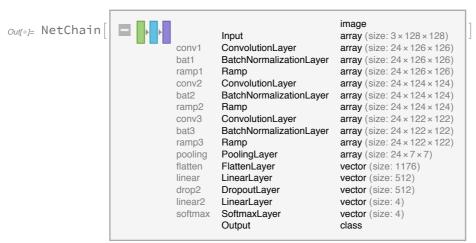
```
In[*]:= netECA15final =
      NetPrepend[joinedNet, {"augment" → ImageAugmentationLayer[{224, 224}]},
       "Input" → NetExtract[joinedNet, "Input"]]
                                         image
                          Input port:
Out[*]= NetChain
                                         class
                          Number of layers:
In[@]:= dataECA15 = dataC[224, 224, 8192];
In[*]:= dataTotalistic2BigC15 = genData2r2C[224, 224, 1024];
In[*]:= dataTotalistic3BigC15 = data3T2C[224, 224, 512];
In[*]:= dataTotalistic4BigC15 = data4TC[224, 224, 512];
In[*]:= dataTotalistic5BigC15 = genData5TCC[224, 224, 1024];
In[@]:= fullTrainingBigC15 = Join[dataECA15, dataTotalistic2BigC15,
        dataTotalistic3BigC15, dataTotalistic4BigC15, dataTotalistic5BigC15];
     Length[fullTrainingBigC15]
Out[\ \ \ \ \ ]=\ 16384
```



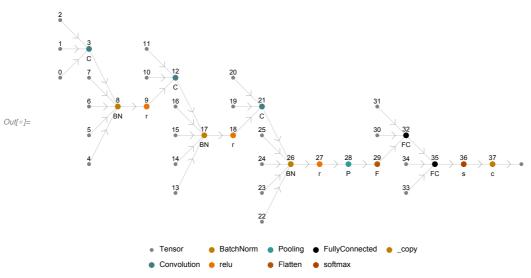
In[\*]:= netECA15final = NetTrain[netECA15final, fullTrainingBigC15, MaxTrainingRounds → 5, BatchSize → 256 \* 4, TargetDevice → "CPU", TrainingProgressCheckpointing → {"Directory", dir}, LearningRateMultipliers  $\rightarrow$  {"linear\_new"  $\rightarrow$  1, "linear\_out"  $\rightarrow$  1, \_  $\rightarrow$  0}]

# Network XVI - Three convolutions, dropout on linear only, BatchNorm

### In[\*]:= netECA16 = netNineCC512drop[128, 128]



#### In[\*]:= NetInformation[netECA16, "MXNetNodeGraphPlot"]



#### In[•]:= NetInformation[netECA16, "SummaryGraphic"]

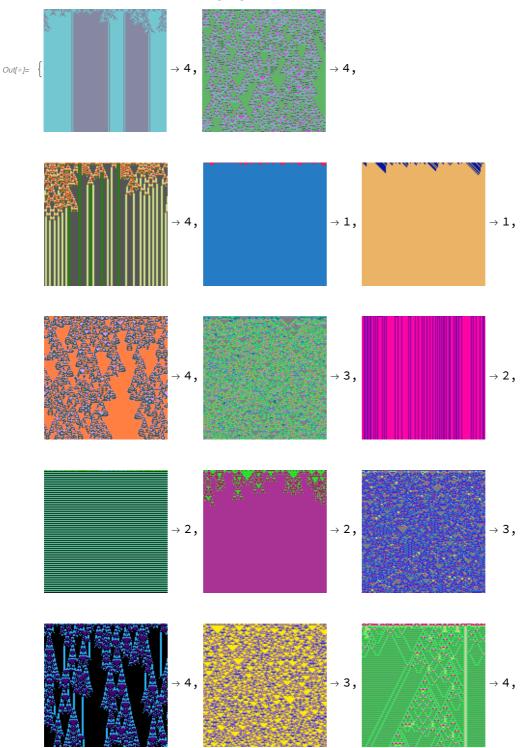
```
BN
                                                                                                                     BN
Out[ • ]=
           Input
                        conv1
                                      bat1
                                                  ramp1
                                                                             bat2
```

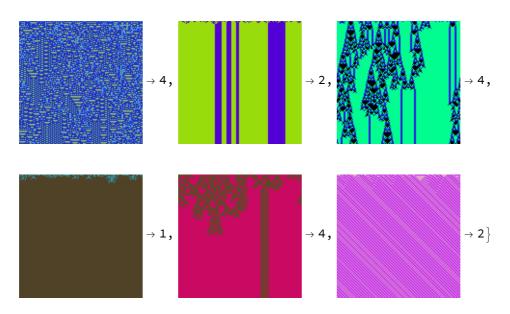
```
In[@]:= dataECA16 = dataC[128, 128, 8192];
In[*]:= dataTotalistic2BigC16 = genData2r2C[128, 128, 1024];
In[*]:= dataTotalistic3BigC16 = data3T2C[128, 128, 1024];
In[*]:= dataTotalistic4BigC16 = data4TC[128, 128, 1024];
In[*]:= dataTotalistic5BigC16 = genData5TCC[128, 128, 4096];
```

# In[@]:= fullTrainingBigC16 = Join[dataECA16, dataTotalistic2BigC16, dataTotalistic3BigC16, dataTotalistic4BigC16, dataTotalistic5BigC16]; Length[fullTrainingBigC16]

Out[\*]= 26624

## In[\*]:= RandomSample[fullTrainingBigC16, 20]





In[\*]:= dir = SetDirectory[NotebookDirectory[]]

Out[\*]= /Users/thorsilver/Downloads/Wolfram notebooks

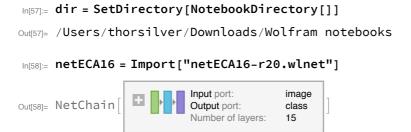
In[\*]:= netECA16 = NetTrain[netECA16, fullTrainingBigC16, MaxTrainingRounds → 20, BatchSize → 256, TargetDevice → "CPU", TrainingProgressCheckpointing → {"Directory", dir}]



netECA16 = Import["netECA16-r20.wlnet"]

netECA16 = NetTrain[netECA16, fullTrainingBigC16, MaxTrainingRounds → 20, BatchSize → 256 \* 4, TargetDevice → "CPU", TrainingProgressCheckpointing → {"Directory", dir}]

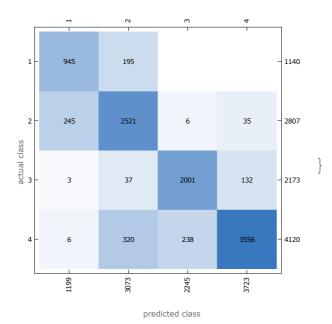
## Generate test data for Network XVI



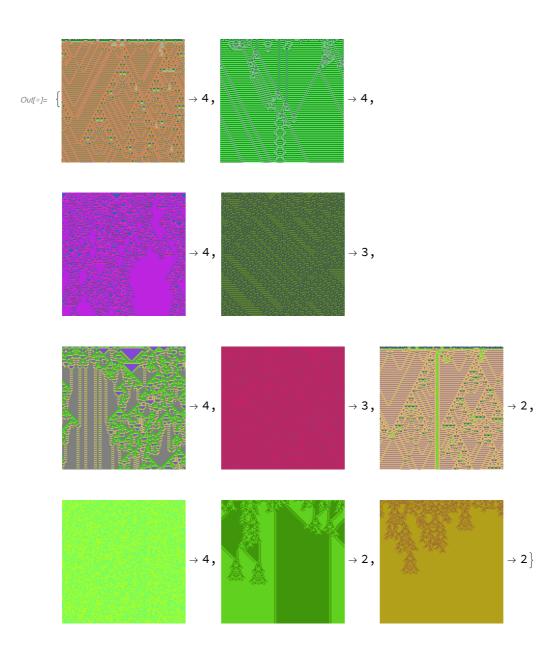
```
In[*]:= testDataECABigC = dataC[128, 128, 1024];
     testData2TBigC = genData2r2C[128, 128, 1024];
     testData3TBigC = data3T2C[128, 128, 1024];
     testData4TBigC = data4TC[128, 128, 1024];
     testData5TBigC = genData5TCC[128, 128, 1024];
     fullTestSetBigC = Join[testDataECABigC,
         testData2TBigC, testData3TBigC, testData4TBigC, testData5TBigC];
     Length[fullTestSetBigC]
Out[*]= 10 240
In[*]:= RandomSample[fullTestSetBigC, 10]
                             \rightarrow 1,

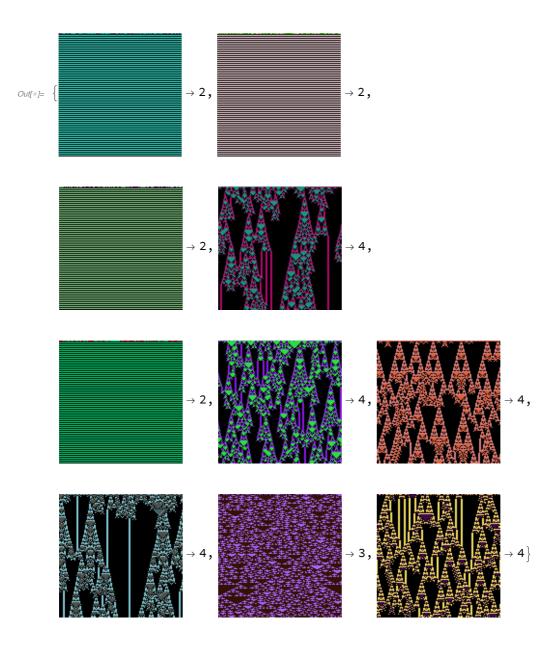
ightarrow 3,
                                                        \rightarrow 4,
                                                                                   \rightarrow 2,
                             \rightarrow 2,
                                                        \rightarrow 1,
                                                        \rightarrow 2,
                             \rightarrow 1,
```

```
In[*]:= NetMeasurements[netECA16, fullTestSetBigC,
          {"Accuracy", "Precision", "ConfusionMatrixPlot"}]
\textit{Out[0]} = \left\{ \text{0.881152, } \langle \left| 1 \rightarrow \text{0.788157, 2} \rightarrow \text{0.820371, 3} \rightarrow \text{0.891314, 4} \rightarrow \text{0.955144} \right| \right\},
```



```
In[@]:= entropyImagesBigC = RandomSample[Keys[fullTestSetBigC], 500];
    entropiesBigC = netECA16[entropyImagesBigC, "Entropy"];
    highEntBigC = entropyImagesBigC[[Ordering[entropiesBigC, -10]]];
    lowEntBigC = entropyImagesBigC[[Ordering[entropiesBigC, 10]]];
    Thread[highEntBigC → netECA16[highEntBigC]]
    Thread[lowEntBigC → netECA16[lowEntBigC]]
```

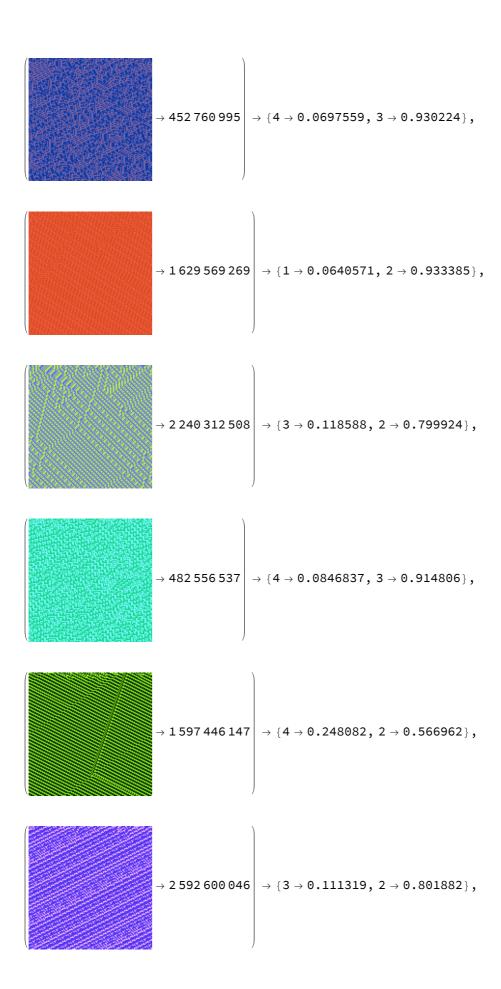


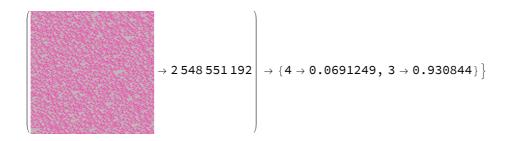


Testing Network XVI on unseen CA rule spaces

# 2-colour non-totalistic, range 2

```
In[@]:= test4Data2kr2C16 = datak2r2C[128, 128, 8];
     Thread[
       test4Data2kr2C16 → netECA16[Keys@test4Data2kr2C16, {"TopProbabilities", 2}]]
                               \rightarrow 2 190 952 680 \rightarrow {4 \rightarrow 0.00828426, 3 \rightarrow 0.991715},
Out[ • ]= {
```

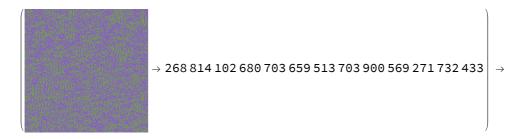




# 2-colour non-totalistic, range 3

```
In[81]:= test4Data2kr3C16 = datak2r3NT[128, 128, 8];
      Thread[
       test4Data2kr3C16 → netECA16[Keys@test4Data2kr3C16, {"TopProbabilities", 2}]]
                               \rightarrow 192\,512\,040\,898\,603\,851\,305\,563\,821\,357\,837\,920\,322 \quad \rightarrow
Out[82]=
```

 $\{3 \rightarrow 0.277165, 4 \rightarrow 0.649887\},$ 



 $\{\, 4 \,\rightarrow\, \text{0.410444}\,,\; 3 \,\rightarrow\, \text{0.585722}\,\}$  ,



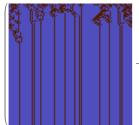
 $\{4 \rightarrow 0.223487, 3 \rightarrow 0.776512\},$ 



```
\{3 \rightarrow 0.0605962, 4 \rightarrow 0.938855\}
```



 $\{4 \rightarrow 0.0598654, 3 \rightarrow 0.940094\}$ ,

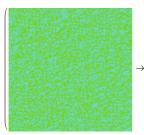


 $\{4 \rightarrow 0.354784, 2 \rightarrow 0.643357\},$ 



 $\rightarrow 327\,367\,588\,377\,016\,075\,437\,244\,034\,595\,798\,938\,936 \ | \ \rightarrow \$ 

 $\{3 \rightarrow 0.0133918, 4 \rightarrow 0.986511\}$ 

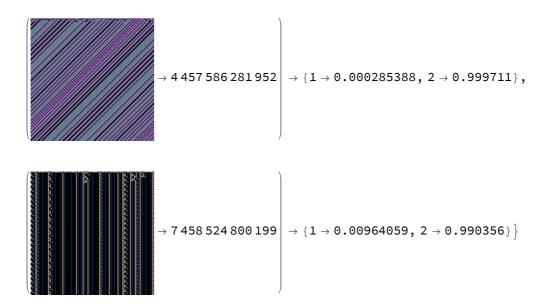


ightarrow 64 210 583 158 946 454 226 752 791 209 536 621 761  $\mid$  ightarrow

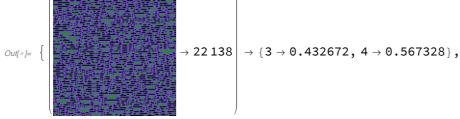
 $\{3 \rightarrow 0.327669, 4 \rightarrow 0.672036\}$ 

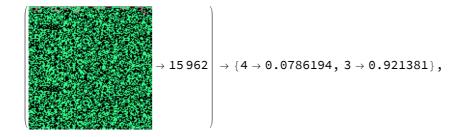
# 3-colour non-totalistic, range 1

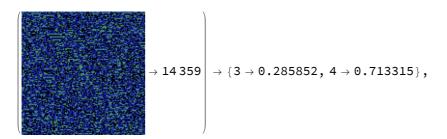
In[89]:= test4Data3kr1C16 = datak3r1NT[128, 128, 8]; Thread[ test4Data3kr1C16 → netECA16[Keys@test4Data3kr1C16, {"TopProbabilities", 2}]]



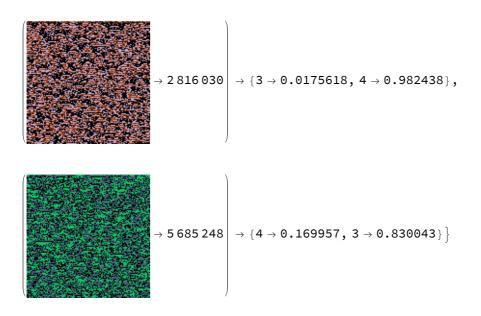
```
In[*]:= test4Data3kr2C16 = datak3r2C[128, 128, 8];
    Thread[
     test4Data3kr2C16 → netECA16[Keys@test4Data3kr2C16, {"TopProbabilities", 2}]]
```





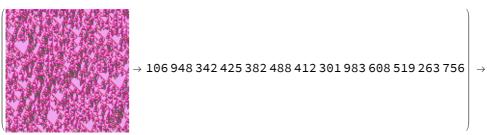


```
In[*]:= test4Data3kr3C16 = datak3r3C[128, 128, 8];
    Thread[
     test4Data3kr3C16 → netECA16[Keys@test4Data3kr3C16, {"TopProbabilities", 2}]]
```

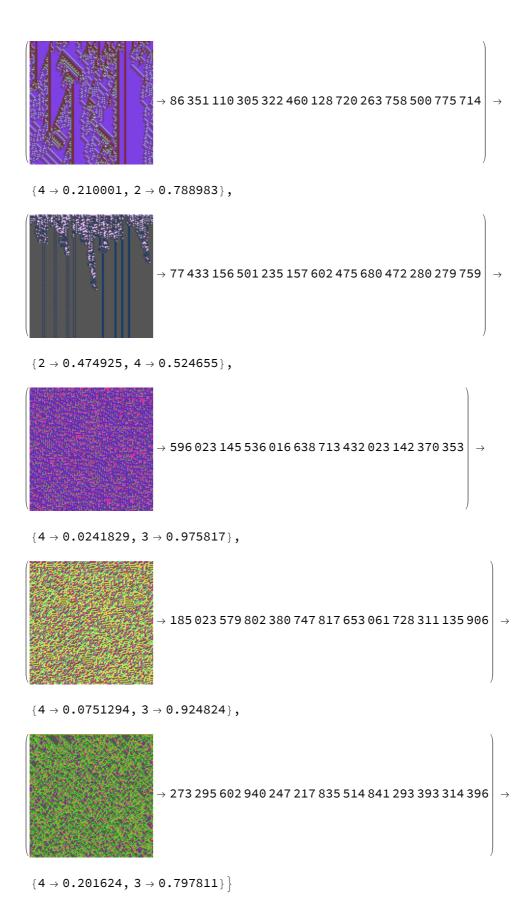


```
In[93]:= test4Data4kr1C16 = datak4r1NT[128, 128, 8];
       Thread[
         test4Data4kr1C16 → netECA16[Keys@test4Data4kr1C16, {"TopProbabilities", 2}]]
                                     \rightarrow \, 24\, 580\, 558\, 256\, 129\, 418\, 488\, 831\, 337\, 020\, 120\, 596\, 557 \, \Big| \, \, \rightarrow \,
Out[94]=
           \{4 \rightarrow 0.0591881, 3 \rightarrow 0.940812\},\

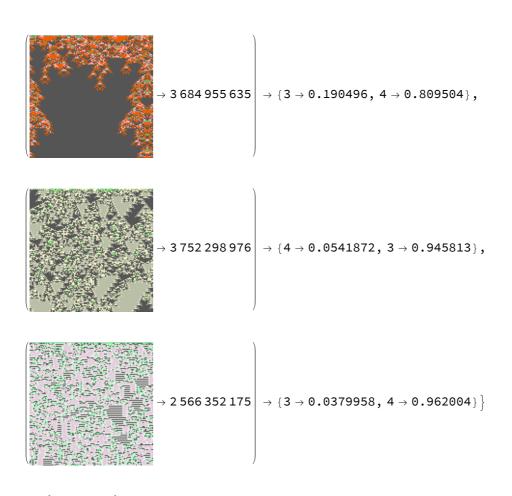
ightarrow 320 024 124 365 477 690 559 134 299 487 833 253 915 
ightarrow
           \{4 \rightarrow 0.0960659, 3 \rightarrow 0.903922\},\
```



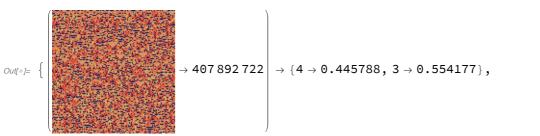
 $\{\, 4 \,\rightarrow\, \text{0.112148}\,,\,\, 3 \,\rightarrow\, \text{0.887845}\,\}$  ,

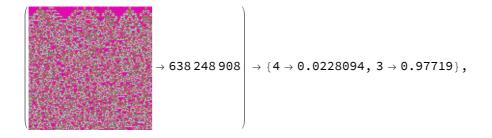


### In[\*]:= test4Data4kr2C16 = datak4r2C[128, 128, 8]; Thread[ test4Data4kr2C16 → netECA16[Keys@test4Data4kr2C16, {"TopProbabilities", 2}]] $\rightarrow$ 1806102772 $\rightarrow$ {4 $\rightarrow$ 0.0919674, 3 $\rightarrow$ 0.908033}, Out[ • ]= { $\rightarrow$ 1872979601 $\Big| \rightarrow \{4\rightarrow 0.349808\,,\, 3\rightarrow 0.650192\}$ , $\rightarrow$ 3 186 088 319 $\rightarrow$ {4 $\rightarrow$ 0.0374994, 3 $\rightarrow$ 0.962501}, $\rightarrow$ 271 280 936 $\rightarrow$ {4 $\rightarrow$ 0.000901956, 3 $\rightarrow$ 0.999098}, $\rightarrow$ 1898315512 $\rightarrow$ {4 $\rightarrow$ 0.00981637, 3 $\rightarrow$ 0.990184},

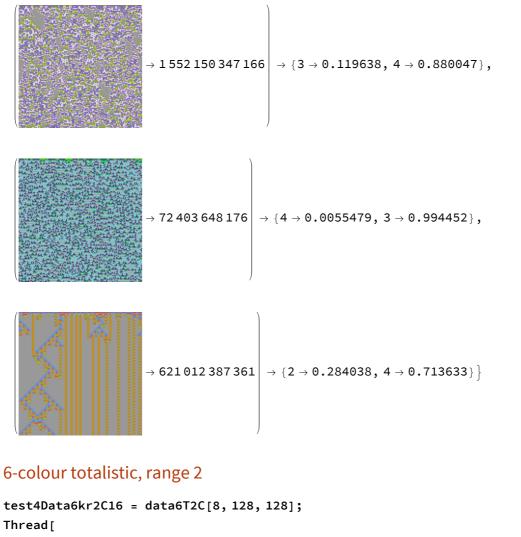


```
In[*]:= test4Data5kr1C16 = data5T2C[8, 128, 128];
    Thread[
     test4Data5kr1C16 → netECA16[Keys@test4Data5kr1C16, {"TopProbabilities", 2}]]
```



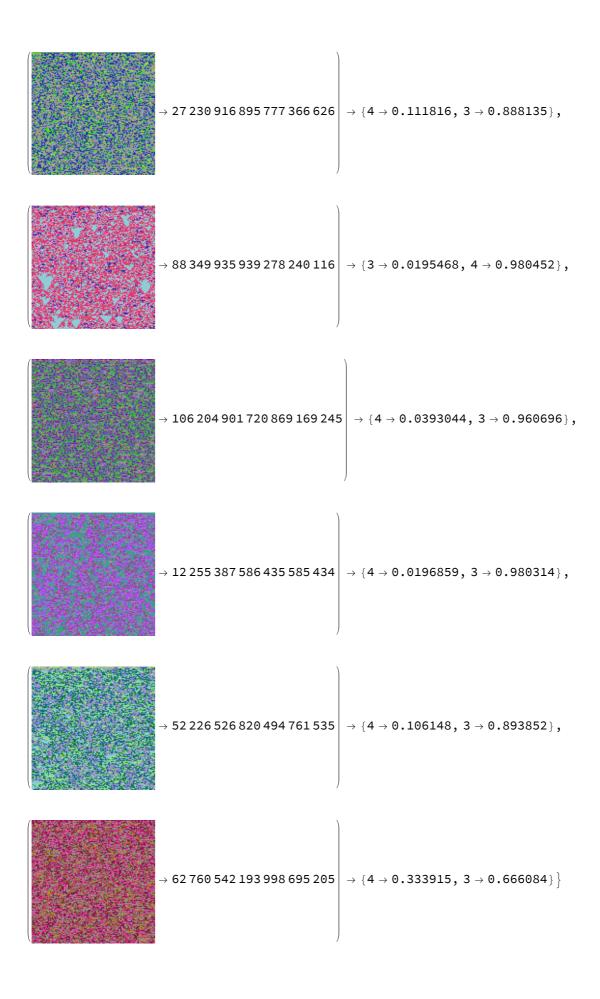


In[\*]:= test4Data6kr1C16 = data6TC[8, 128, 128]; test4Data6kr1C16 → netECA16[Keys@test4Data6kr1C16, {"TopProbabilities", 2}]]  $\rightarrow$  930 044 739 883  $\rightarrow$  {4  $\rightarrow$  0.0671154, 3  $\rightarrow$  0.932882}, Out[ • ]= { ightarrow 1 609 022 451 969 ightarrow  $\{3 o 0.328033, 4 o 0.671644\},$  $\rightarrow$  2498882479071  $\rightarrow$  {3  $\rightarrow$  0.00867874, 4  $\rightarrow$  0.991315},  $\rightarrow \ 250\ 248\ 309\ 401 \ | \ \rightarrow \ \{4 \rightarrow 0.0365648\ ,\ 3 \rightarrow 0.963435\}\ ,$  $\rightarrow 2382182512148 \rightarrow \{1 \rightarrow 0.0000910832, 2 \rightarrow 0.999907\},$ 



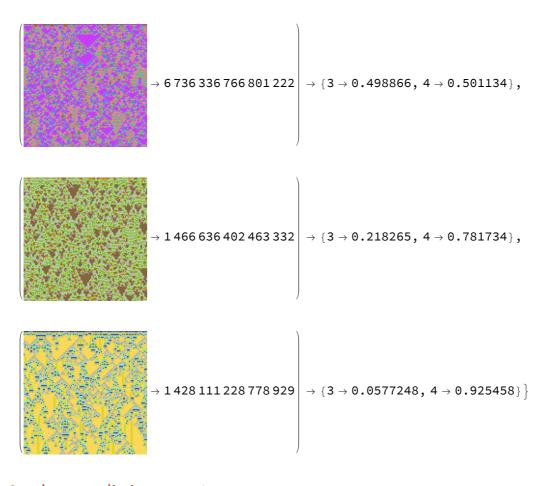
```
In[*]:= test4Data6kr2C16 = data6T2C[8, 128, 128];
     Thread[
       test4Data6kr2C16 → netECA16[Keys@test4Data6kr2C16, {"TopProbabilities", 2}]]

ightarrow 
ightarrow 68 918 261 516 486 585 431 \Big| 
ightarrow {3 
ightarrow 0.389806, 4 
ightarrow 0.607333},
                           \rightarrow 81 547 637 786 331 552 954 \rightarrow {3 \rightarrow 0.380046, 4 \rightarrow 0.619953},
```

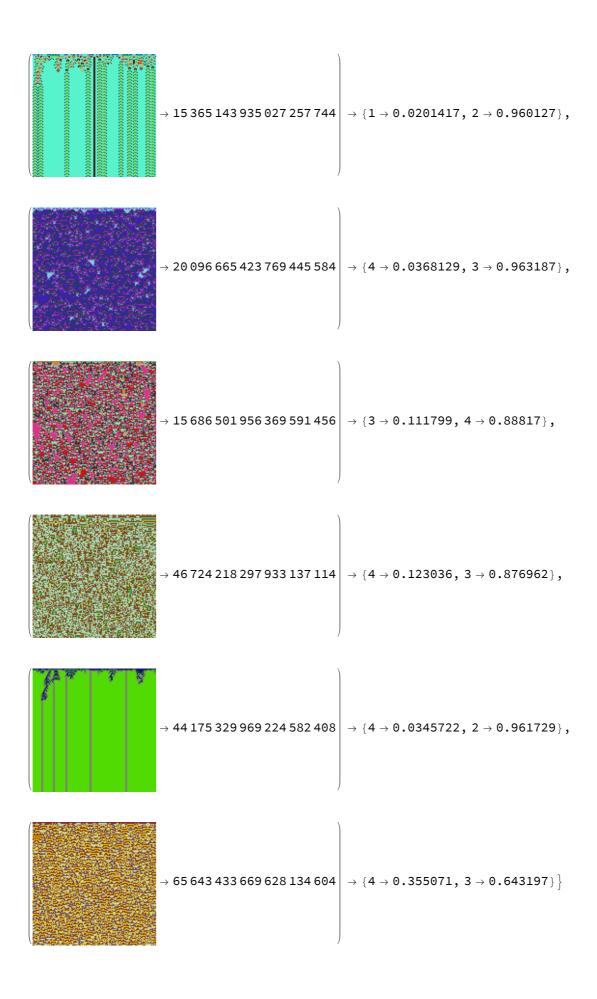


In[\*]:= test4Data7kr1C16 = data7TC[8, 128, 128]; test4Data7kr1C16 → netECA16[Keys@test4Data7kr1C16, {"TopProbabilities", 2}]]  $\rightarrow$  4083567256423497  $\rightarrow$  {3  $\rightarrow$  0.393178, 4  $\rightarrow$  0.491438}, Out[ • ]= {  $\rightarrow$  10 897 379 800 108 189  $| \rightarrow \{3 \rightarrow 0.145139, 4 \rightarrow 0.851377\},$  $\rightarrow$  9 696 870 909 078 497  $\rightarrow$  {3  $\rightarrow$  0.0940102, 4  $\rightarrow$  0.905966},  $\rightarrow$  6 997 538 642 841 063  $\rightarrow$  {4  $\rightarrow$  0.105674, 3  $\rightarrow$  0.894326},  $\rightarrow$  6 333 682 656 512 326  $\rightarrow$  {4  $\rightarrow$  0.295264, 3  $\rightarrow$  0.704461},

# In[\*]:= test4Data7kr1C16 = data7TC[8, 128, 128]; Thread[ test4Data7kr1C16 → netECA16[Keys@test4Data7kr1C16, {"TopProbabilities", 2}]] $\rightarrow 203595605949565 \rightarrow \{4 \rightarrow 0.190292, 3 \rightarrow 0.809707\},$ Out[ • ]= { $\rightarrow$ 10 033 010 686 584 540 $\rightarrow$ {4 $\rightarrow$ 0.156969, 3 $\rightarrow$ 0.843031}, $\rightarrow$ 7 330 900 949 575 011 $\rightarrow$ {4 $\rightarrow$ 0.132693, 3 $\rightarrow$ 0.866858}, $\rightarrow$ 2 943 550 672 701 792 $\rightarrow$ {3 $\rightarrow$ 0.116083, 4 $\rightarrow$ 0.883885}, $\rightarrow$ 3 468 324 643 172 098 $\rightarrow$ {4 $\rightarrow$ 0.0991377, 3 $\rightarrow$ 0.900457},



```
|n[*]:= test4Data8kr1C16 = data8TC[8, 128, 128];
      Thread[
        test4Data8kr1C16 → netECA16[Keys@test4Data8kr1C16, {"TopProbabilities", 2}]]
                                  \rightarrow 42 020 590 261 131 320 575 \mid \rightarrow \{4 \rightarrow 0.0117574, 3 \rightarrow 0.988243\},
Out[ • ]= {
                                   \rightarrow 12 610 707 415 579 864 791 | \rightarrow \{4 \rightarrow 0.0178909, 3 \rightarrow 0.982109\},
```



# In[@]:= test4Data8kr1C16 = data8TC[8, 128, 128]; Thread[ test4Data8kr1C16 → netECA16[Keys@test4Data8kr1C16, {"TopProbabilities", 2}]] $\Rightarrow$ 36 507 401 174 866 450 102 $\mid$ $\Rightarrow$ {3 $\Rightarrow$ 0.244239, 4 $\Rightarrow$ 0.75576}, Out[ • ]= { $\rightarrow 36\,629\,210\,896\,102\,279\,370 \, \Big| \, \rightarrow \, \{4 \rightarrow 0.2431, \, 3 \rightarrow 0.753856\} \, ,$ $\rightarrow$ 50 599 399 972 817 837 073 $\rightarrow$ {4 $\rightarrow$ 0.24465, 3 $\rightarrow$ 0.75535}, $\rightarrow$ 62 920 725 793 807 162 408 $\rightarrow$ {4 $\rightarrow$ 0.240564, 3 $\rightarrow$ 0.759435}, $\rightarrow$ 37 059 387 199 693 125 873 $\rightarrow$ {4 $\rightarrow$ 0.0784766, 3 $\rightarrow$ 0.921523},

