

New CA Classifiers (random colours)

Wolfram Classes of ECAs

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

```

In[2]:= RandomRuleC[n_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[n, 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]]

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]}]

```

```
In[6]:= netThreeCC[W_Integer, H_Integer] :=
NetInitialize@NetChain[<|"conv1" → ConvolutionLayer[16, {2, 3}],
 "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]}]]
```

```
In[7]:= netThreeCC1024[W_Integer, H_Integer] :=
NetInitialize@NetChain[<|"conv1" → ConvolutionLayer[16, {2, 3}],
 "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" → 1024, "linear2" → 4, "softmax" → SoftmaxLayer[]|>,
 "Input" → NetEncoder[{"Image", {W, H}}],
 "Output" → NetDecoder[{"Class", Range[1, 4]}]]
```

```
In[8]:= netFourCC512[W_Integer, H_Integer] :=
NetInitialize@NetChain[<|"conv1" → ConvolutionLayer[32, {2, 3}],
 "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]}]]
```

```
In[9]:= netFiveCC512[W_Integer, H_Integer] :=
NetInitialize@NetChain[<|"conv1" → ConvolutionLayer[32, {2, 3}],
 "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]}]]
```

```
In[10]:= netSixCC512drop[W_Integer, H_Integer] :=
NetInitialize@NetChain[<|"drop1" → DropoutLayer[0.2], "conv1" →
ConvolutionLayer[32, {3, 3}], "bat1" → BatchNormalizationLayer[],
 "ramp1" → Ramp, "conv3" → ConvolutionLayer[32, {3, 3}],
 "bat2" → BatchNormalizationLayer[], "ramp2" → 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]}]]
```

```
In[1]:= netSevenCC512drop[W_Integer, H_Integer] :=
NetInitialize@NetChain[<|"conv1" → ConvolutionLayer[24, {3, 3}],
"bat1" → BatchNormalizationLayer[], "ramp1" → Ramp,
"conv3" → ConvolutionLayer[24, {3, 3}],
"bat2" → BatchNormalizationLayer[], "ramp2" → 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]}]]
```

```
In[12]:= netEightCC512drop[W_Integer, H_Integer] :=
NetInitialize@NetChain[<|"conv1" → ConvolutionLayer[24, {3, 3}],
"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]}]]
```

```
In[13]:= netNineCC512drop[W_Integer, H_Integer] :=
NetInitialize@NetChain[<|"conv1" → ConvolutionLayer[24, {3, 3}],
"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]}]]
```

```
In[14]:= netTenCC1024drop[W_Integer, H_Integer] :=
NetInitialize@NetChain[<|"conv1" → ConvolutionLayer[24, {3, 3}],
"bat1" → BatchNormalizationLayer[], "ramp1" → Ramp,
"conv2" → ConvolutionLayer[24, {3, 3}], "bat2" → BatchNormalizationLayer[],
"ramp2" → Ramp, "conv3" → ConvolutionLayer[24, {3, 3}],
"bat3" → BatchNormalizationLayer[], "ramp3" → Ramp,
"conv4" → ConvolutionLayer[24, {3, 3}],
"bat4" → BatchNormalizationLayer[], "ramp4" → Ramp,
"pooling" → PoolingLayer[{H, W} - {12, 12}], "flatten" → FlattenLayer[],
"linear" → 1024, "drop2" → DropoutLayer[0.3], "linear2" → 4,
"softmax" → SoftmaxLayer[]|>, "Input" → NetEncoder[{"Image", {W, H}}],
"Output" → NetDecoder[{"Class", Range[1, 4]}]]
```

```
In[15]:= netElevenCC1024drop[W_Integer, H_Integer] :=
  NetInitialize@NetChain[<|"conv1" → ConvolutionLayer[48, {3, 3}],
    "bat1" → BatchNormalizationLayer[], "ramp1" → Ramp,
    "pooling1" → PoolingLayer[{2, 2}], "conv2" → ConvolutionLayer[24, {3, 3}],
    "bat2" → BatchNormalizationLayer[], "ramp2" → Ramp,
    "pooling2" → PoolingLayer[{2, 2}], "conv3" → ConvolutionLayer[24, {3, 3}],
    "bat3" → BatchNormalizationLayer[], "ramp3" → Ramp,
    "pooling3" → PoolingLayer[{2, 2}], "conv4" → ConvolutionLayer[12, {3, 3}],
    "bat4" → BatchNormalizationLayer[], "ramp4" → Ramp,
    "pooling4" → PoolingLayer[{2, 2}], "flatten" → FlattenLayer[],
    "linear" → 1024, "drop2" → DropoutLayer[0.3], "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)

```
In[16]:= gen3TC[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, {3, 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]]
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)

```
In[18]:= gen4TC[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, {4, 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]]
data4TC[W_Integer, H_Integer, n_Integer] := Table[gen4TC[1004600, W, H] → 4, n]
```

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

```
In[20]:= gen2r2C[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, {2, 1}, 2}, 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]]
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] -> 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)

```
In[26]:= gen5T4C[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, {5, 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]]
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, 1 052 373 865, 455 984 785,
      339 227 109, 1 050 973 846, 513 368 817, 91 315 820, 113 925 357}, n]}]
```

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

```
In[28]:= gen5TC[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, {5, 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]]
data5T4CC[W_Integer, H_Integer, n_Integer] := Table[gen5TC[i, W, H] -> 4,
  {i, RandomChoice[{644 218 533, 491 739 943, 6 889 640, 986 144 962, 1 099 816 682,
    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[
    {525 735 659, 1 022 330 944, 1 007 796 739, 495 633 437, 1 036 827 943}, 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

```
In[33]:= genk2r2C[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, 2, 2}, 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]]
datak2r2C[W_Integer, H_Integer, n_Integer] :=
  Table[genk2r2C[i, W, H] -> i, {i, RandomChoice[Range[0, 4 294 967 295], n]}]
```

k=2, r=3 non-totalistic

```
In[35]:= genk2r3NT[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, 2, 3}, 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]]
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

```
In[37]:= genk3r1NT[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, 3}, 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]]
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

```
In[39]:= genk3r2C[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, {3, 1}, 2}, 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]]
datak3r2C[W_Integer, H_Integer, n_Integer] :=
  Table[genk3r2C[i, W, H] -> i, {i, RandomChoice[Range[0, 177146], n]}]
```

k=3, r=3 totalistic

```
In[41]:= genk3r3C[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, {3, 1}, 3}, 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]]
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

```
In[43]:= genk4r1NT[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, 4}, 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]]
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

```
In[45]:= genk4r1C[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, {4, 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]]
datak4r1C[W_Integer, H_Integer, n_Integer] :=
  Table[genk4r1C[i, W, H] -> i, {i, RandomChoice[Range[0, 1048575], n]}]
```

k=4, r=2 totalistic

```
In[47]:= genk4r2C[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, {4, 1}, 2}, 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]]
datak4r2C[W_Integer, H_Integer, n_Integer] :=
  Table[genk4r2C[i, W, H] -> i, {i, RandomChoice[Range[0, 4294967295], n]}]
```

k=5, r=1 totalistic

```
In[49]:= gen5T2C[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, {5, 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]]
data5T2C[n_Integer, W_Integer, H_Integer] := Table[gen5T2C[i, W, H] -> i,
  {i, RandomChoice[Range[0, 1220703125], n]}]
```

k=6, r=1 totalistic

```
In[51]:= gen6TC[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, {6, 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]]
data6TC[n_Integer, W_Integer, H_Integer] := Table[gen6TC[i, W, H] -> i,
  {i, RandomInteger[2821109907455, n]}]
```

k=6, r=2 totalistic

```
In[53]:= gen6T2C[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, {6, 1}, 2}, 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]]
data6T2C[n_Integer, W_Integer, H_Integer] := Table[gen6T2C[i, W, H] -> i,
  {i, RandomInteger[170 581 728 179 578 208 255, n]}]
```

k=7, r=1 totalistic

```
In[55]:= gen7TC[p_Integer, W_Integer, H_Integer] :=
  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[11 398 895 185 373 142, n]}]
```

k=8, r=1 totalistic

```
In[57]:= gen8TC[p_Integer, W_Integer, H_Integer] :=
  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]}]
```

k=8, r=2 totalistic

```
In[59]:= gen8T2C[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, {8, 1}, 2}, 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]]
data8T2C[n_Integer, W_Integer, H_Integer] := Table[gen8T2C[i, W, H] -> i,
  {i, RandomInteger[324 518 553 658 426 726 783 156 020 576 255, n]}]
```

k=9, r=1 totalistic

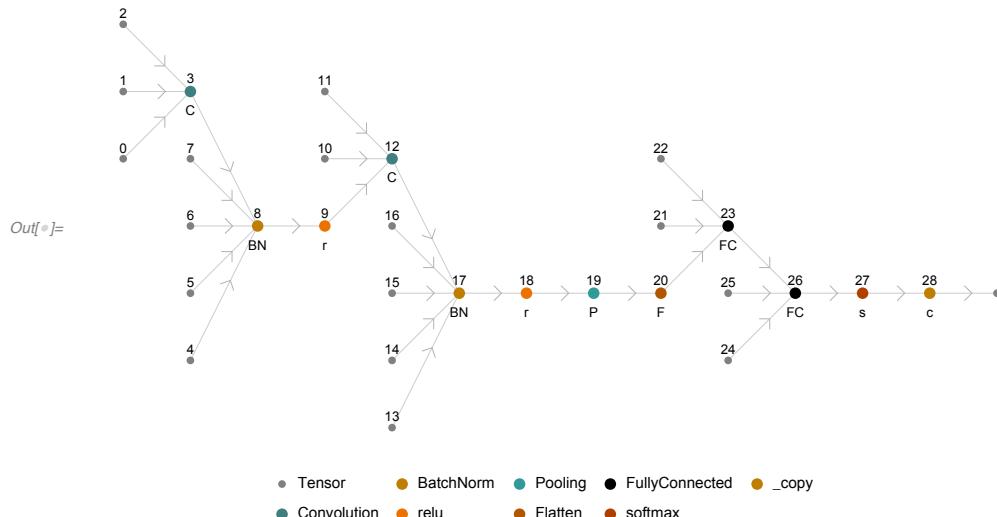
```
In[61]:= gen9TC[p_Integer, W_Integer, H_Integer] :=
  Image[ArrayPlot[CellularAutomaton[{p, {9, 1}, 1}, RandomInteger[1, W], H - 1],
    ImageSize -> {W, H}, ColorRules -> {0 -> RandomColor[], 1 -> RandomColor[],
      3 -> RandomColor[], 4 -> RandomColor[], 5 -> RandomColor[],
      6 -> RandomColor[], 7 -> RandomColor[], 8 -> RandomColor[]}, Frame -> False]]
data9TC[n_Integer, W_Integer, H_Integer] := Table[gen9TC[i, W, H] -> i,
  {i, RandomInteger[717897987691852588770248, n]}]
```

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

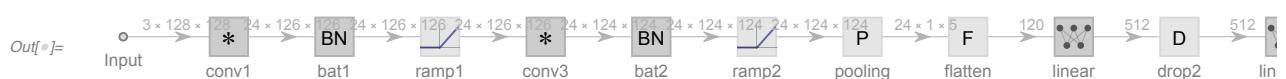
```
In[62]:= netECA13 = netSevenCC512drop[128, 128]
```

```
Out[62]= NetChain[]
```

```
In[63]:= NetInformation[netECA13, "MXNetNodeGraphPlot"]
```



```
In[64]:= NetInformation[netECA13, "SummaryGraphic"]
```



```
In[65]:= dataECA13 = dataC[128, 128, 8192];
```

```
In[66]:= dataTotalistic2BigC13 = genData2r2C[128, 128, 1024];
```

```
In[67]:= dataTotalistic3BigC13 = data3T2C[128, 128, 1024];
```

```
In[68]:= dataTotalistic4BigC13 = data4TC[128, 128, 1024];
```

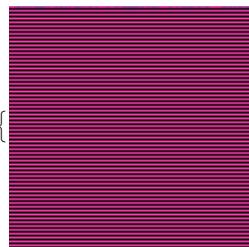
```
In[69]:= dataTotalistic5BigC13 = genData5TCC[128, 128, 4096];
```

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

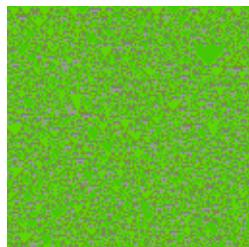
Out[®]= 26 624

```
In[®]:= RandomSample[fullTrainingBigC13, 20]
```

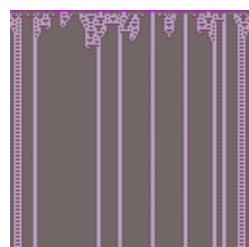
Out[®]= {



→ 2,



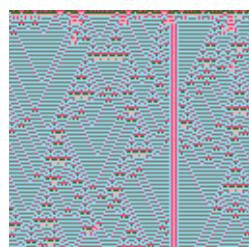
→ 3,



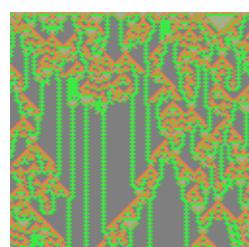
→ 2,



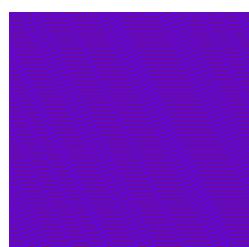
→ 2,



→ 4,



→ 4,



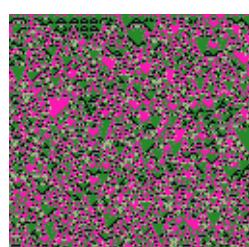
→ 2,



→ 3,



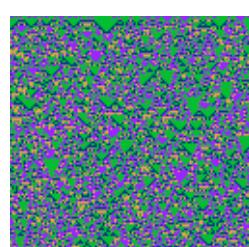
→ 1,



→ 3,



→ 1,



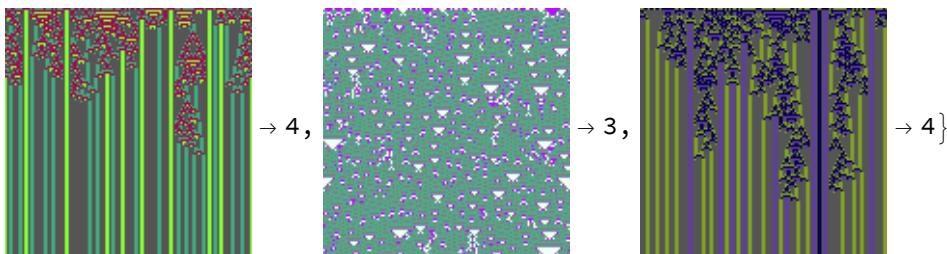
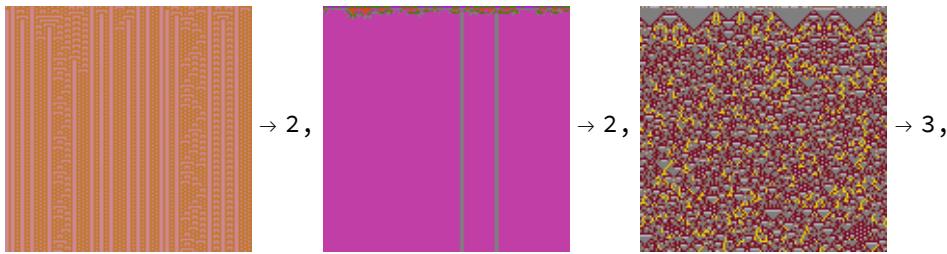
→ 3,



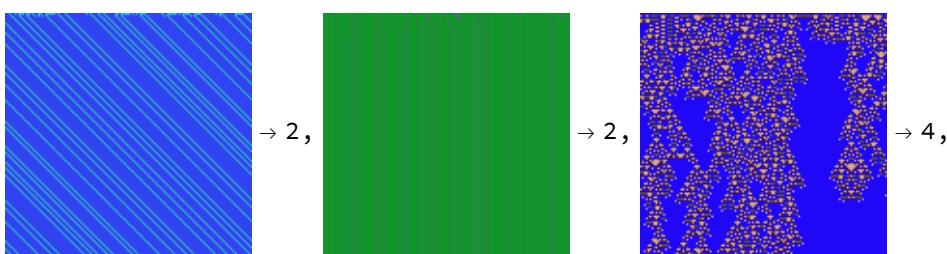
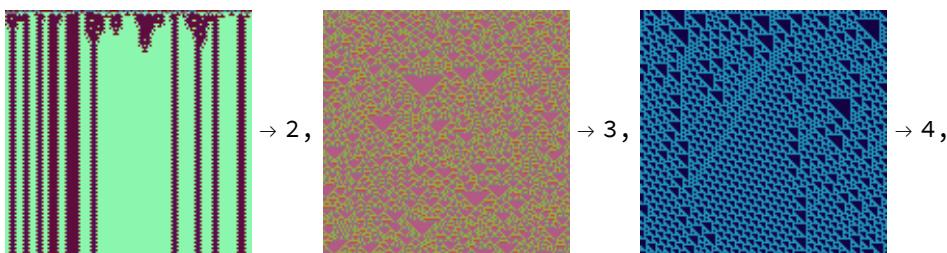
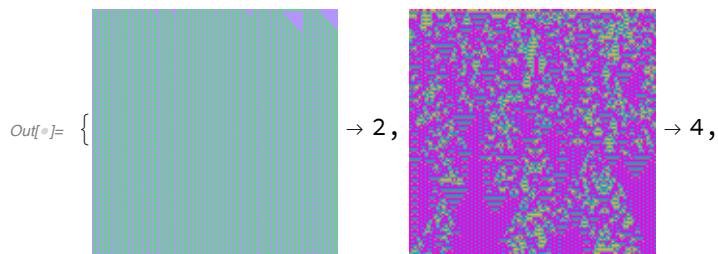
→ 2,

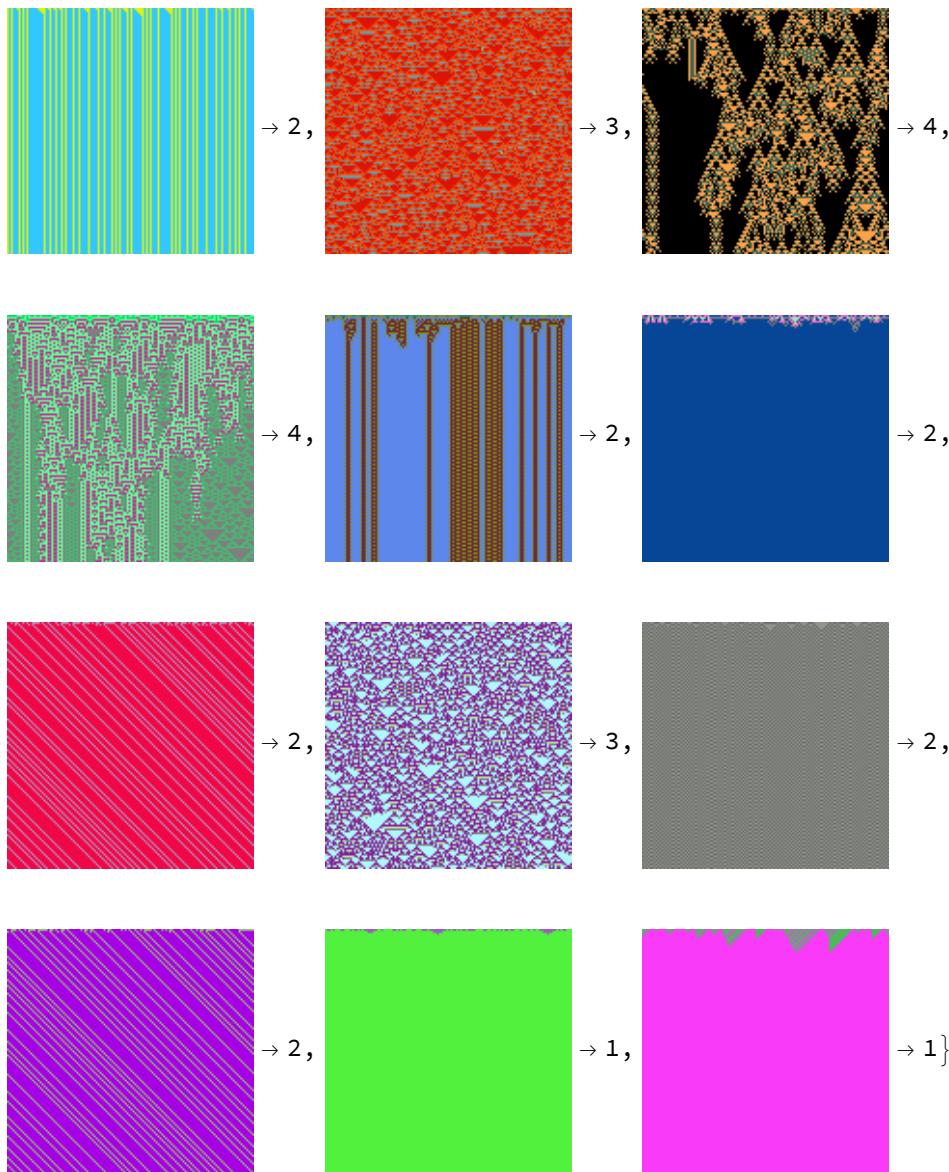


→ 1,



In[8]:= `RandomSample[fullTrainingBigC13, 20]`





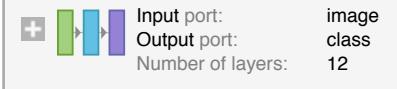
```
In[1]:= dir = SetDirectory[NotebookDirectory[]]
Out[1]= /Users/thorsilver/Downloads/Wolfram notebooks
```

```
In[2]:= netECA12 = Import["netECA12-r12.wlnet"]
```

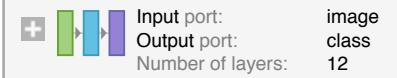
Out[2]= NetChain[

	Input	image
conv1	ConvolutionLayer	array (size: 3 × 120 × 200)
bat1	BatchNormalizationLayer	array (size: 24 × 118 × 198)
ramp1	Ramp	array (size: 24 × 118 × 198)
conv3	ConvolutionLayer	array (size: 24 × 116 × 196)
bat2	BatchNormalizationLayer	array (size: 24 × 116 × 196)
ramp2	Ramp	array (size: 24 × 116 × 196)
pooling	PoolingLayer	array (size: 24 × 1 × 5)
flatten	FlattenLayer	vector (size: 120)
linear	LinearLayer	vector (size: 512)
drop2	DropoutLayer	vector (size: 512)
linear2	LinearLayer	vector (size: 4)
softmax	SoftmaxLayer	vector (size: 4)
	Output	class

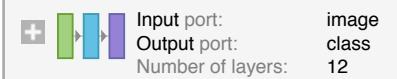
```
In[®]:= netECA13 = NetTrain[netECA13, fullTrainingBigC13,
  MaxTrainingRounds → 20, BatchSize → 256 * 4, TargetDevice → "CPU",
  TrainingProgressCheckpointing → {"Directory", dir}]
```

Out[®]= NetChain[]

```
In[®]:= netECA13 = Import["netECA13-r20.wlnet"]
```

Out[®]= NetChain[]

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

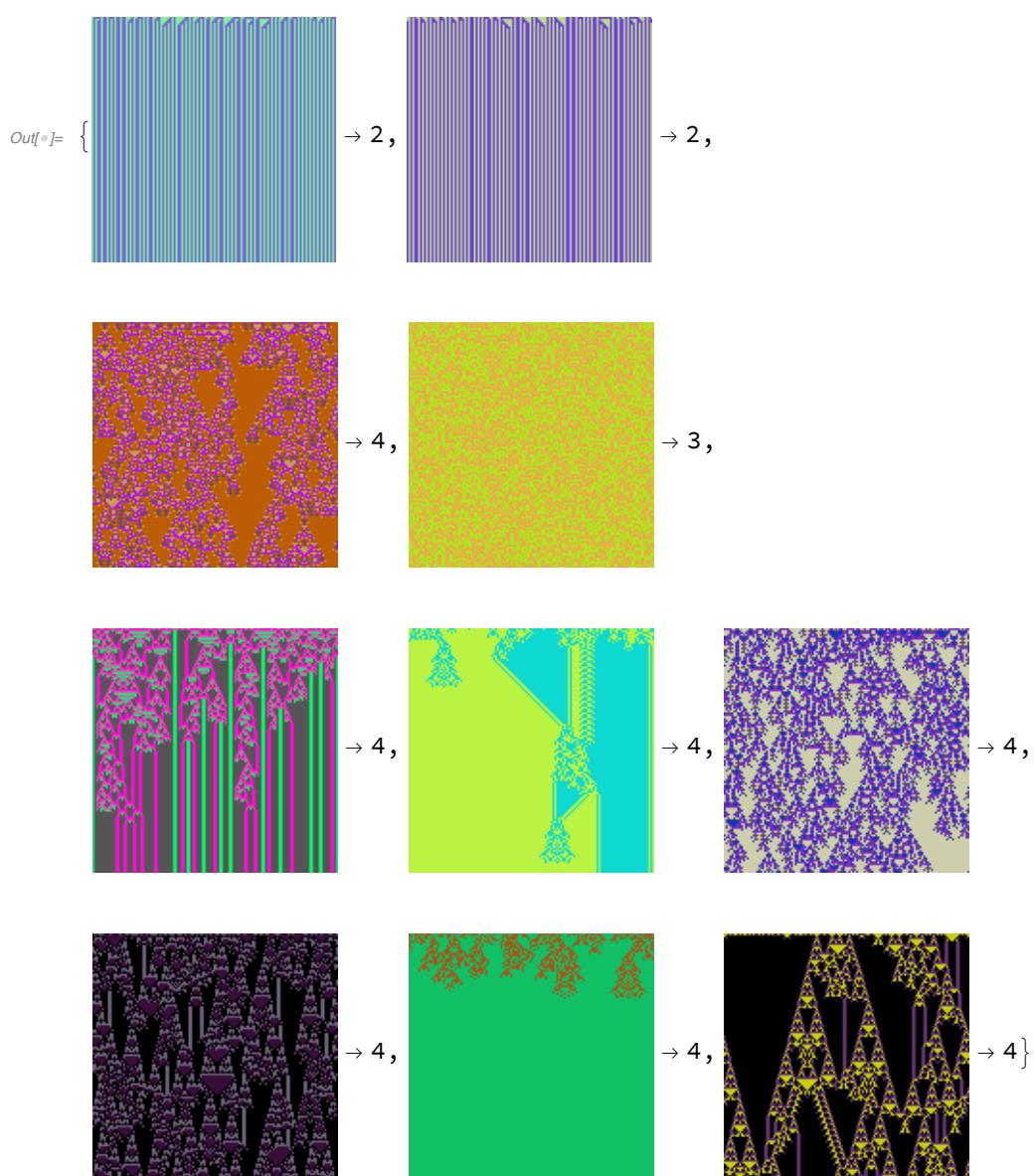
Out[®]= NetChain[]

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]
```

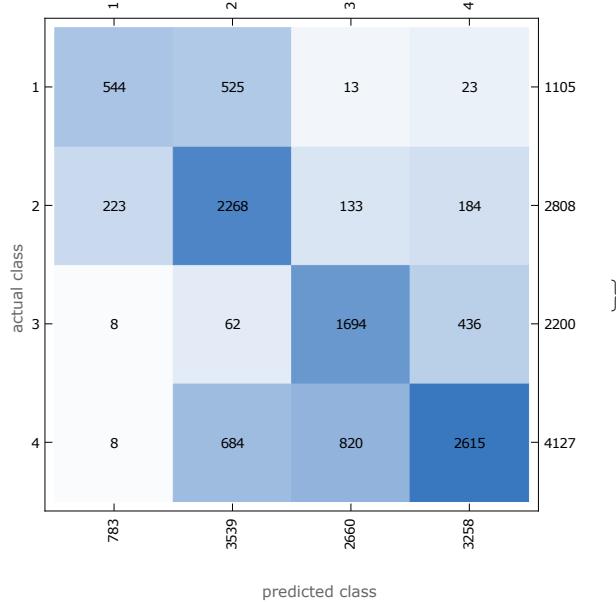
Out[®]= 10 240

In[8]:= RandomSample[fullTestSetBigC, 10]

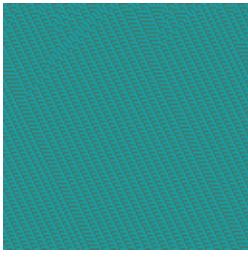


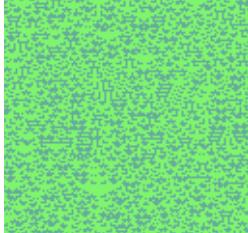
```
In[®]:= NetMeasurements[netECA13, fullTestSetBigC,
 {"Accuracy", "Precision", "ConfusionMatrixPlot"}]

Out[®]= {0.69541, <| 1 → 0.694764, 2 → 0.640859, 3 → 0.636842, 4 → 0.80264 |>, }
```



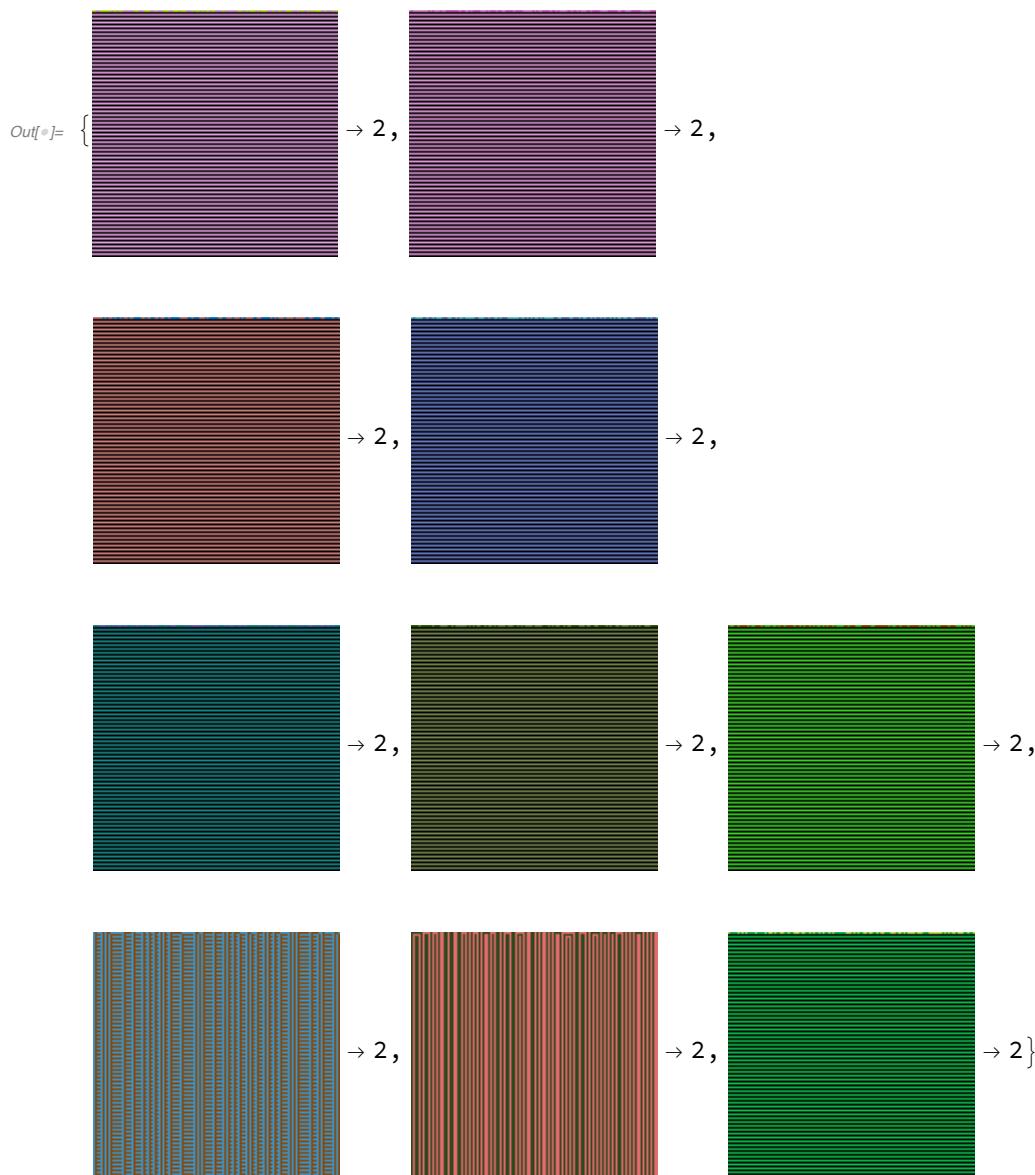
```
In[®]:= entropyImagesBigC = RandomSample[Keys[fullTestSetBigC], 500];
entropiesBigC = netECA13[entropyImagesBigC, "Entropy"];
highEntBigC = entropyImagesBigC[[Ordering[entropiesBigC, -10]]];
lowEntBigC = entropyImagesBigC[[Ordering[entropiesBigC, 10]]];
Thread[highEntBigC → netECA13[highEntBigC]]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

Out[•]= { → 2,  → 2,

 → 2,  → 3,

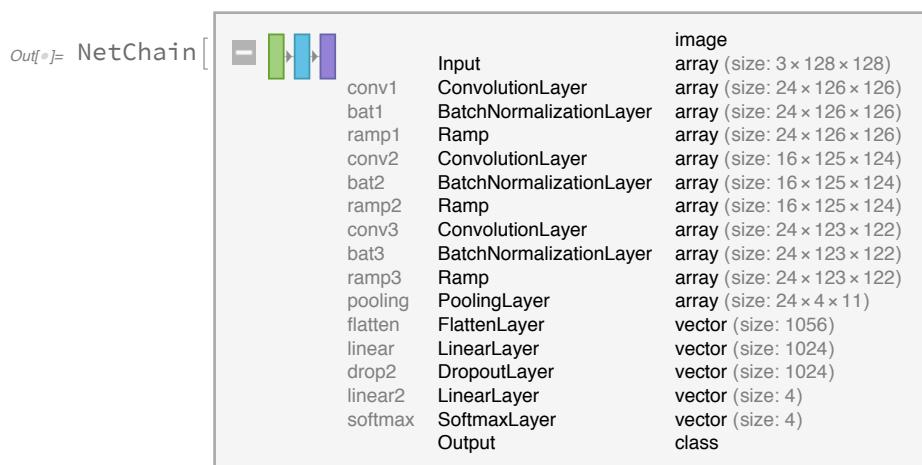
 → 3,  → 2,  → 4,

 → 2,  → 2,  → 4}



Network XIV - BatchNorm, 1024 linear, dropout

In[9]:= **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"]

```

NetChain[Input	image
conv1	ConvolutionLayer	array (size: 3 × 128 × 128)
bat1	BatchNormalizationLayer	array (size: 24 × 126 × 126)
ramp1	Ramp	array (size: 24 × 126 × 126)
conv2	ConvolutionLayer	array (size: 24 × 125 × 124)
bat2	BatchNormalizationLayer	array (size: 16 × 125 × 124)
ramp2	Ramp	array (size: 16 × 125 × 124)
conv3	ConvolutionLayer	array (size: 24 × 123 × 122)
bat3	BatchNormalizationLayer	array (size: 24 × 123 × 122)
ramp3	Ramp	array (size: 24 × 123 × 122)
pooling	PoolingLayer	array (size: 24 × 4 × 11)
flatten	FlattenLayer	vector (size: 1056)
linear	LinearLayer	vector (size: 1024)
drop2	DropoutLayer	vector (size: 1024)
linear2	LinearLayer	vector (size: 4)
softmax	SoftmaxLayer	vector (size: 4)
Output		class

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

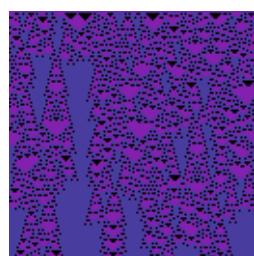
```

```
In[®]:= RandomSample[fullTestSetBigC, 10]
```

Out[®]= {



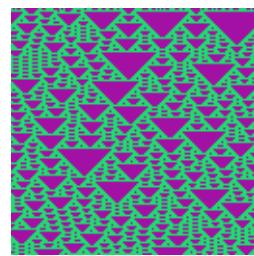
→ 4,



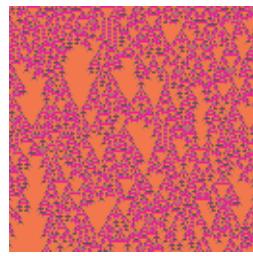
→ 4,



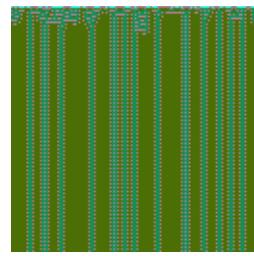
→ 4,



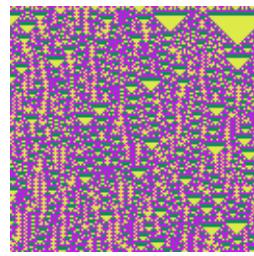
→ 3,



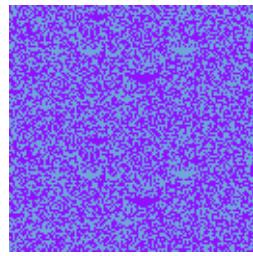
→ 4,



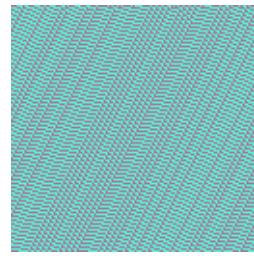
→ 2,



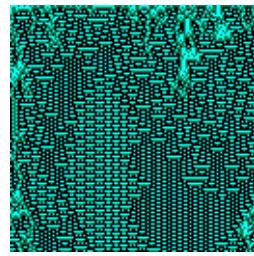
→ 3,



→ 3,



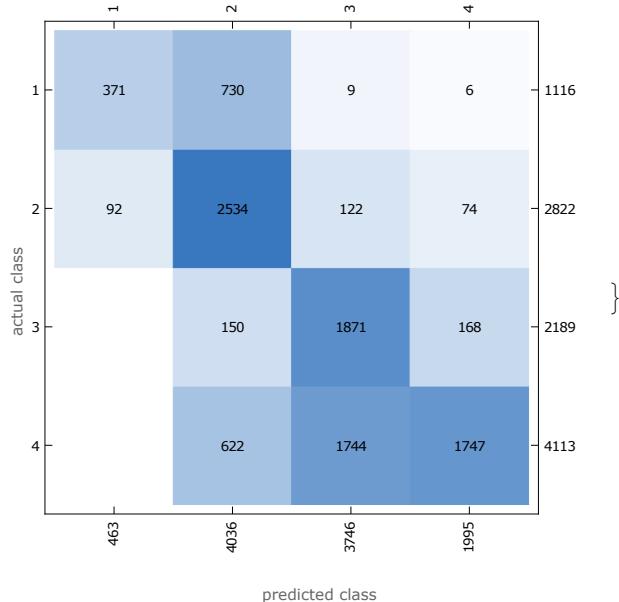
→ 2,



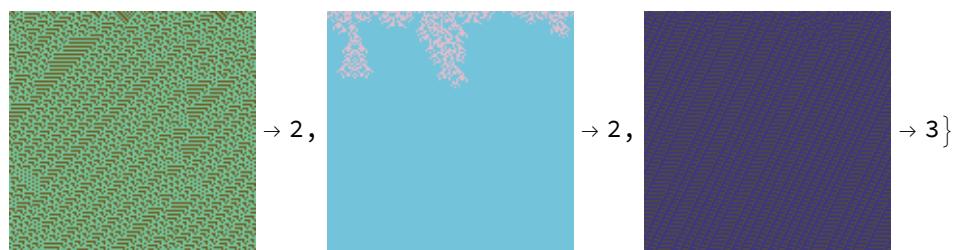
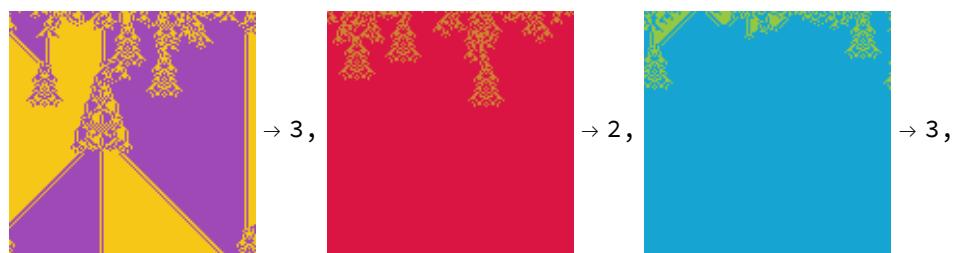
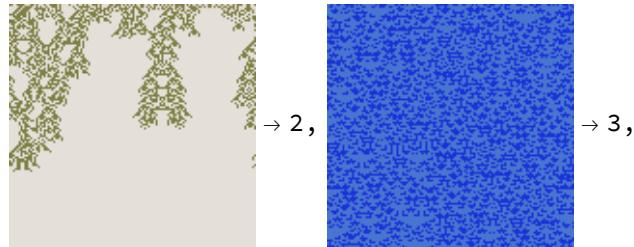
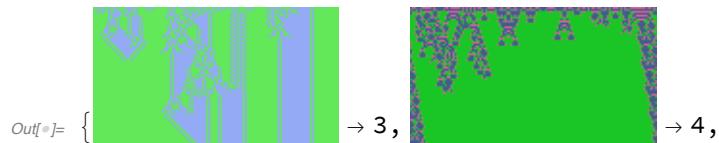
→ 4}

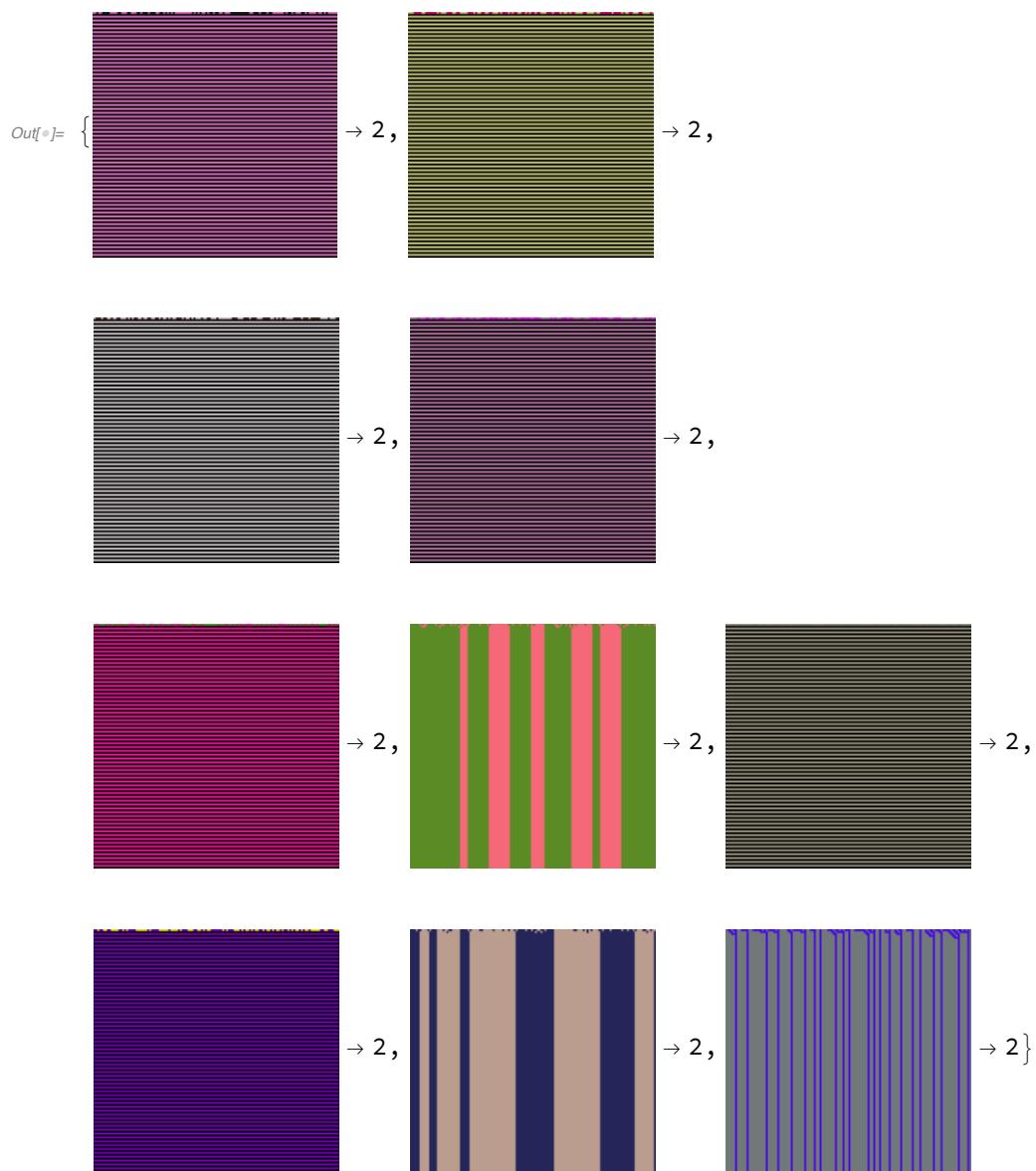
```
In[®]:= NetMeasurements[netECA14, fullTestSetBigC,
 {"Accuracy", "Precision", "ConfusionMatrixPlot"}]

Out[®]= {0.637012, <| 1 → 0.801296, 2 → 0.627849, 3 → 0.499466, 4 → 0.875689 |>, }
```



```
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[⑩]:= netECA15 = NetModel["VGG-16 Trained on ImageNet Competition Data"]
```



```
In[⑪]:= subNet = NetTake[netECA15, {"conv1_1", "flatten_0"}]
```



```
In[⑫]:= joinedNet = NetJoin[subNet,
  NetChain@<|"linear_new" → LinearLayer[1024], "linear_out" → LinearLayer[4],
  "prob" → SoftmaxLayer[]|>, "Output" → NetDecoder[{"Class", Range[1, 4]}]]
```



```
In[®]:= netECA15final =
NetPrepend[joinedNet, {"augment" → ImageAugmentationLayer[{224, 224}]}],
"Input" → NetExtract[joinedNet, "Input"]]

Out[®]= NetChain[
  Input port: uninitialised
  Output port: image class
  Number of layers: 36]
```

In[®]:= dataECA15 = dataC[224, 224, 8192];

In[®]:= dataTotalistic2BigC15 = genData2r2C[224, 224, 1024];

In[®]:= dataTotalistic3BigC15 = data3T2C[224, 224, 512];

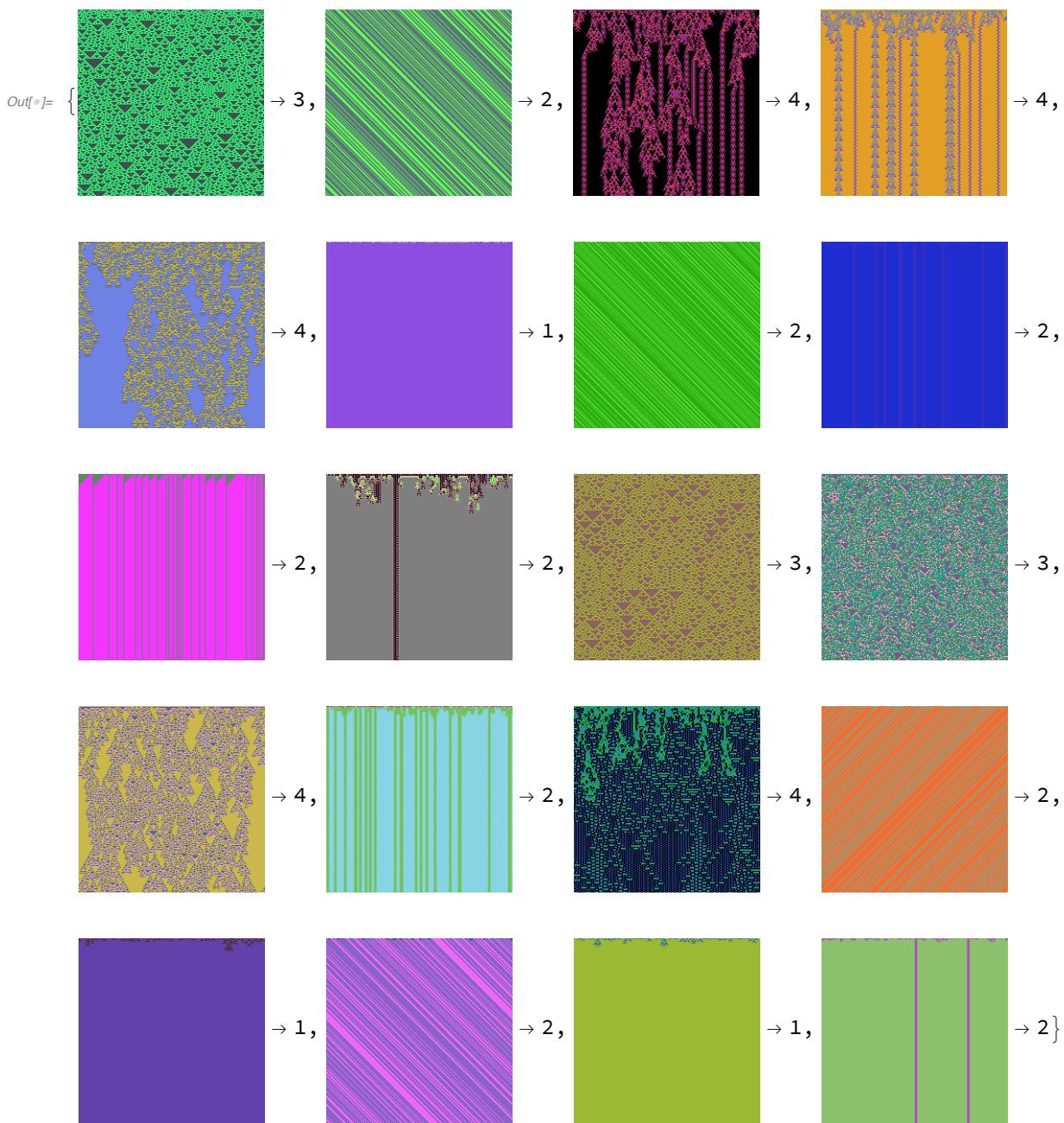
In[®]:= dataTotalistic4BigC15 = data4TC[224, 224, 512];

In[®]:= dataTotalistic5BigC15 = genData5TCC[224, 224, 1024];

In[®]:= fullTrainingBigC15 = Join[dataECA15, dataTotalistic2BigC15,
 dataTotalistic3BigC15, dataTotalistic4BigC15, dataTotalistic5BigC15];
Length[fullTrainingBigC15]

Out[®]= 16384

```
In[⑩]:= RandomSample[fullTrainingBigC15, 20]
```



```
In[⑪]:= netECA15final = NetTrain[netECA15final, fullTrainingBigC15,
  MaxTrainingRounds → 5, BatchSize → 256 * 4, TargetDevice → "CPU",
  TrainingProgressCheckpointing → {"Directory", dir},
  LearningRateMultipliers → {"linear_new" → 1, "linear_out" → 1, _ → 0}]
```

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

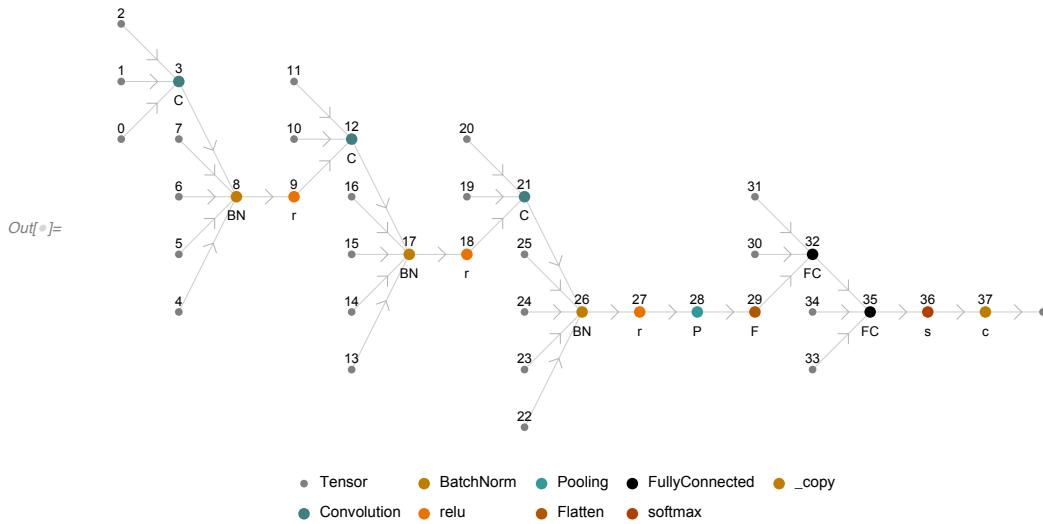
```
In[⑫]:= netECA16 = netNineCC512drop[128, 128]
```

Out[⑫]= NetChain[

	Input port:	image
	Output port:	class
	Number of layers:	15

]

```
In[⑩]:= NetInformation[netECA16, "MXNetNodeGraphPlot"]
```



```
In[⑪]:= NetInformation[netECA16, "SummaryGraphic"]
```



```
In[⑫]:= dataECA16 = dataC[128, 128, 8192];
```

```
In[⑬]:= dataTotalistic2BigC16 = genData2r2C[128, 128, 1024];
```

```
In[⑭]:= dataTotalistic3BigC16 = data3T2C[128, 128, 1024];
```

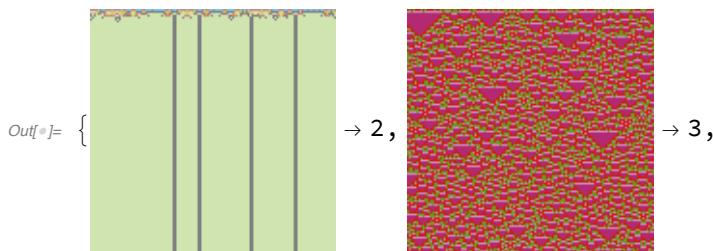
```
In[⑮]:= dataTotalistic4BigC16 = data4TC[128, 128, 1024];
```

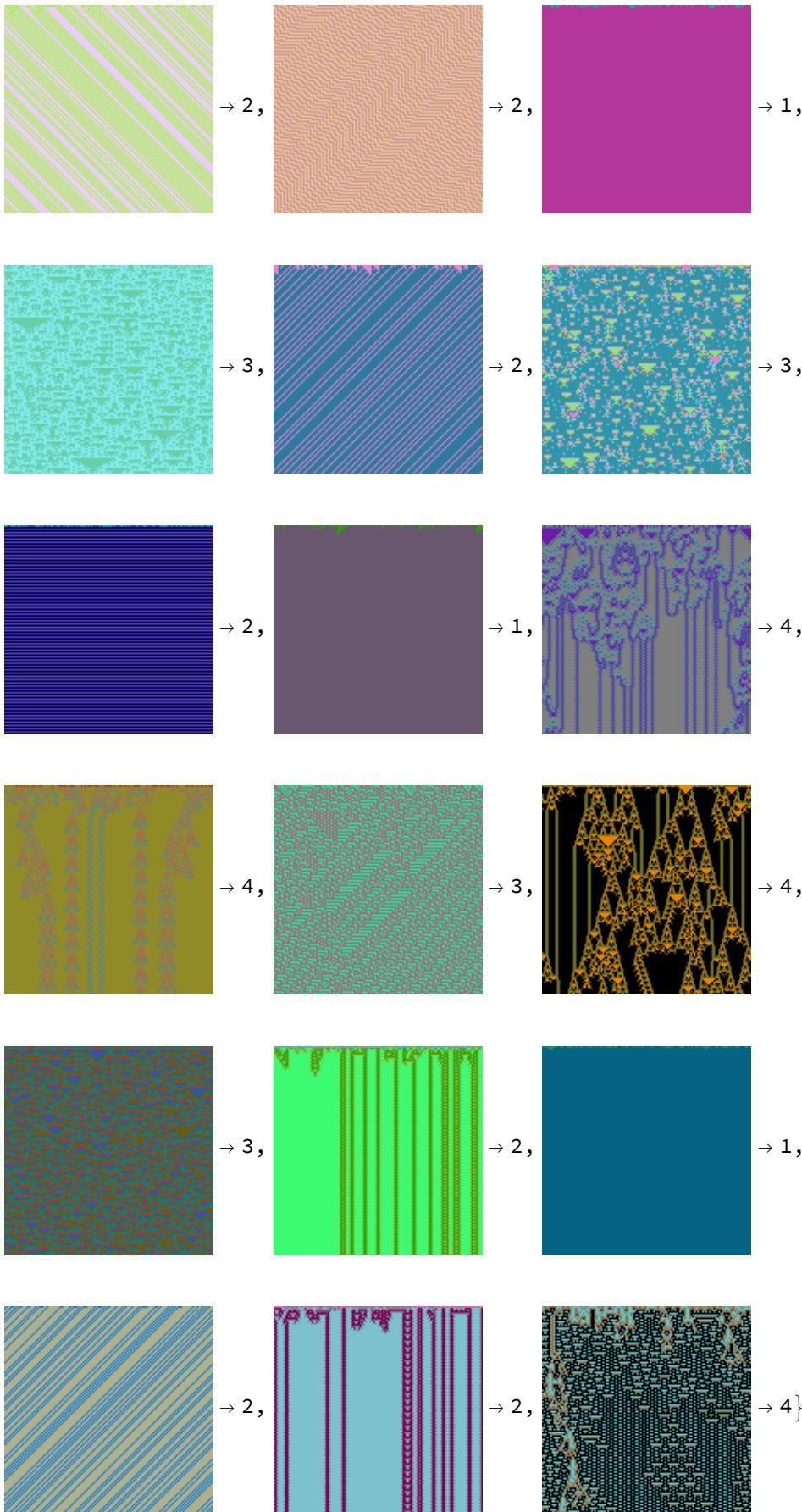
```
In[⑯]:= dataTotalistic5BigC16 = genData5TCC[128, 128, 4096];
```

```
In[⑰]:= fullTrainingBigC16 = Join[dataECA16, dataTotalistic2BigC16,
  dataTotalistic3BigC16, dataTotalistic4BigC16, dataTotalistic5BigC16];
Length[fullTrainingBigC16]
```

Out[⑰]= 26624

```
In[⑲]:= RandomSample[fullTrainingBigC16, 20]
```





```
In[®]:= dir = SetDirectory[NotebookDirectory[]]
Out[®]= /home/esilverman/Documents

In[®]:= netECA16 = NetTrain[netECA16, fullTrainingBigC16,
  MaxTrainingRounds → 200, BatchSize → 256, TargetDevice → "GPU",
  TrainingProgressCheckpointing → {"Directory", dir}]

Out[®]= NetChain[]
  Input port: image
  Output port: class
  Number of layers: 15

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

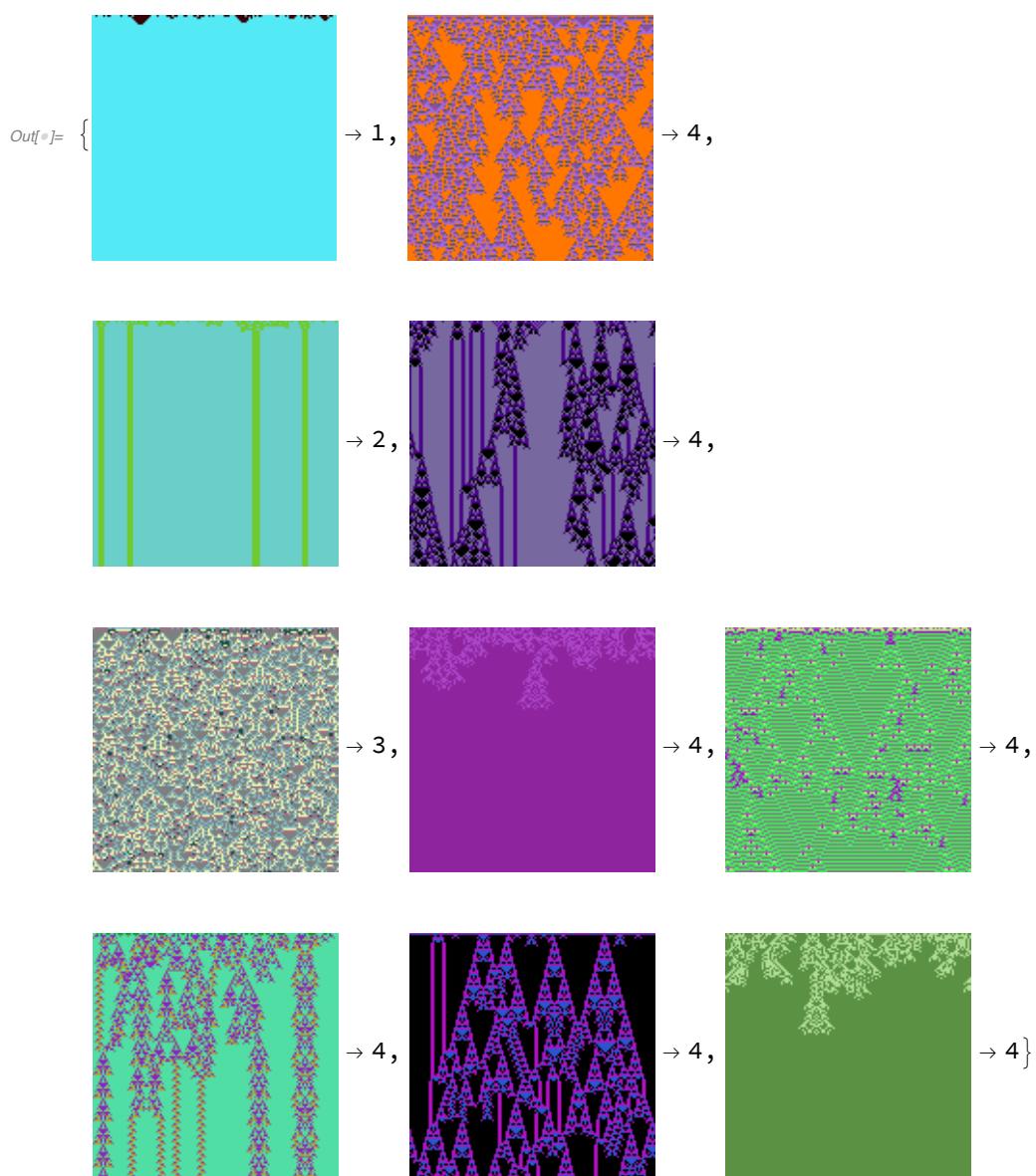
```
In[®]:= dir = SetDirectory[NotebookDirectory[]]
Out[®]= /Users/thorsilver/Downloads/Wolfram notebooks

In[®]:= netECA16 = Import["netECA16-r20.wlnet"]
Out[®]= NetChain[]
  Input port: image
  Output port: class
  Number of layers: 15

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]

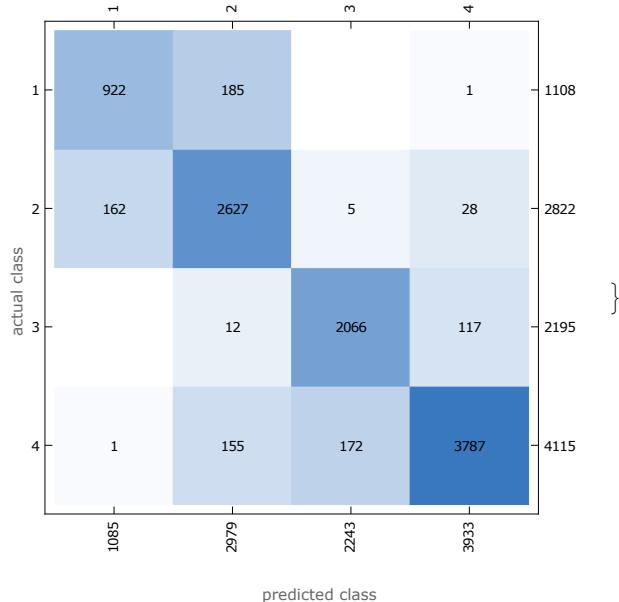
Out[®]= 10240
```

In[8]:= `RandomSample[fullTestSetBigC, 10]`

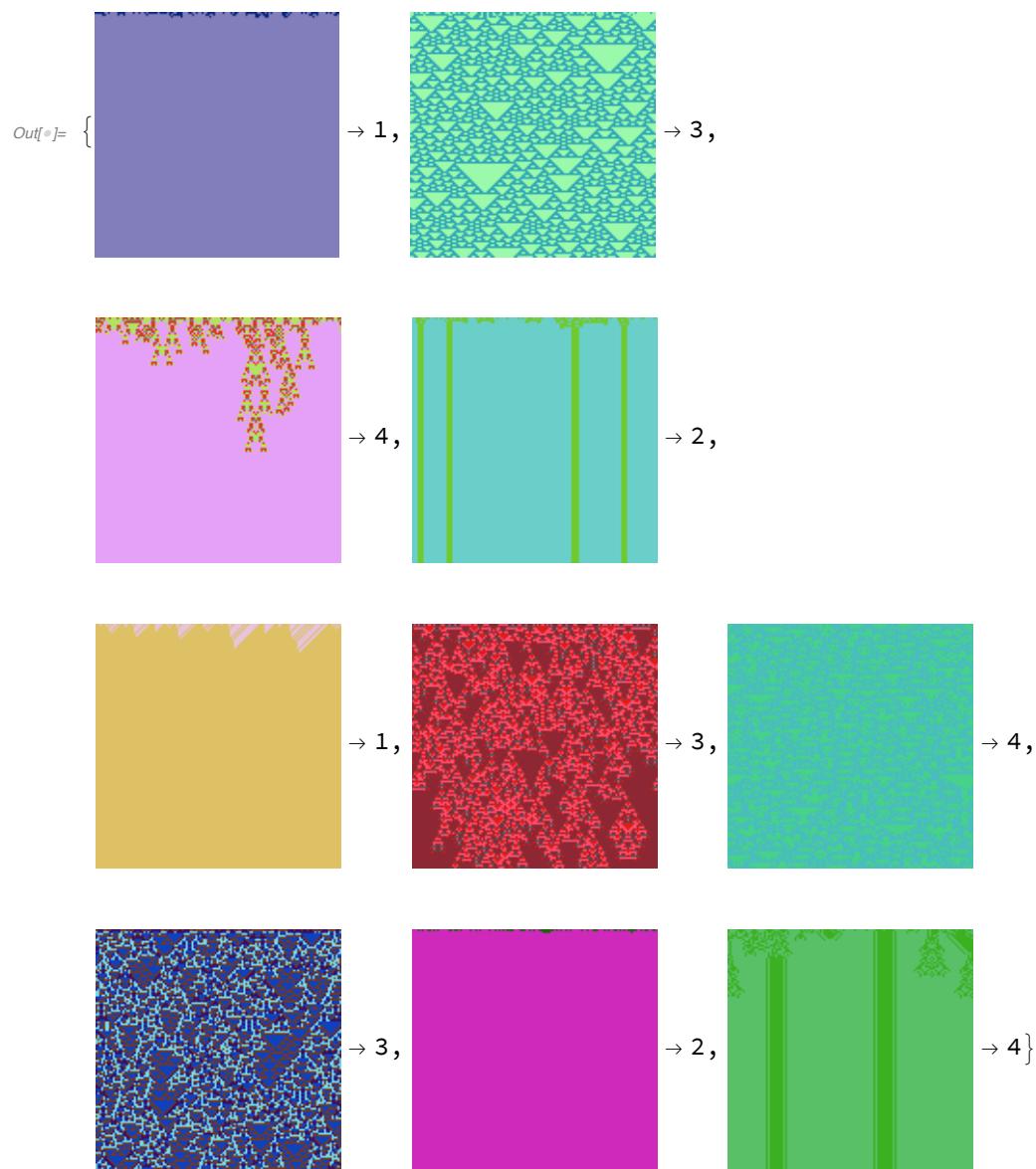


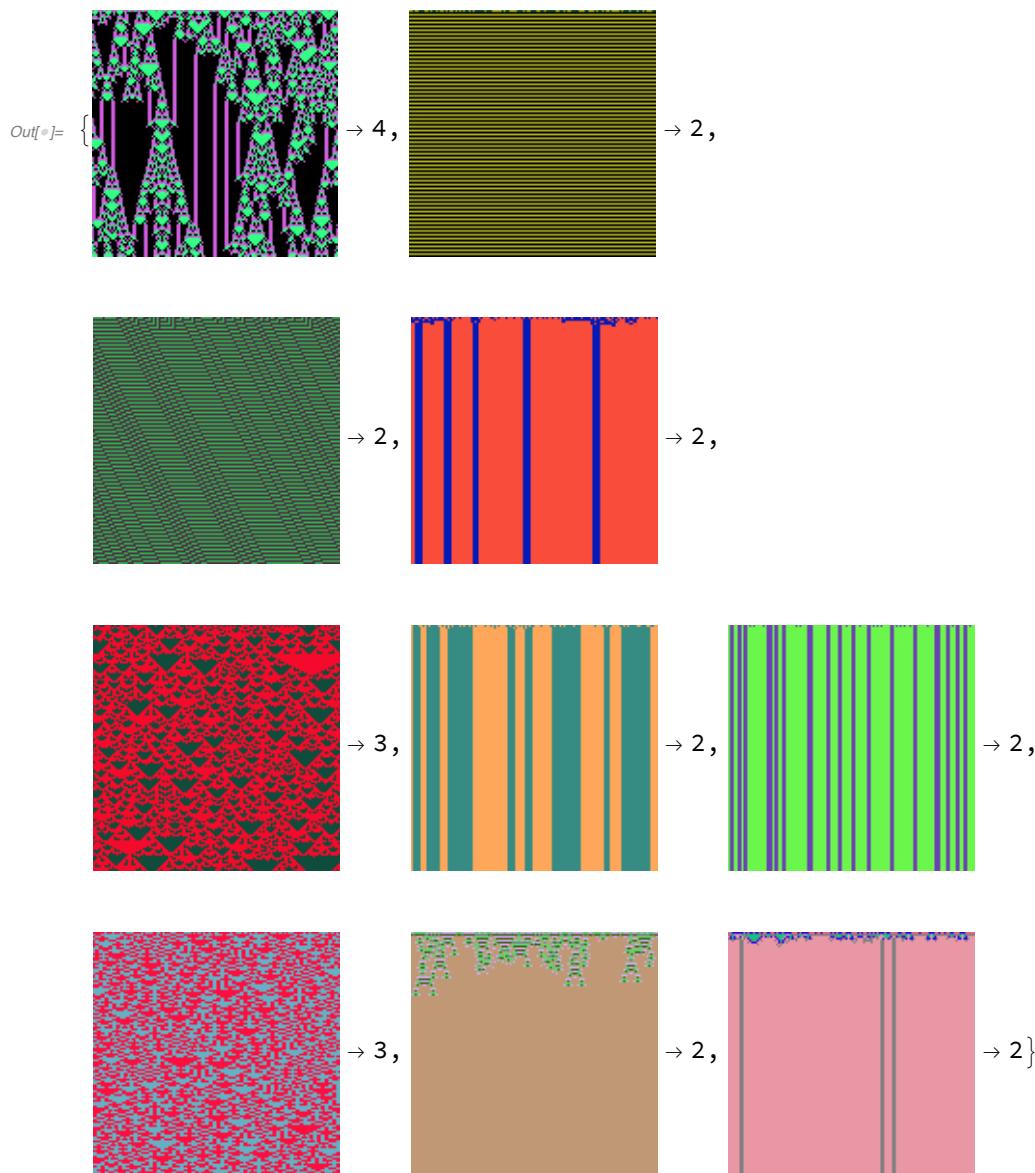
```
In[®]:= NetMeasurements[netECA16, fullTestSetBigC,
 {"Accuracy", "Precision", "ConfusionMatrixPlot"}]

Out[®]= {0.918164, <| 1 → 0.84977, 2 → 0.88184, 3 → 0.921088, 4 → 0.962878 |>, }
```



```
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}]]
```

Out[•]= {

→ 142 978 078 → {4 → 0.0000385332, 3 → 0.999961},

$$\left(\begin{array}{c} \text{[A 2x2 grid of small black dots on a white background]} \\ \rightarrow 2\ 651\ 048\ 833 \end{array} \right) \rightarrow \{ 4 \rightarrow 8.69455 \times 10^{-12}, 2 \rightarrow 1. \},$$

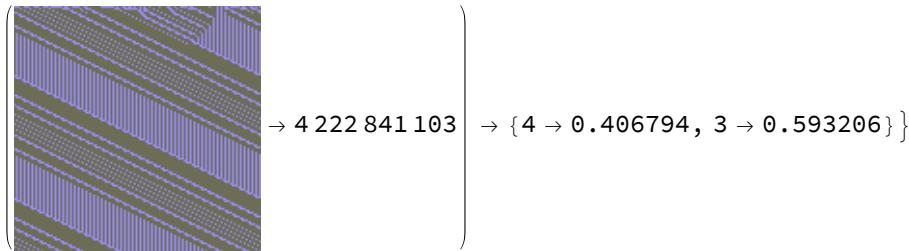
$$\left(\begin{array}{c} \text{[A 2x2 grid of small black dots on a white background]} \\ \rightarrow 2\ 132\ 867\ 963 \end{array} \right) \rightarrow \{ 4 \rightarrow 2.86202 \times 10^{-17}, 2 \rightarrow 1. \},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of small black dots on a white background]} \\ \rightarrow 3\ 644\ 758\ 968 \end{array} \right) \rightarrow \{ 4 \rightarrow 6.11899 \times 10^{-7}, 3 \rightarrow 0.999999 \},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of small black dots on a white background]} \\ \rightarrow 1\ 762\ 420\ 096 \end{array} \right) \rightarrow \{ 1 \rightarrow 2.34707 \times 10^{-9}, 2 \rightarrow 1. \},$$

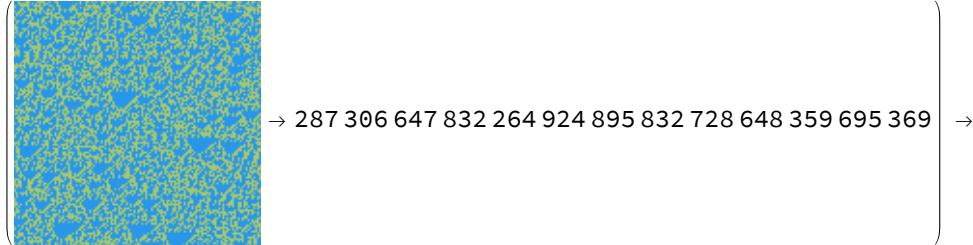
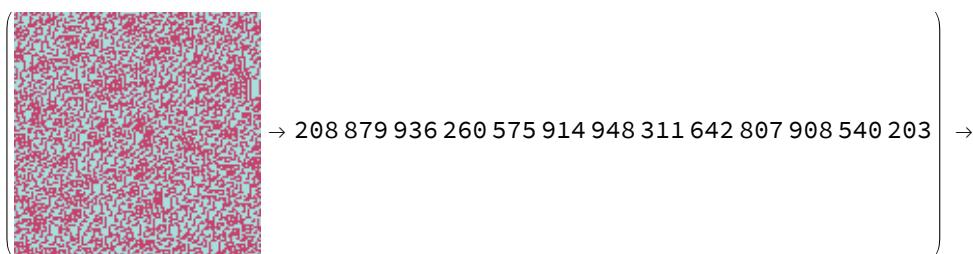
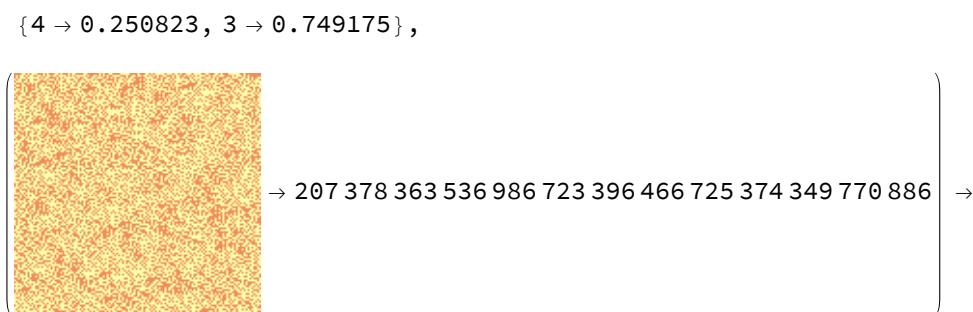
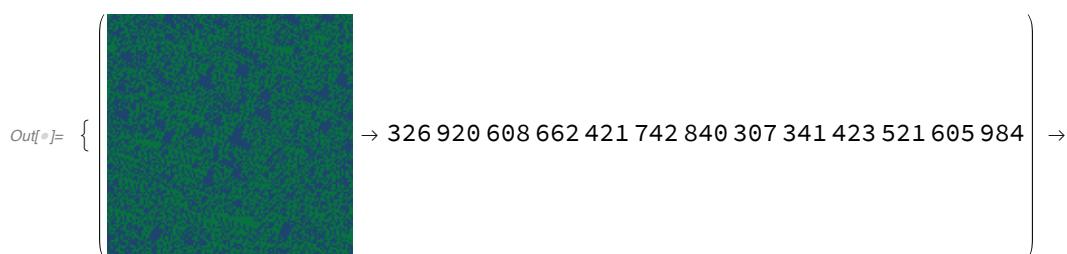
$$\left(\begin{array}{c} \text{[A 2x2 grid of small black dots on a white background]} \\ \rightarrow 1\ 983\ 429\ 391 \end{array} \right) \rightarrow \{ 4 \rightarrow 0.0547227, 3 \rightarrow 0.945277 \},$$

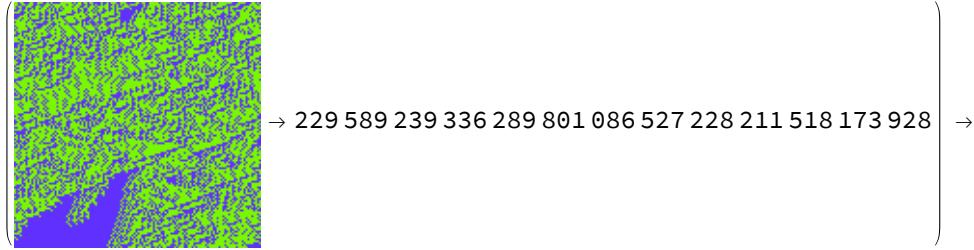
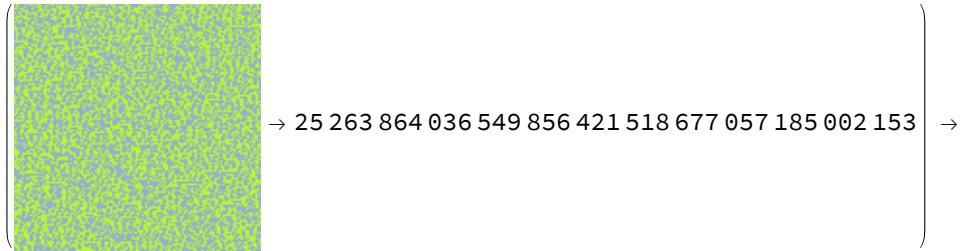
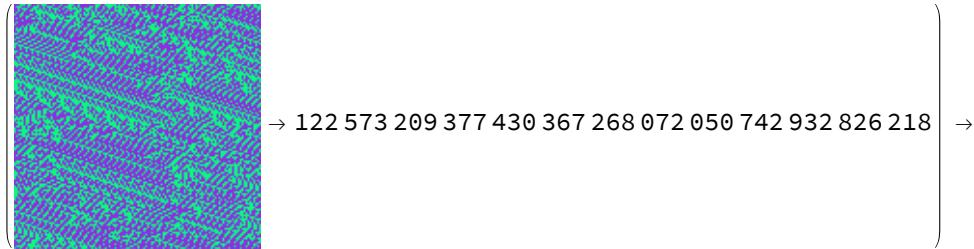
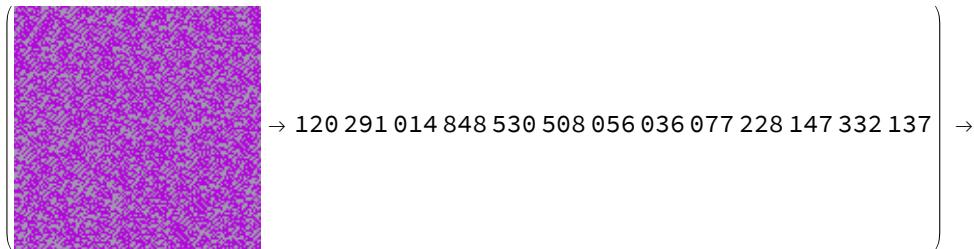
$$\left(\begin{array}{c} \text{[A 2x2 grid of small black dots on a white background]} \\ \rightarrow 3\ 013\ 553\ 323 \end{array} \right) \rightarrow \{ 3 \rightarrow 0.0109364, 2 \rightarrow 0.989064 \},$$



2-colour non-totalistic, range 3

```
In[]:= test4Data2kr3C16 = datak2r3NT[128, 128, 8];
Thread[
test4Data2kr3C16 → netECA16[Keys@test4Data2kr3C16, {"TopProbabilities", 2}]]
```



$\{4 \rightarrow 1.21845 \times 10^{-8}, 3 \rightarrow 1.\},$

 $\{3 \rightarrow 0.0173989, 4 \rightarrow 0.982601\},$

 $\{4 \rightarrow 2.486 \times 10^{-11}, 3 \rightarrow 1.\},$

 $\{4 \rightarrow 1.46881 \times 10^{-9}, 3 \rightarrow 1.\},$

 $\{4 \rightarrow 0.00683298, 3 \rightarrow 0.993167\}$

3-colour non-totalistic, range 1

```
In[6]:= test4Data3kr1C16 = datak3r1NT[128, 128, 8];
Thread[
test4Data3kr1C16 → netECA16[Keys@test4Data3kr1C16, {"TopProbabilities", 2}]]
```

Out[•]= $\left\{ \begin{array}{c} \text{A 10x10 grid of black and white dots} \\ \rightarrow 4\ 431\ 477\ 695\ 805 \end{array} \right\} \rightarrow \{ 4 \rightarrow 0.000746188, 3 \rightarrow 0.999254 \},$

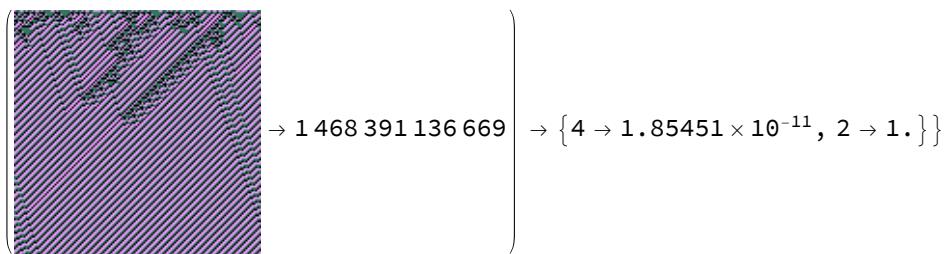
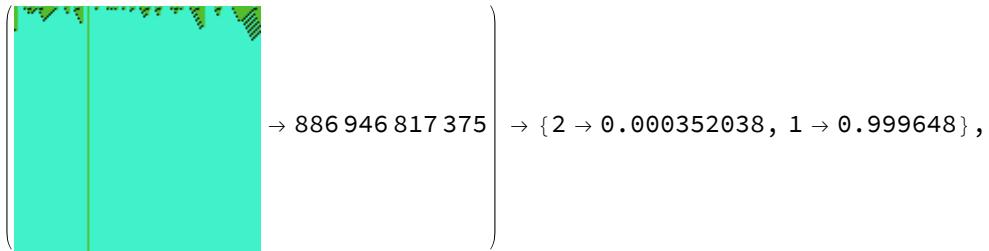
$\left\{ \begin{array}{c} \text{A 10x10 grid of green and black dots} \\ \rightarrow 1\ 627\ 958\ 441\ 874 \end{array} \right\} \rightarrow \{ 4 \rightarrow 0.00025369, 3 \rightarrow 0.999746 \},$

$\left\{ \begin{array}{c} \text{A 10x10 grid of red, blue, and black dots} \\ \rightarrow 4\ 241\ 674\ 451\ 024 \end{array} \right\} \rightarrow \{ 3 \rightarrow 0.194892, 2 \rightarrow 0.805108 \},$

$\left\{ \begin{array}{c} \text{A 10x10 grid of orange, green, and black dots} \\ \rightarrow 4\ 177\ 916\ 755\ 057 \end{array} \right\} \rightarrow \{ 3 \rightarrow 9.07174 \times 10^{-18}, 4 \rightarrow 1. \},$

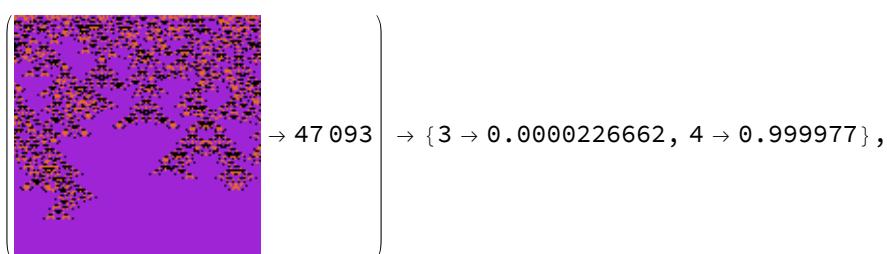
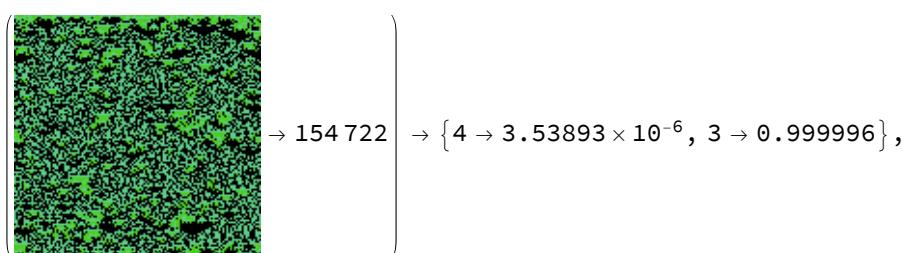
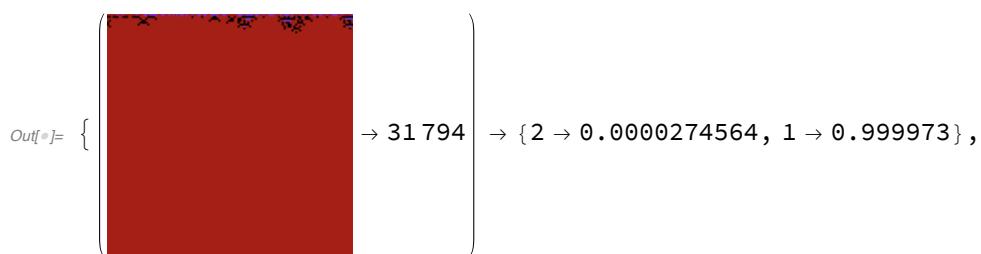
$\left\{ \begin{array}{c} \text{A 10x10 grid of red and green vertical stripes} \\ \rightarrow 2\ 504\ 235\ 138\ 103 \end{array} \right\} \rightarrow \{ 4 \rightarrow 1.3375 \times 10^{-21}, 2 \rightarrow 1. \},$

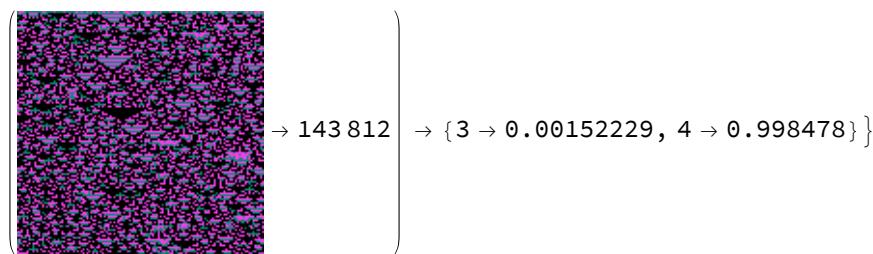
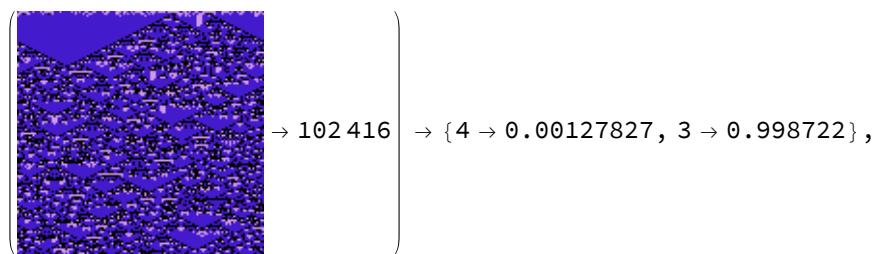
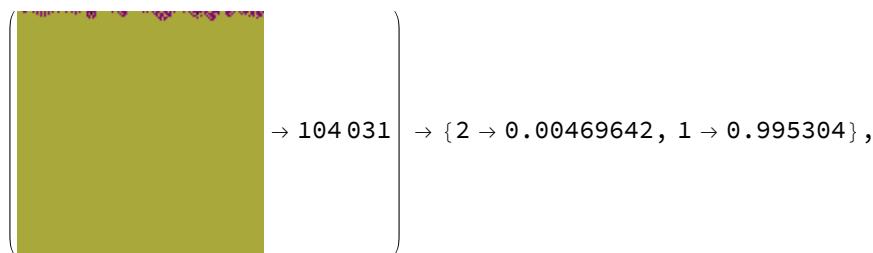
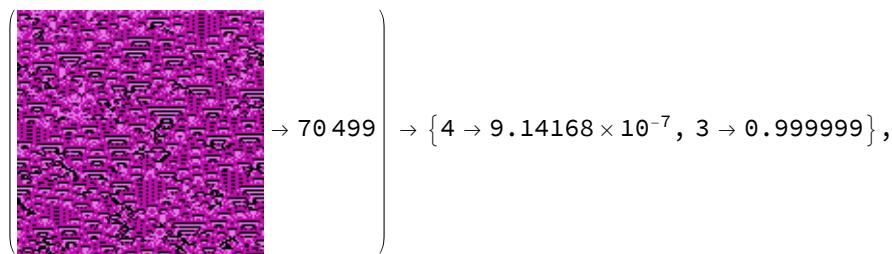
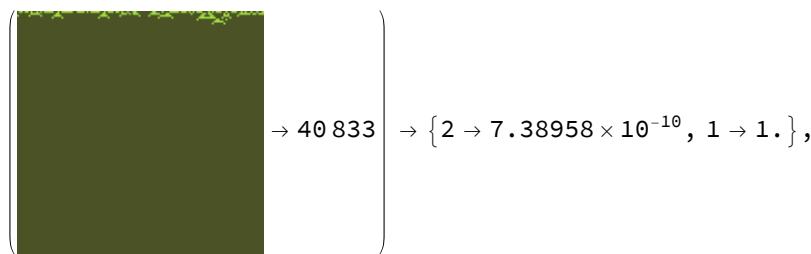
$\left\{ \begin{array}{c} \text{A 10x10 grid of yellow and pink dots} \\ \rightarrow 2\ 281\ 646\ 033\ 785 \end{array} \right\} \rightarrow \{ 4 \rightarrow 0.164883, 3 \rightarrow 0.835117 \},$



3-colour totalistic, range 2

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





3-colour totalistic, range 3

```
In[④]:= test4Data3kr3C16 = datak3r3C[128, 128, 8];
Thread[
test4Data3kr3C16 → netECA16[Keys@test4Data3kr3C16, {"TopProbabilities", 2}]]
```

Out[•]= $\left\{ \begin{array}{l} \text{A 2D grid of red and green pixels} \\ \rightarrow 9\,694\,493 \end{array} \right\} \rightarrow \{3 \rightarrow 0.480724, 4 \rightarrow 0.519276\},$

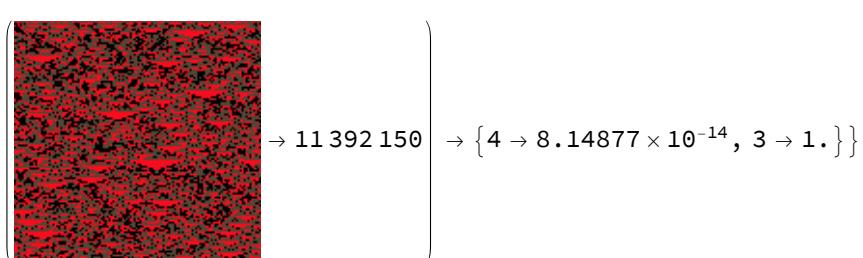
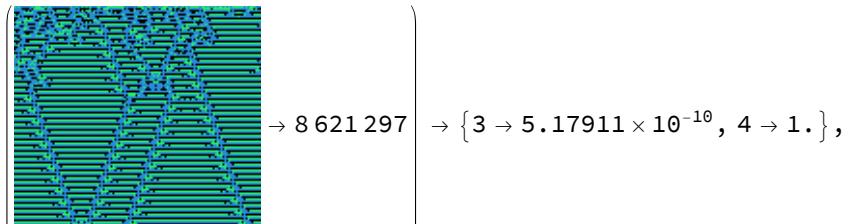
$\left\{ \begin{array}{l} \text{A 2D grid of black, pink, and purple pixels} \\ \rightarrow 1\,266\,350 \end{array} \right\} \rightarrow \{3 \rightarrow 2.07073 \times 10^{-17}, 4 \rightarrow 1.\},$

$\left\{ \begin{array}{l} \text{A 2D grid of black, green, and white pixels} \\ \rightarrow 10\,922\,251 \end{array} \right\} \rightarrow \{4 \rightarrow 0.0000302967, 3 \rightarrow 0.99997\},$

$\left\{ \begin{array}{l} \text{A 2D grid of black, cyan, and magenta pixels} \\ \rightarrow 10\,284\,081 \end{array} \right\} \rightarrow \{4 \rightarrow 0.0000121386, 3 \rightarrow 0.999988\},$

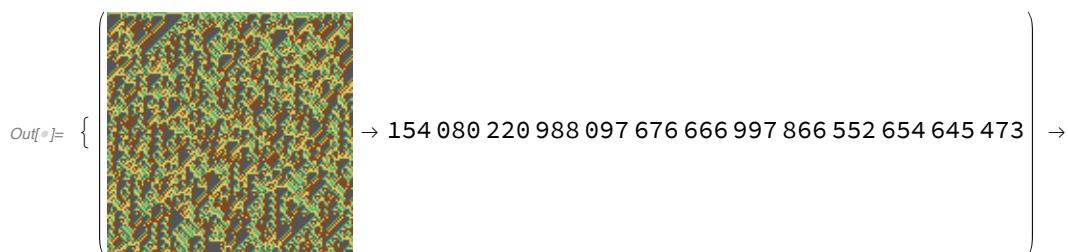
$\left\{ \begin{array}{l} \text{A uniform blue square} \\ \rightarrow 3\,664\,255 \end{array} \right\} \rightarrow \{1 \rightarrow 0.0137727, 2 \rightarrow 0.986227\},$

$\left\{ \begin{array}{l} \text{A 2D grid of black, green, and magenta pixels} \\ \rightarrow 10\,298\,881 \end{array} \right\} \rightarrow \{4 \rightarrow 0.000133186, 3 \rightarrow 0.999867\},$

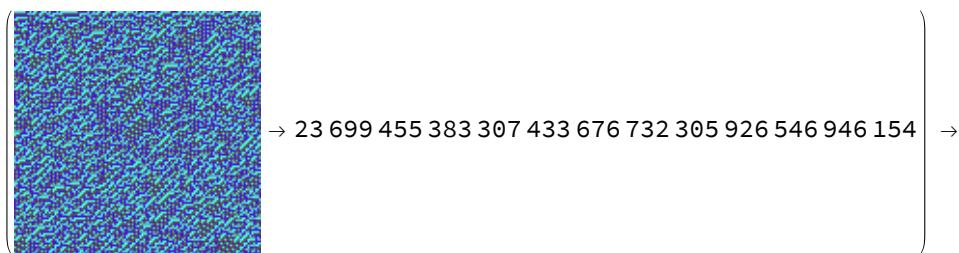


4-colour non-totalistic, range 1

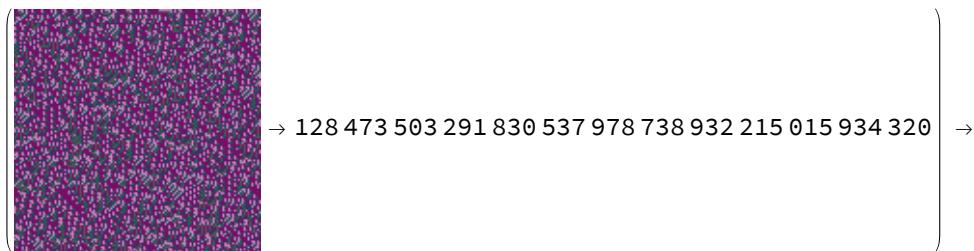
```
In[]:= test4Data4kr1C16 = datak4r1NT[128, 128, 8];
Thread[
  test4Data4kr1C16 → netECA16[Keys@test4Data4kr1C16, {"TopProbabilities", 2}]]
```



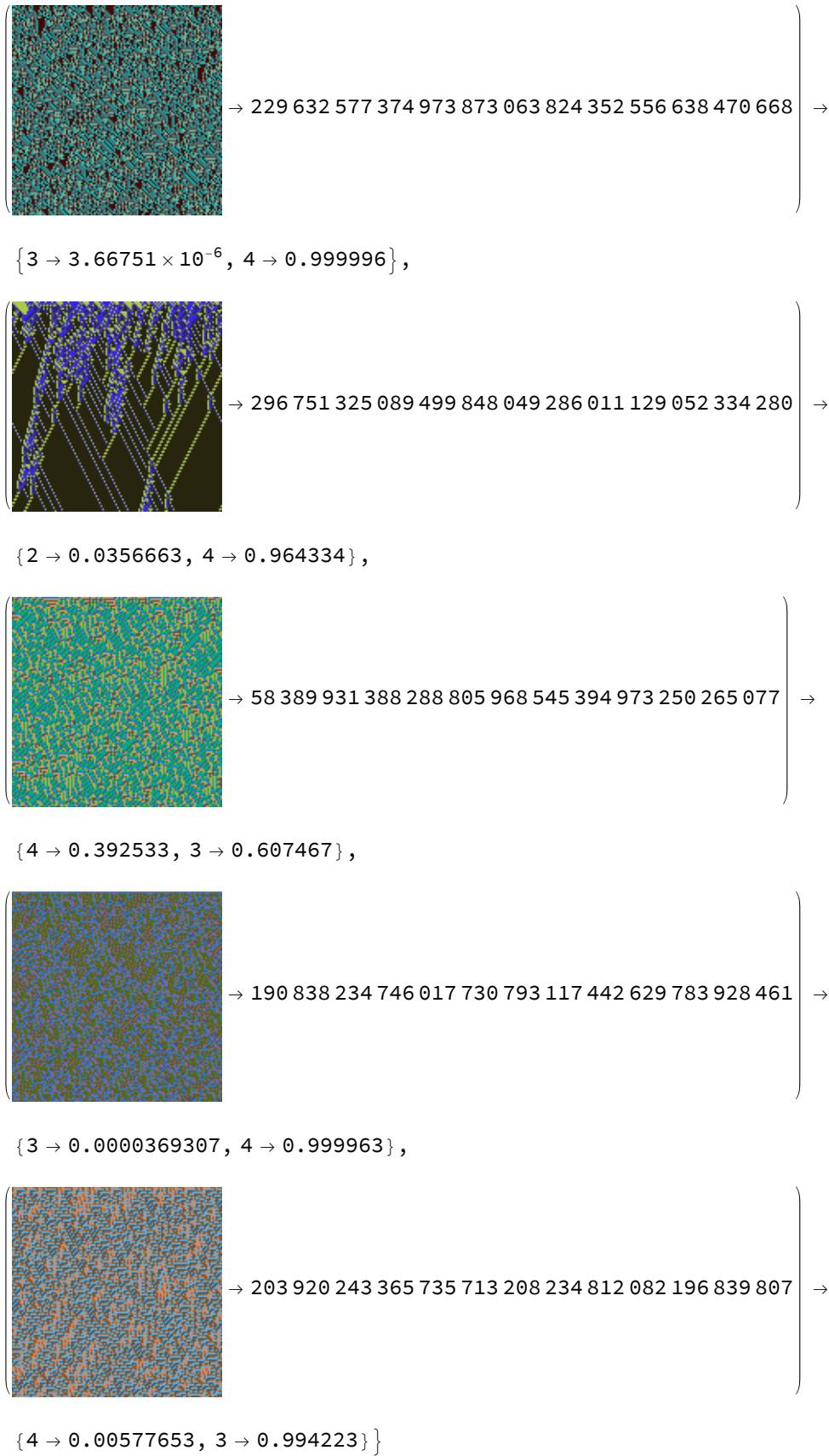
$$\{3 \rightarrow 2.29402 \times 10^{-6}, 4 \rightarrow 0.999998\},$$



$$\{4 \rightarrow 9.18698 \times 10^{-10}, 3 \rightarrow 1.\},$$

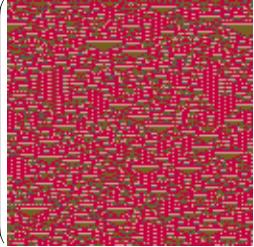


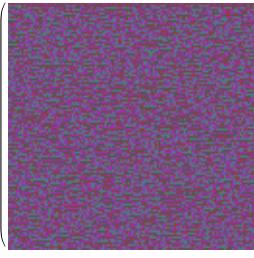
$$\{4 \rightarrow 0.016884, 3 \rightarrow 0.983116\},$$

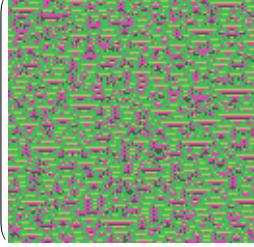


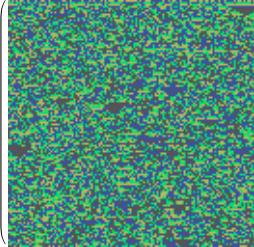
4-colour totalistic, range 2

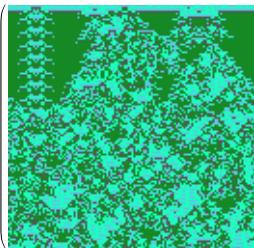
```
In[®]:= test4Data4kr2C16 = datak4r2C[128, 128, 8];
Thread[
  test4Data4kr2C16 → netECA16[Keys@test4Data4kr2C16, {"TopProbabilities", 2}]]
```

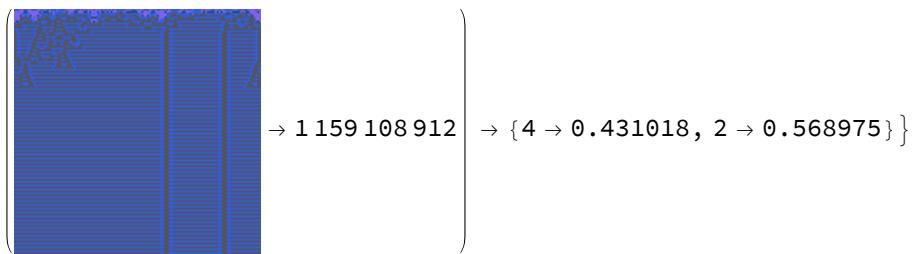
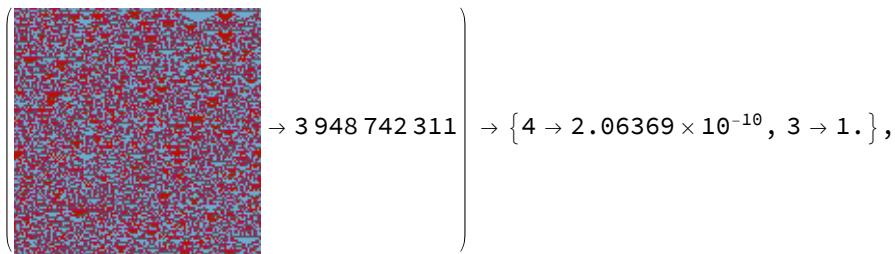
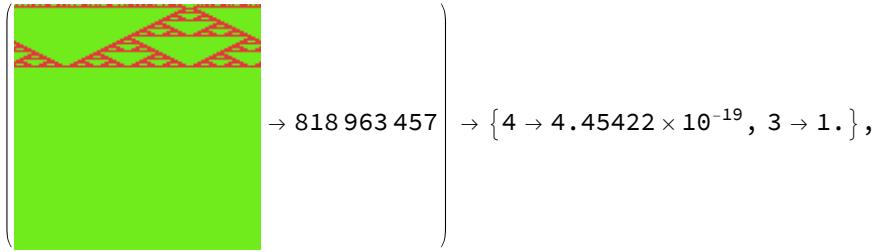
Out[®]= { → 25 517 204} → {4 → 1.29127 × 10⁻¹³, 3 → 1.},

{ → 3 053 925 273} → {4 → 0.00215091, 3 → 0.997849},

{ → 2 735 868 989} → {4 → 0.000282149, 3 → 0.999718},

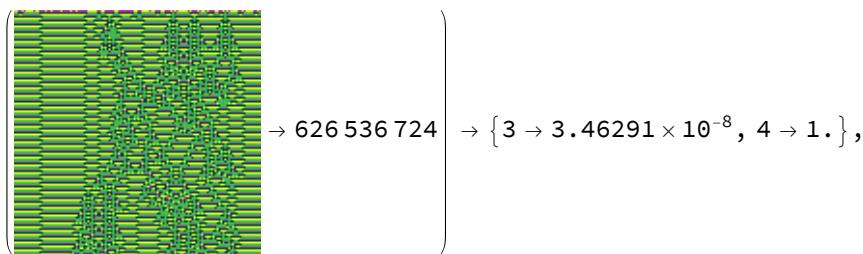
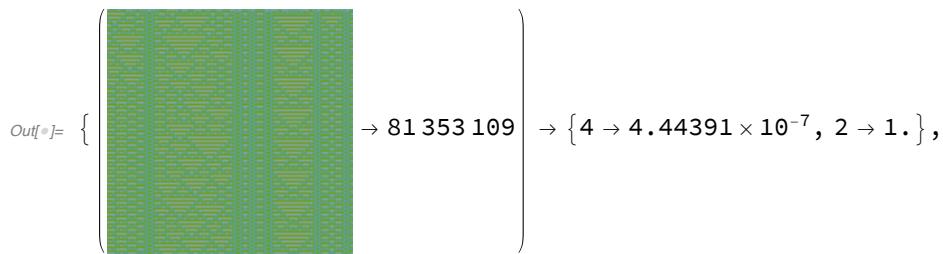
{ → 1 440 927 950} → {4 → 0.0889018, 3 → 0.911098},

{ → 3 727 816 705} → {3 → 2.78599 × 10⁻⁷, 4 → 1.},



5-colour totalistic, range 1

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



$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 129\,595\,314 \end{array} \right) \rightarrow \{4 \rightarrow 0.00257287, 3 \rightarrow 0.997427\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors with a vertical column of pink dots on the left]} \\ \rightarrow 513\,885\,470 \end{array} \right) \rightarrow \{1 \rightarrow 1.41572 \times 10^{-11}, 2 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors with a vertical column of green dots on the left]} \\ \rightarrow 494\,894\,021 \end{array} \right) \rightarrow \{3 \rightarrow 0.0136503, 4 \rightarrow 0.98635\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors with a vertical column of red dots on the left]} \\ \rightarrow 459\,414\,632 \end{array} \right) \rightarrow \{4 \rightarrow 0.0000813289, 3 \rightarrow 0.999919\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors with a vertical column of blue dots on the left]} \\ \rightarrow 327\,281\,621 \end{array} \right) \rightarrow \{4 \rightarrow 2.29489 \times 10^{-8}, 3 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors with a vertical column of orange dots on the left]} \\ \rightarrow 503\,044\,041 \end{array} \right) \rightarrow \{4 \rightarrow 0.191949, 3 \rightarrow 0.808051\}$$

6-colour totalistic, range 1

```
In[]:= test4Data6kr1C16 = data6TC[8, 128, 128];
Thread[
  test4Data6kr1C16 → netECA16[Keys@test4Data6kr1C16, {"TopProbabilities", 2}]]
```

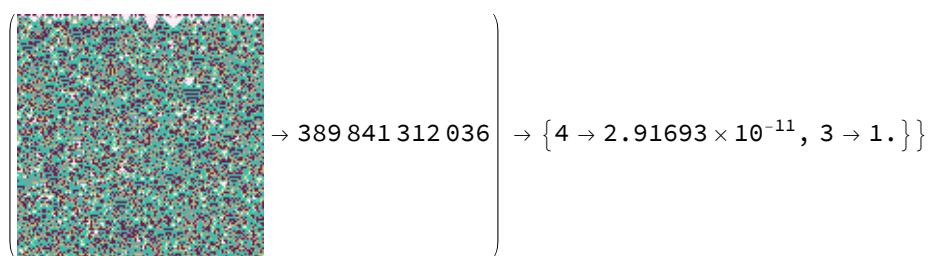
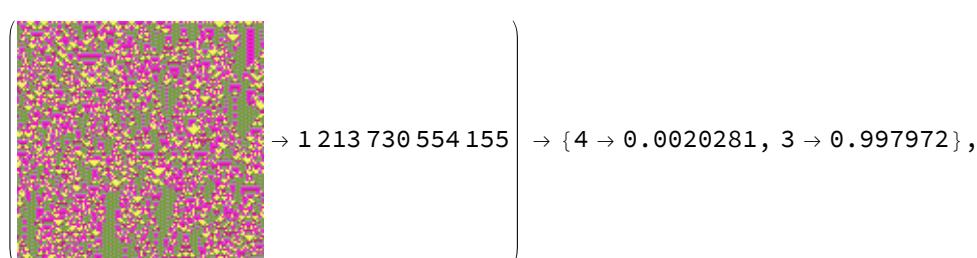
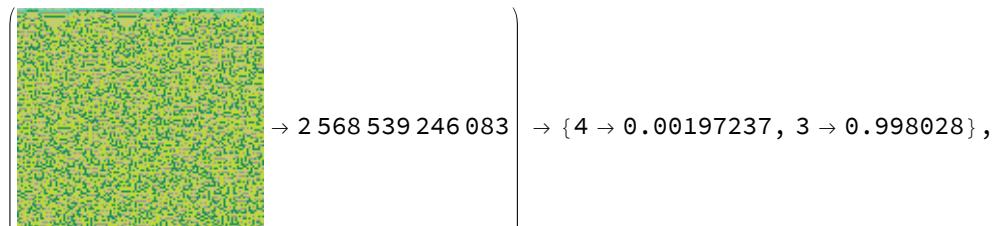
$$\text{Out}[]= \left\{ \begin{array}{c} \text{[A 128x128 grid of 6 colors]} \\ \rightarrow 1522715109251 \end{array} \right\} \rightarrow \{4 \rightarrow 2.02852 \times 10^{-8}, 3 \rightarrow 1.\},$$

$$\left\{ \begin{array}{c} \text{[A 128x128 grid of 6 colors]} \\ \rightarrow 1026953898330 \end{array} \right\} \rightarrow \{4 \rightarrow 2.88279 \times 10^{-8}, 3 \rightarrow 1.\},$$

$$\left\{ \begin{array}{c} \text{[A 128x128 grid of 6 colors]} \\ \rightarrow 1583652682 \end{array} \right\} \rightarrow \{3 \rightarrow 0.429972, 4 \rightarrow 0.570028\},$$

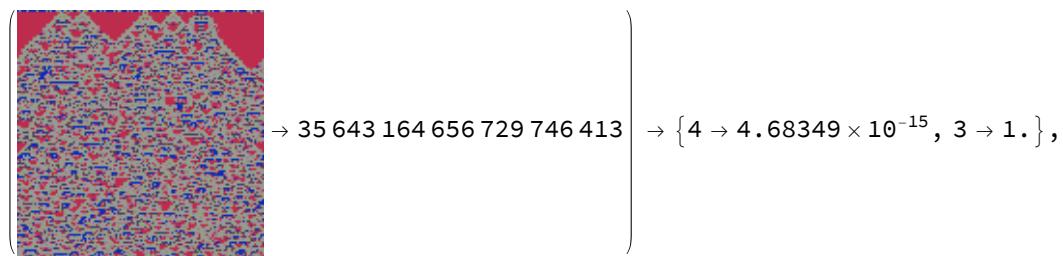
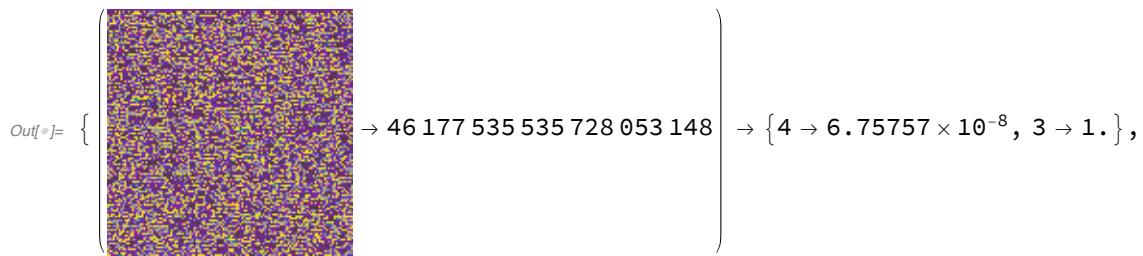
$$\left\{ \begin{array}{c} \text{[A 128x128 grid of 6 colors]} \\ \rightarrow 2123073201165 \end{array} \right\} \rightarrow \{4 \rightarrow 6.23239 \times 10^{-10}, 3 \rightarrow 1.\},$$

$$\left\{ \begin{array}{c} \text{[A 128x128 grid of 6 colors]} \\ \rightarrow 341591565791 \end{array} \right\} \rightarrow \{4 \rightarrow 0.00212154, 3 \rightarrow 0.997878\},$$



6-colour totalistic, range 2

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



$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 151\ 294\ 335\ 263\ 255\ 298\ 785 \end{array} \right) \rightarrow \{4 \rightarrow 0.0673459, 3 \rightarrow 0.932654\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 8\ 803\ 703\ 818\ 914\ 948\ 546 \end{array} \right) \rightarrow \{4 \rightarrow 0.00560205, 3 \rightarrow 0.994398\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 46\ 723\ 275\ 025\ 483\ 150\ 950 \end{array} \right) \rightarrow \{4 \rightarrow 0.00307226, 3 \rightarrow 0.996928\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 72\ 312\ 079\ 279\ 485\ 910\ 528 \end{array} \right) \rightarrow \{4 \rightarrow 0.00153324, 3 \rightarrow 0.998467\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 22\ 158\ 237\ 683\ 799\ 083\ 047 \end{array} \right) \rightarrow \{4 \rightarrow 3.51784 \times 10^{-13}, 3 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 142\ 446\ 781\ 366\ 136\ 429\ 283 \end{array} \right) \rightarrow \{4 \rightarrow 3.01302 \times 10^{-11}, 3 \rightarrow 1.\}$$

7-colour totalistic, range 1

```
In[]:= test4Data7kr1C16 = data7TC[8, 128, 128];
Thread[
  test4Data7kr1C16 → netECA16[Keys@test4Data7kr1C16, {"TopProbabilities", 2}]]
```

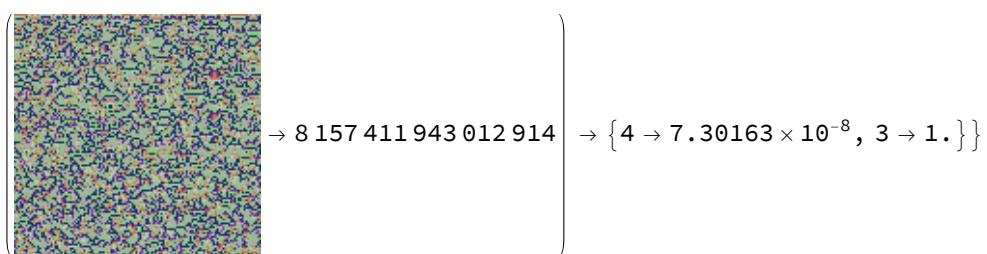
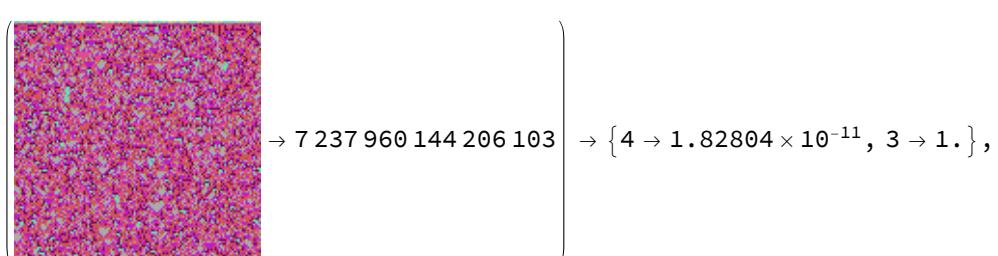
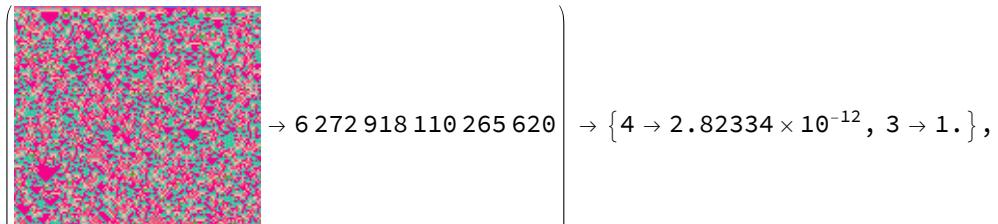
Out[]:= $\left\{ \begin{array}{c} \text{A 128x128 grid of 7 colors (red, green, blue, cyan, magenta, yellow, black)} \\ \rightarrow 3109608593887262 \end{array} \right\} \rightarrow \{2 \rightarrow 0.0267983, 4 \rightarrow 0.973202\},$

Out[]:= $\left\{ \begin{array}{c} \text{A 128x128 grid of 7 colors (red, green, blue, cyan, magenta, yellow, black)} \\ \rightarrow 10516337788191339 \end{array} \right\} \rightarrow \{4 \rightarrow 0.202783, 3 \rightarrow 0.797217\},$

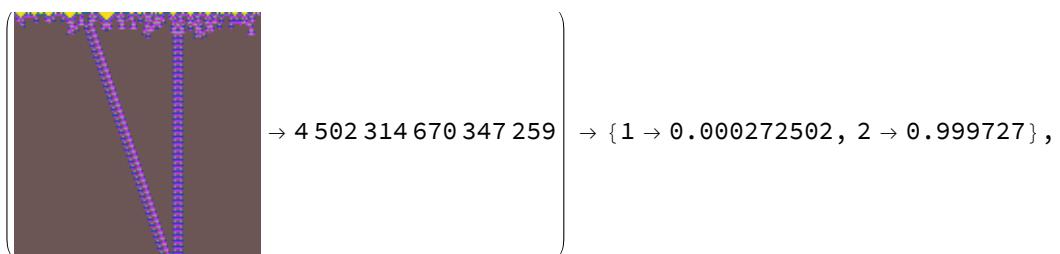
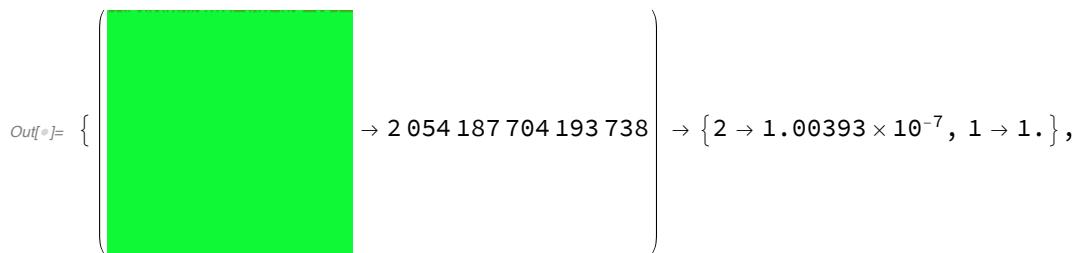
Out[]:= $\left\{ \begin{array}{c} \text{A 128x128 grid of 7 colors (red, green, blue, cyan, magenta, yellow, black)} \\ \rightarrow 10218434972470056 \end{array} \right\} \rightarrow \{4 \rightarrow 2.59313 \times 10^{-9}, 3 \rightarrow 1.\},$

Out[]:= $\left\{ \begin{array}{c} \text{A 128x128 grid of 7 colors (red, green, blue, cyan, magenta, yellow, black)} \\ \rightarrow 11301098979433534 \end{array} \right\} \rightarrow \{4 \rightarrow 5.31247 \times 10^{-20}, 3 \rightarrow 1.\},$

Out[]:= $\left\{ \begin{array}{c} \text{A 128x128 grid of 7 colors (red, green, blue, cyan, magenta, yellow, black)} \\ \rightarrow 4222218586098008 \end{array} \right\} \rightarrow \{4 \rightarrow 2.3505 \times 10^{-8}, 3 \rightarrow 1.\},$



```
In[④]:= test4Data7kr1C16 = data7TC[8, 128, 128];
Thread[
  test4Data7kr1C16 → netECA16[Keys@test4Data7kr1C16, {"TopProbabilities", 2}]]
```



$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 6\ 433\ 286\ 718\ 439\ 853 \end{array} \right) \rightarrow \left\{ 4 \rightarrow 3.57308 \times 10^{-13}, 3 \rightarrow 1. \right\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 10\ 115\ 271\ 094\ 201\ 812 \end{array} \right) \rightarrow \left\{ 4 \rightarrow 1.83956 \times 10^{-14}, 3 \rightarrow 1. \right\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 2\ 056\ 629\ 839\ 849\ 700 \end{array} \right) \rightarrow \left\{ 4 \rightarrow 7.03567 \times 10^{-6}, 2 \rightarrow 0.999993 \right\},$$

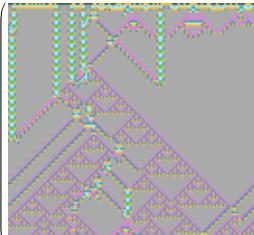
$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 6\ 016\ 684\ 767\ 156\ 829 \end{array} \right) \rightarrow \left\{ 4 \rightarrow 0.0021258, 3 \rightarrow 0.997874 \right\},$$

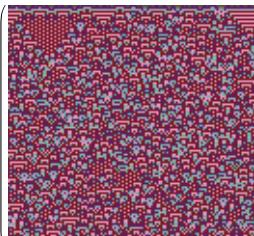
$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 1\ 150\ 898\ 749\ 617\ 983 \end{array} \right) \rightarrow \left\{ 4 \rightarrow 5.05985 \times 10^{-9}, 3 \rightarrow 1. \right\},$$

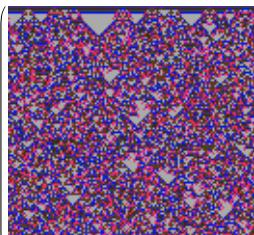
$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 3\ 441\ 885\ 208\ 643\ 463 \end{array} \right) \rightarrow \left\{ 3 \rightarrow 1.57168 \times 10^{-8}, 2 \rightarrow 1. \right\}$$

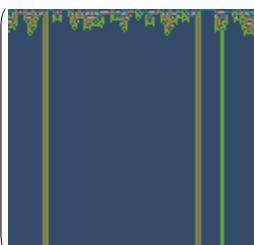
```
In[8]:= test4Data7kr1C16 = data7TC[8, 128, 128];
Thread[
  test4Data7kr1C16 → netECA16[Keys@test4Data7kr1C16, {"TopProbabilities", 2}]]
```

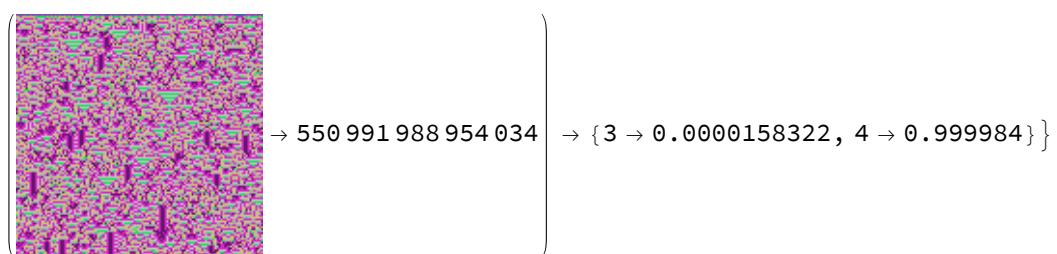
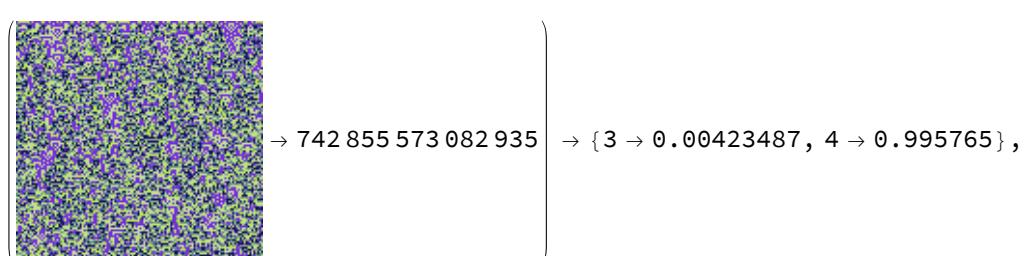
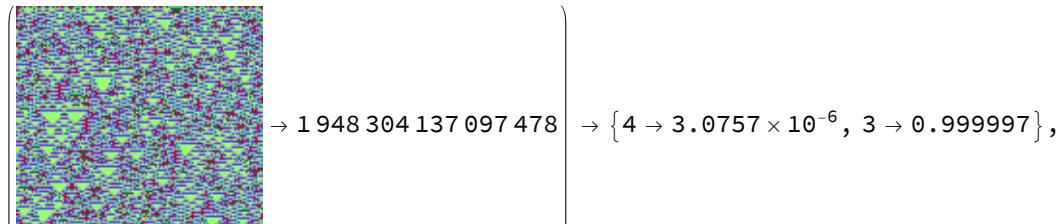
Out[8]= { → 8 718 538 805 570 808 } → {4 → 0.0199047, 2 → 0.980095},

{ → 5 687 458 247 703 346 } → {3 → 3.931 × 10⁻⁶, 4 → 0.999995},

{ → 2 004 300 484 518 722 } → {3 → 0.0438658, 4 → 0.956134},

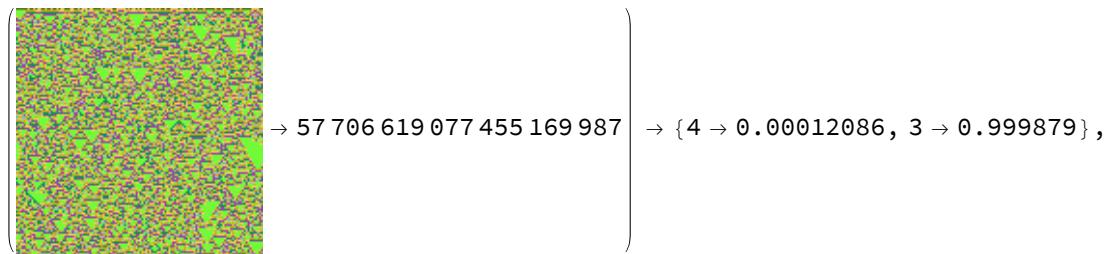
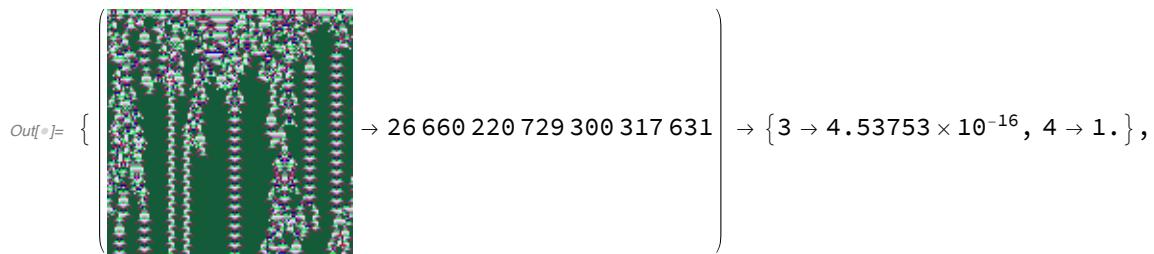
{ → 2 106 485 862 858 275 } → {4 → 3.36807 × 10⁻¹⁰, 3 → 1.},

{ → 10 335 102 717 390 268 } → {4 → 1.40275 × 10⁻⁹, 2 → 1.},



8-colour totalistic, range 1

```
In[]:= test4Data8kr1C16 = data8TC[8, 128, 128];
Thread[
  test4Data8kr1C16 \[Function] netECA16[Keys@test4Data8kr1C16, {"TopProbabilities", 2}]]
```



$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 64\ 248\ 301\ 738\ 433\ 598\ 883 \end{array} \right) \rightarrow \{4 \rightarrow 8.62498 \times 10^{-7}, 3 \rightarrow 0.999999\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 38\ 309\ 191\ 234\ 358\ 472\ 181 \end{array} \right) \rightarrow \{3 \rightarrow 0.0920227, 4 \rightarrow 0.907977\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 10\ 057\ 418\ 236\ 647\ 939\ 786 \end{array} \right) \rightarrow \{3 \rightarrow 0.00153869, 4 \rightarrow 0.998461\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 55\ 038\ 816\ 396\ 722\ 824\ 044 \end{array} \right) \rightarrow \{4 \rightarrow 7.93818 \times 10^{-11}, 3 \rightarrow 1.\},$$

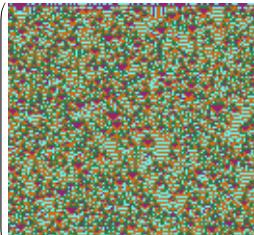
$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 13\ 857\ 790\ 822\ 319\ 662\ 750 \end{array} \right) \rightarrow \{4 \rightarrow 1.6375 \times 10^{-9}, 2 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 35\ 001\ 739\ 471\ 058\ 241\ 746 \end{array} \right) \rightarrow \{3 \rightarrow 0.146189, 4 \rightarrow 0.853811\}$$

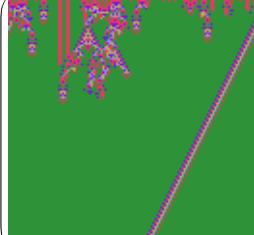
```
In[8]:= test4Data8kr1C16 = data8TC[8, 128, 128];
Thread[
  test4Data8kr1C16 → netECA16[Keys@test4Data8kr1C16, {"TopProbabilities", 2}]]
```

Out[8]= { → 8 889 571 206 431 822 669}

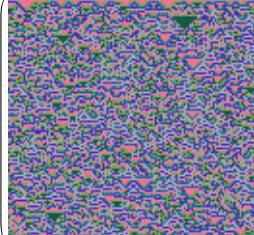
$$\rightarrow \{4 \rightarrow 7.71651 \times 10^{-13}, 3 \rightarrow 1.\},$$

 → 12 932 107 158 159 577 869

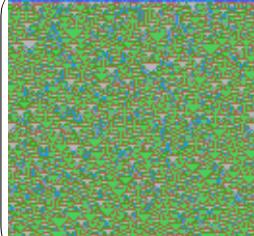
$$\rightarrow \{4 \rightarrow 0.000487127, 3 \rightarrow 0.999513\},$$

 → 38 300 014 541 797 689 408

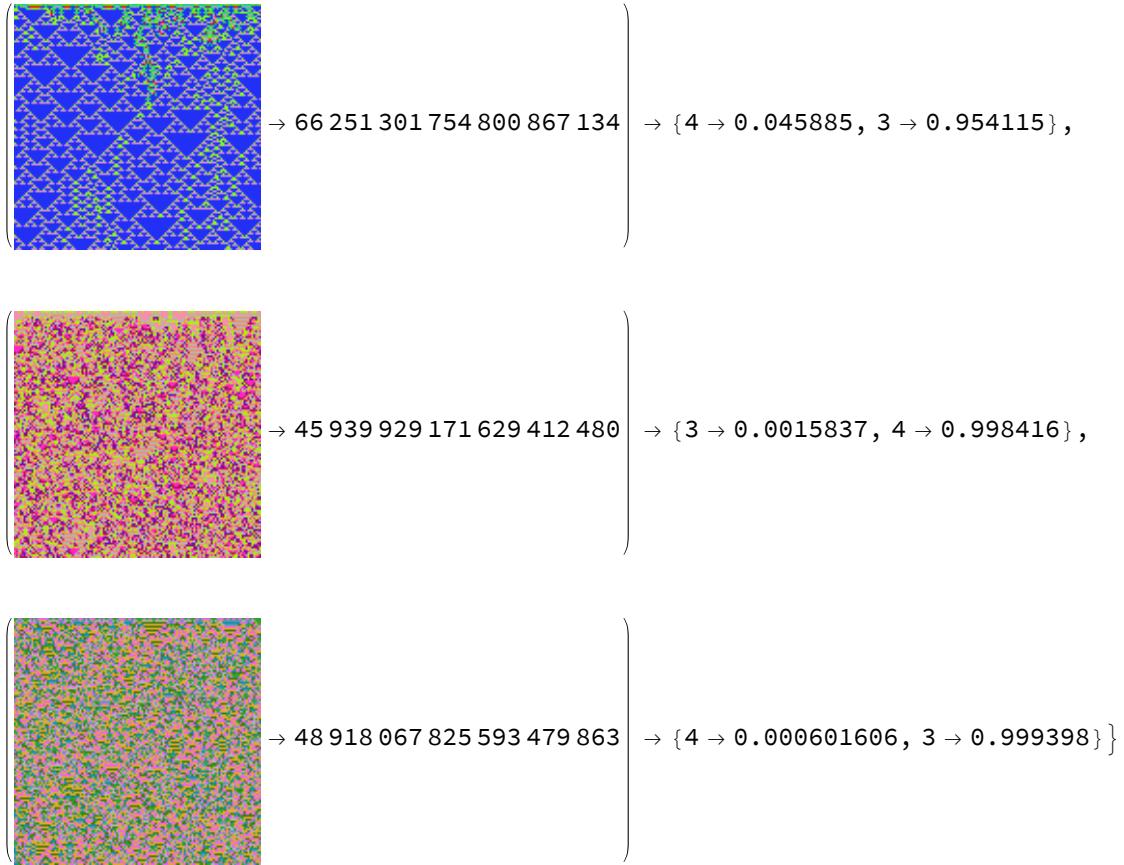
$$\rightarrow \{2 \rightarrow 4.40131 \times 10^{-9}, 4 \rightarrow 1.\},$$

 → 73 619 662 786 582 031 542

$$\rightarrow \{4 \rightarrow 2.6954 \times 10^{-22}, 3 \rightarrow 1.\},$$

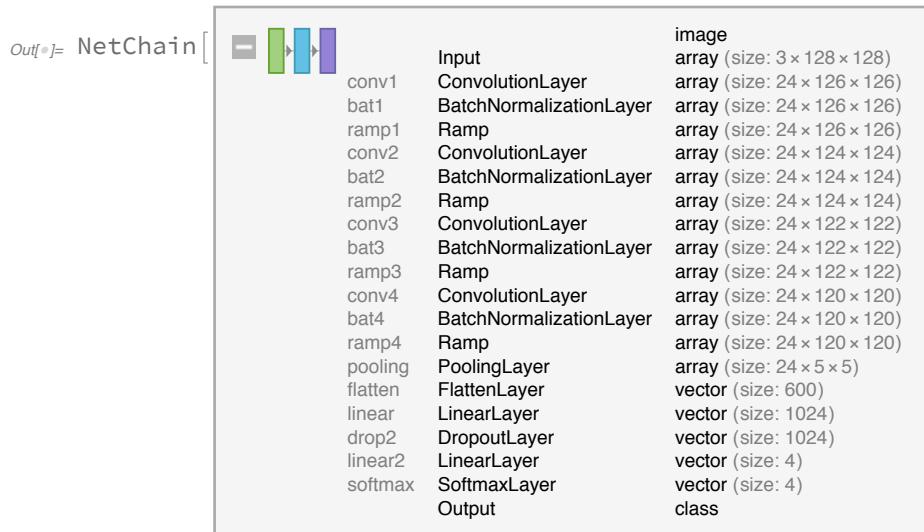
 → 25 075 664 454 379 326 631

$$\rightarrow \{4 \rightarrow 2.7484 \times 10^{-6}, 3 \rightarrow 0.999997\},$$

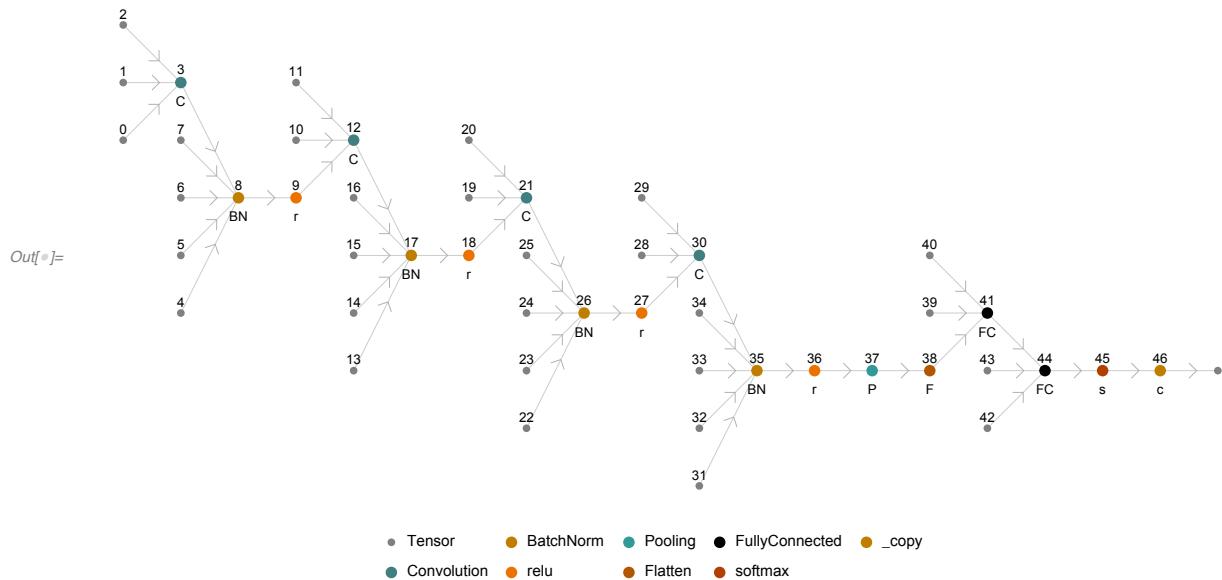


Network XVII - Four convolutions, dropout on linear only, BatchNorm

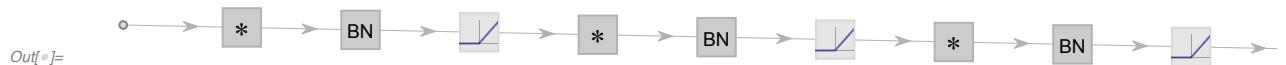
```
In[6]:= netECA17 = netTenCC1024drop[128, 128]
```



In[1]:= NetInformation[netECA17, "MXNetNodeGraphPlot"]



In[2]:= NetInformation[netECA17, "SummaryGraphic"]



In[3]:= dataECA17 = dataC[128, 128, 16 384];

In[4]:= dataTotalistic2BigC17 = genData2r2C[128, 128, 2048];

In[5]:= dataTotalistic3BigC17 = data3T2C[128, 128, 2048];

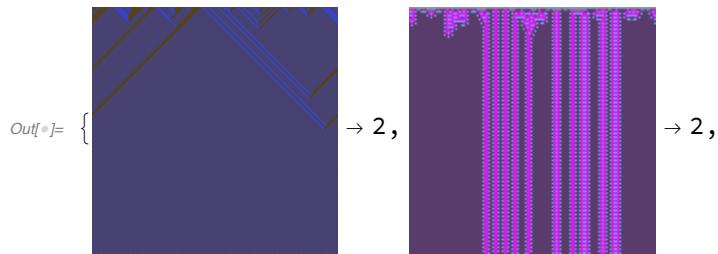
In[6]:= dataTotalistic4BigC17 = data4TC[128, 128, 2048];

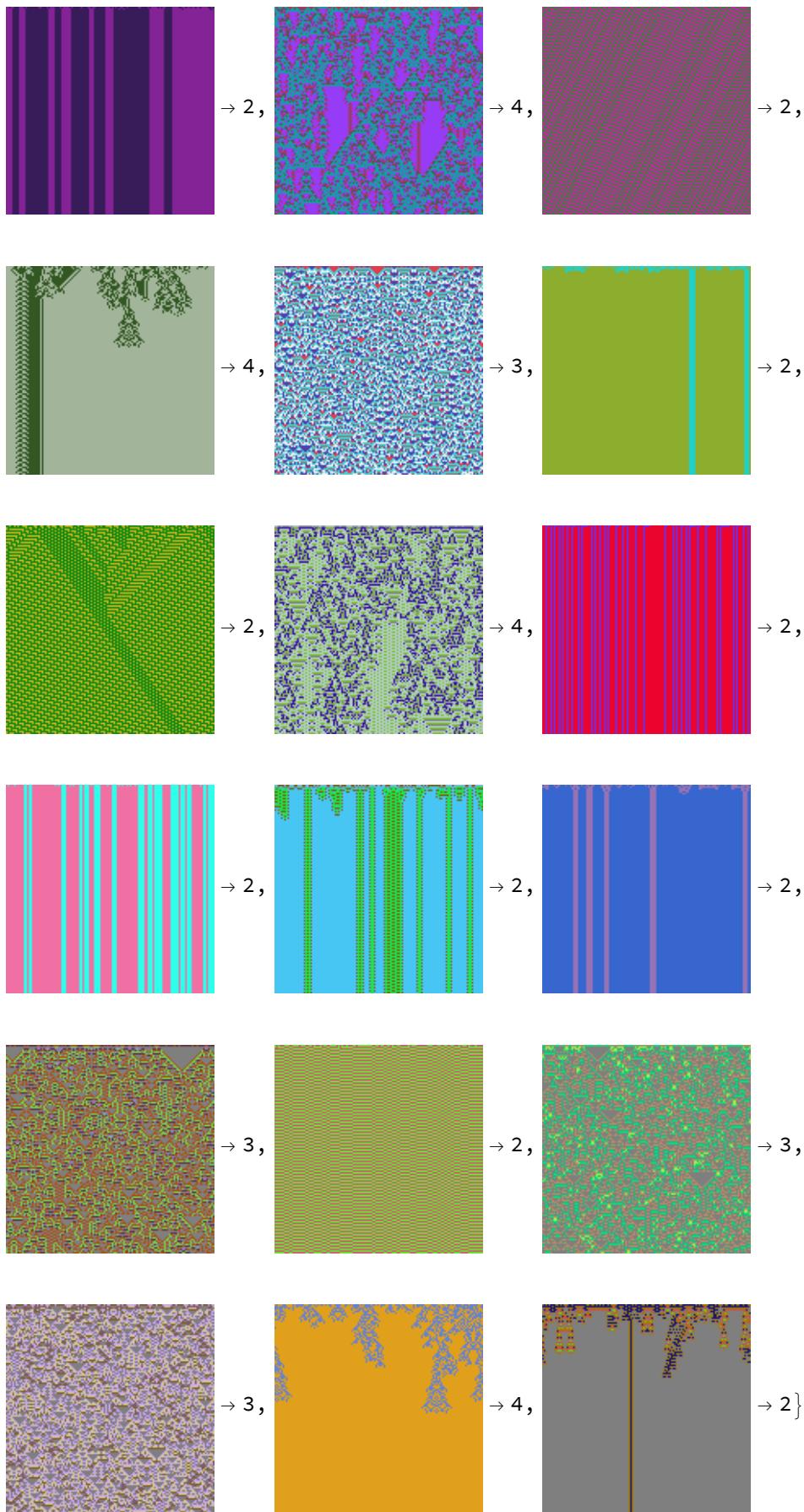
In[7]:= dataTotalistic5BigC17 = genData5TCC[128, 128, 8192];

In[8]:= fullTrainingBigC17 = Join[dataECA17, dataTotalistic2BigC17,
dataTotalistic3BigC17, dataTotalistic4BigC17, dataTotalistic5BigC17];
Length[fullTrainingBigC17]

Out[8]= 53 248

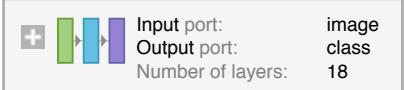
In[9]:= RandomSample[fullTrainingBigC17, 20]





```
In[®]:= dir = SetDirectory[NotebookDirectory[]]
In[®]:= "/home/esilverman/Documents"
Out[®]= /home/esilverman/Documents

In[®]:= netECA17 = NetTrain[netECA17, fullTrainingBigC17,
  MaxTrainingRounds → 200, BatchSize → 256, TargetDevice → "GPU",
  TrainingProgressCheckpointing → {"Directory", dir}]
```

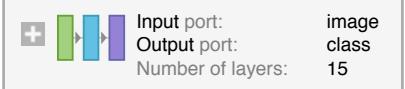
Out[®]= NetChain[]

```
netECA17 = Import["netECA17-r200.wlnet"]
```

Generate test data for Network XVII (200 epochs)

```
In[®]:= dir = SetDirectory[NotebookDirectory[]]
Out[®]= /Users/thorsilver/Downloads/Wolfram notebooks
```

```
netECA17 = Import["netECA17-r200.wlnet"]
```

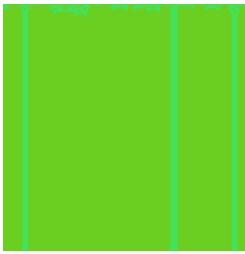
Out[®]= NetChain[]

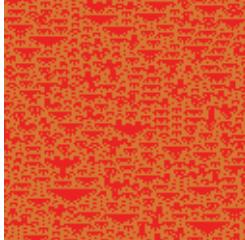
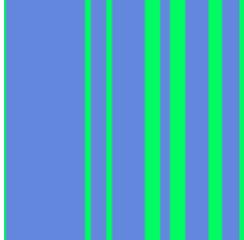
```
In[®]:= testDataECABigC = dataC[128, 128, 1024];
testData2TBigC = genData2r2C[128, 128, 1024];
testData3TBigC = data3T2C[128, 128, 1024];
testData4TBigC = data4TC[128, 128, 1024];
testData5TBigC = genData5TCC[128, 128, 1024];
fullTestSetBigC = Join[testDataECABigC,
  testData2TBigC, testData3TBigC, testData4TBigC, testData5TBigC];
Length[fullTestSetBigC]
```

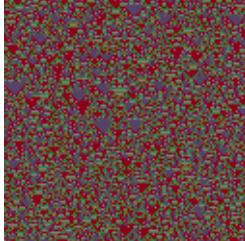
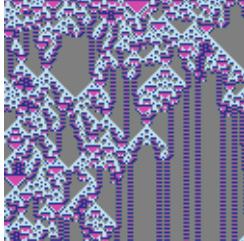
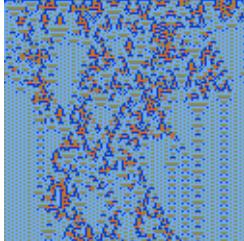
Out[®]= 10 240

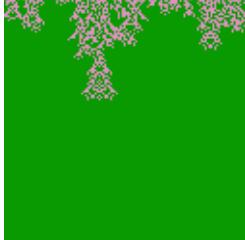
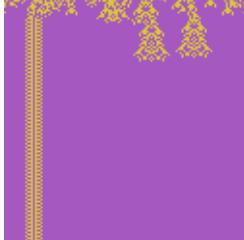
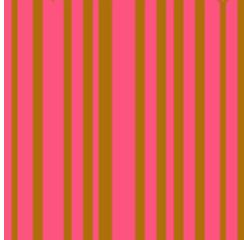
In[8]:= RandomSample[fullTestSetBigC, 10]

Out[8]= {

 → 2,  → 4,

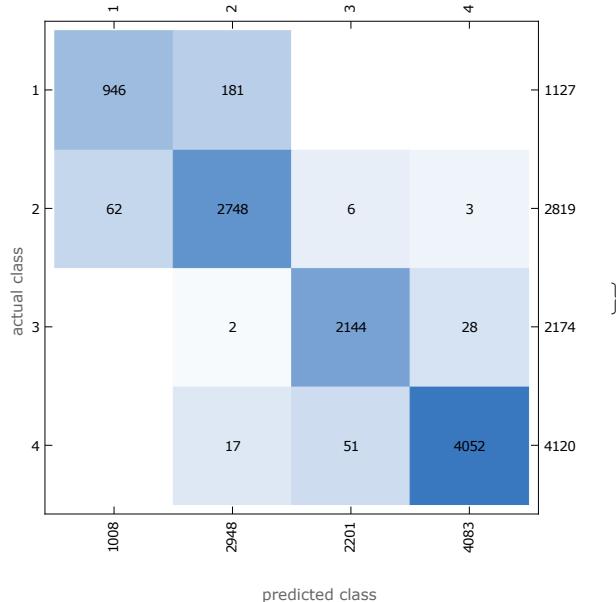
 → 3,  → 2,

 → 3,  → 4,  → 4,

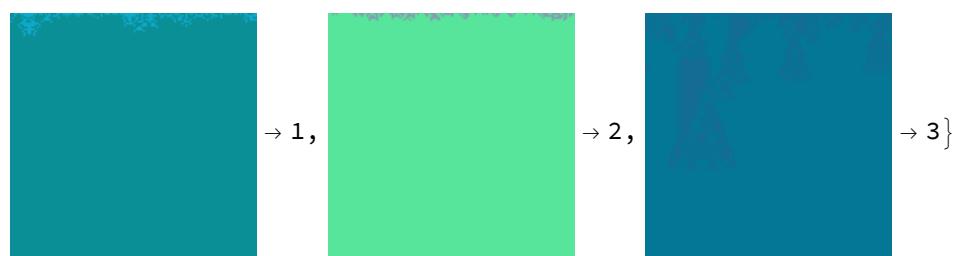
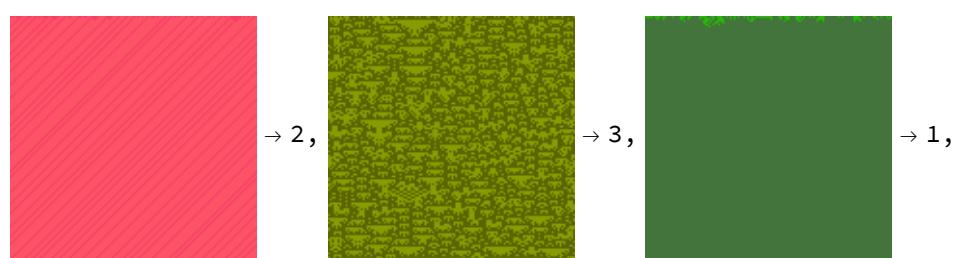
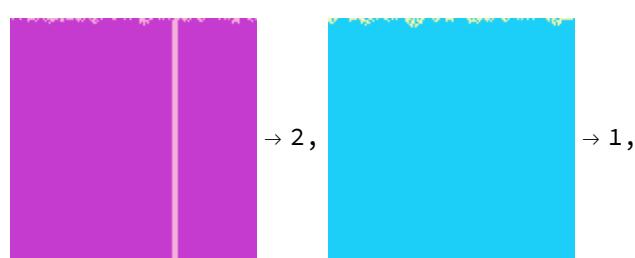
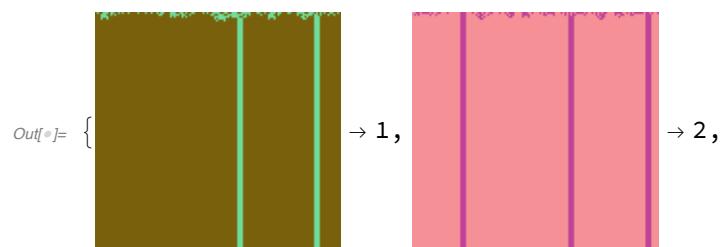
 → 4,  → 4,  → 2 }

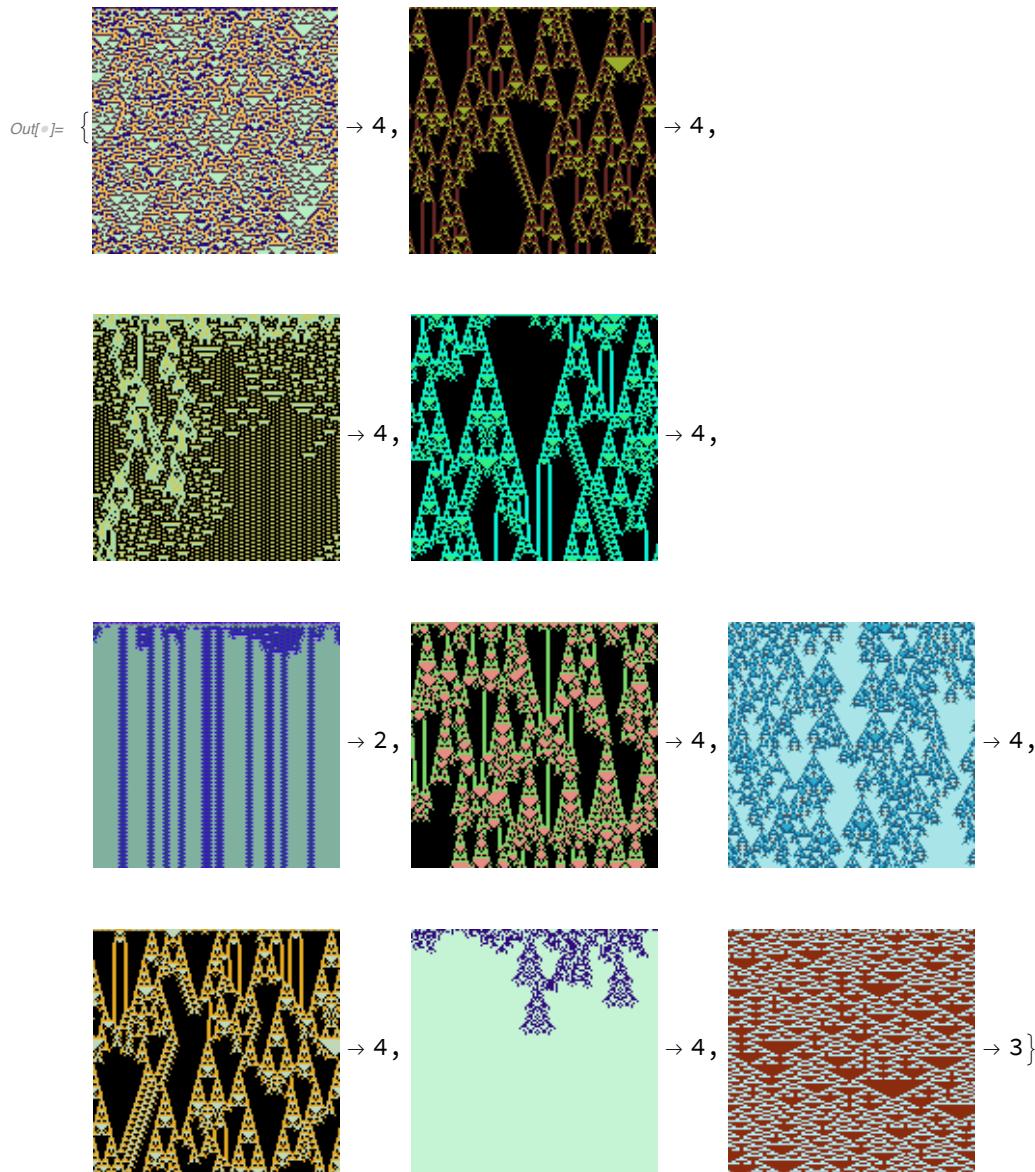
```
In[®]:= NetMeasurements[netECA17, fullTestSetBigC,
 {"Accuracy", "Precision", "ConfusionMatrixPlot"}]

Out[®]= {0.96582, {1 → 0.938492, 2 → 0.932157, 3 → 0.974103, 4 → 0.992408}, }
```



```
In[®]:= entropyImagesBigC = RandomSample[Keys[fullTestSetBigC], 500];
entropiesBigC = netECA17[entropyImagesBigC, "Entropy"];
highEntBigC = entropyImagesBigC[[Ordering[entropiesBigC, -10]]];
lowEntBigC = entropyImagesBigC[[Ordering[entropiesBigC, 10]]];
Thread[highEntBigC → netECA17[highEntBigC]]
Thread[lowEntBigC → netECA17[lowEntBigC]]
```





Testing Network XVII (200 epochs) on unseen CA rule spaces

2-colour non-totalistic, range 2

```
In[•]:= test4Data2kr2C17 = datak2r2C[128, 128, 8];
Thread[
  test4Data2kr2C17 → netECA17[Keys@test4Data2kr2C17, {"TopProbabilities", 2}]]
```

Out[•]:= {

The figure shows a large orange image with a diagonal pattern of fine lines. To its right is a label and a probability distribution:

$$\rightarrow 3\ 594\ 886\ 935 \rightarrow \{3 \rightarrow 1.19587 \times 10^{-7}, 2 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of yellow pixels]} \\ \rightarrow 4\ 012\ 014\ 789 \end{array} \right) \rightarrow \{ 4 \rightarrow 0.00317589, 3 \rightarrow 0.996824 \},$$

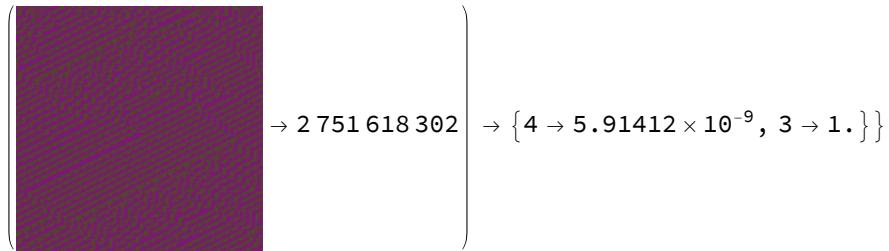
$$\left(\begin{array}{c} \text{[A 2x2 grid of red/pink pixels]} \\ \rightarrow 736\ 342\ 145 \end{array} \right) \rightarrow \{ 4 \rightarrow 0.000138652, 3 \rightarrow 0.999861 \},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of vertical blue and yellow bars]} \\ \rightarrow 3\ 597\ 938\ 931 \end{array} \right) \rightarrow \{ 4 \rightarrow 5.42024 \times 10^{-16}, 2 \rightarrow 1. \},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of horizontal blue and black bars]} \\ \rightarrow 49\ 406\ 137 \end{array} \right) \rightarrow \{ 1 \rightarrow 4.03179 \times 10^{-30}, 2 \rightarrow 1. \},$$

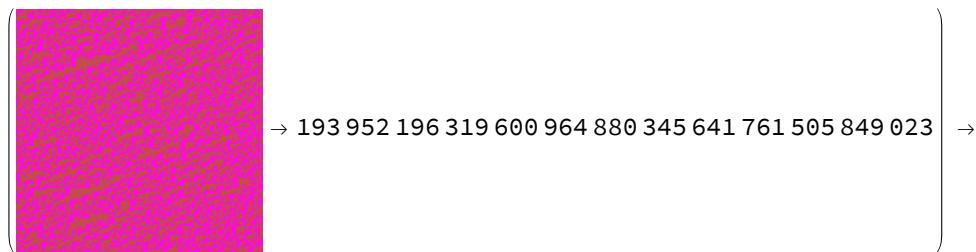
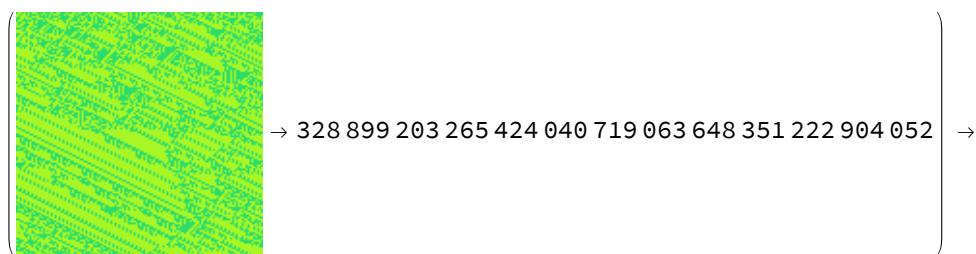
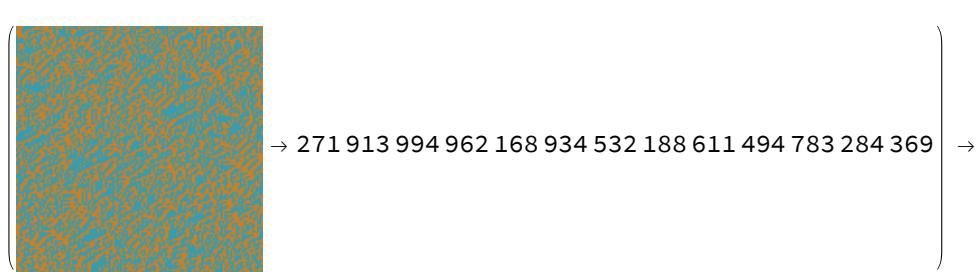
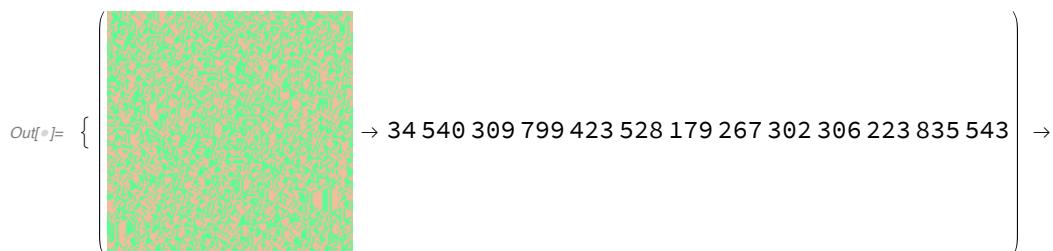
$$\left(\begin{array}{c} \text{[A 2x2 grid of green pixels with diagonal noise]} \\ \rightarrow 669\ 500\ 034 \end{array} \right) \rightarrow \{ 4 \rightarrow 0.0129747, 2 \rightarrow 0.983657 \},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of cyan pixels with vertical noise]} \\ \rightarrow 4\ 122\ 605\ 661 \end{array} \right) \rightarrow \{ 1 \rightarrow 6.18382 \times 10^{-9}, 2 \rightarrow 1. \},$$

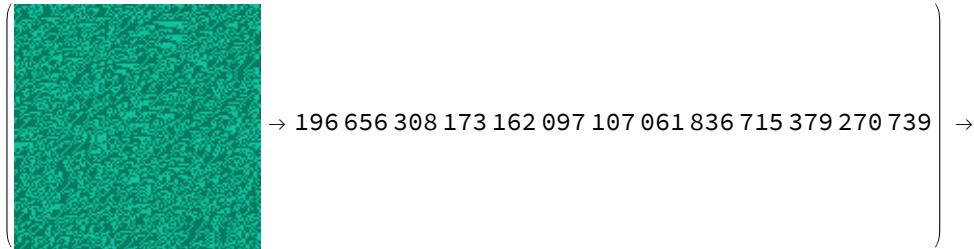


2-colour non-totalistic, range 3

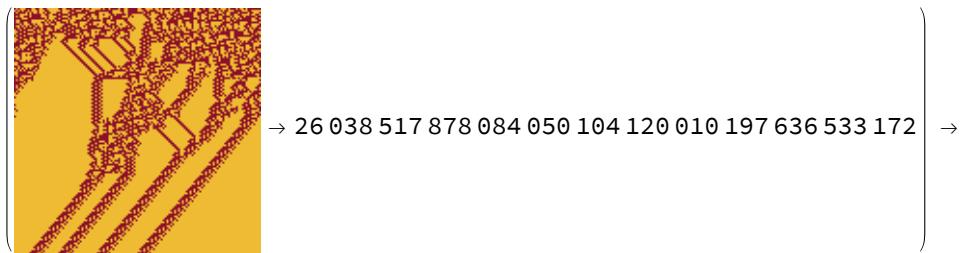
```
In[6]:= test4Data2kr3C17 = datak2r3NT[128, 128, 8];
Thread[
test4Data2kr3C17 → netECA17[Keys@test4Data2kr3C17, {"TopProbabilities", 2}]]
```



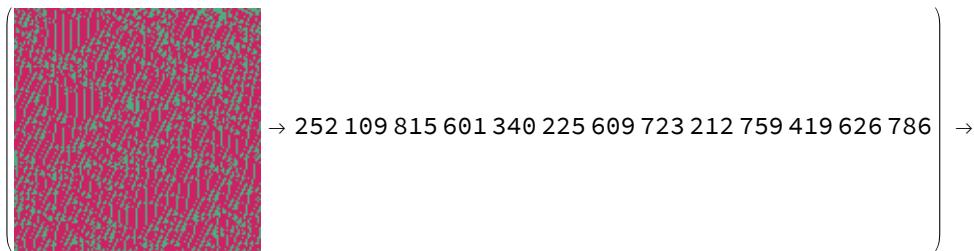
$$\{4 \rightarrow 8.96571 \times 10^{-10}, 3 \rightarrow 1.\},$$



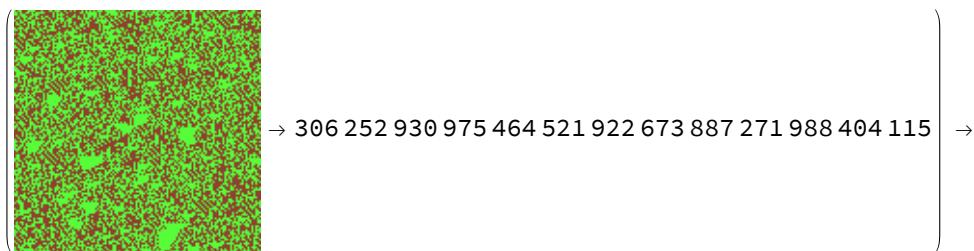
$$\{4 \rightarrow 3.36397 \times 10^{-6}, 3 \rightarrow 0.999997\},$$



$$\{3 \rightarrow 5.4757 \times 10^{-7}, 4 \rightarrow 0.999999\},$$



$$\{4 \rightarrow 1.35911 \times 10^{-8}, 3 \rightarrow 1.\},$$



$$\{4 \rightarrow 5.68649 \times 10^{-7}, 3 \rightarrow 0.999999\}\}$$

3-colour non-totalistic, range 1

```
In[6]:= test4Data3kr1C17 = datak3r1NT[128, 128, 8];
Thread[
test4Data3kr1C17 → netECA17[Keys@test4Data3kr1C17, {"TopProbabilities", 2}]]
```

Out[•]= $\left\{ \begin{array}{c} \text{[A purple square pattern]} \\ \rightarrow 1924646489567 \end{array} \right\} \rightarrow \{3 \rightarrow 1.76606 \times 10^{-30}, 2 \rightarrow 1.\},$

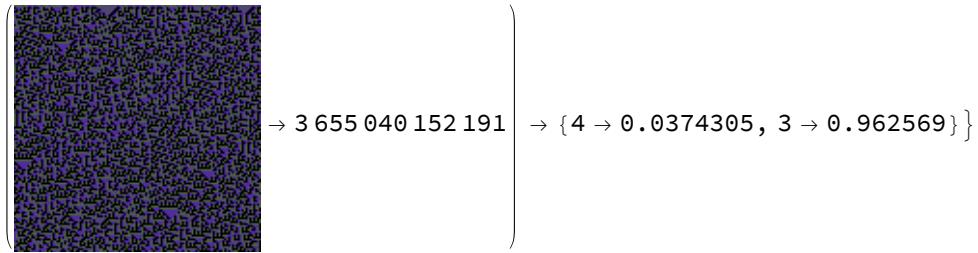
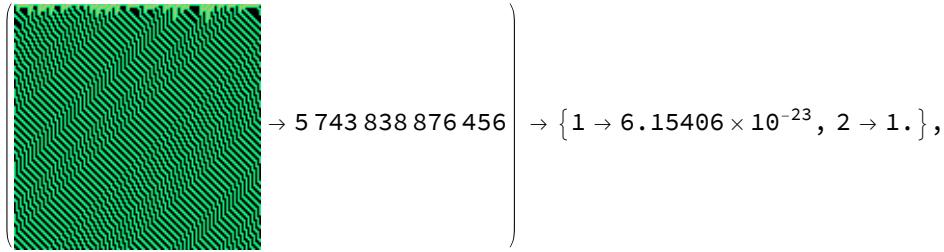
$\left\{ \begin{array}{c} \text{[A blue square pattern]} \\ \rightarrow 3672534501071 \end{array} \right\} \rightarrow \{2 \rightarrow 0.0000110699, 4 \rightarrow 0.999989\},$

$\left\{ \begin{array}{c} \text{[A pink square pattern]} \\ \rightarrow 5833330297781 \end{array} \right\} \rightarrow \{2 \rightarrow 0.000232935, 4 \rightarrow 0.999767\},$

$\left\{ \begin{array}{c} \text{[A black square pattern]} \\ \rightarrow 7606192973798 \end{array} \right\} \rightarrow \{2 \rightarrow 6.802 \times 10^{-10}, 1 \rightarrow 1.\},$

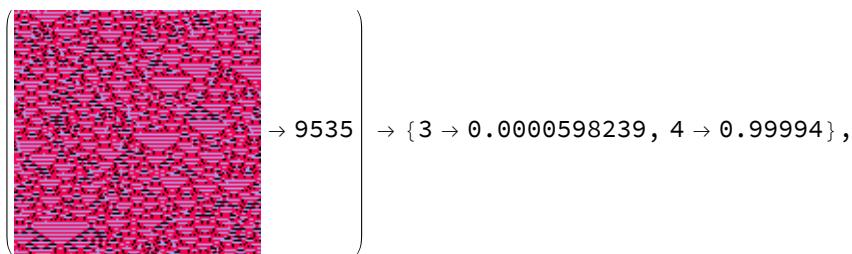
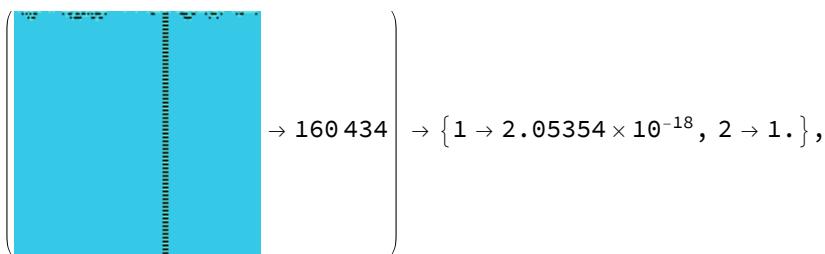
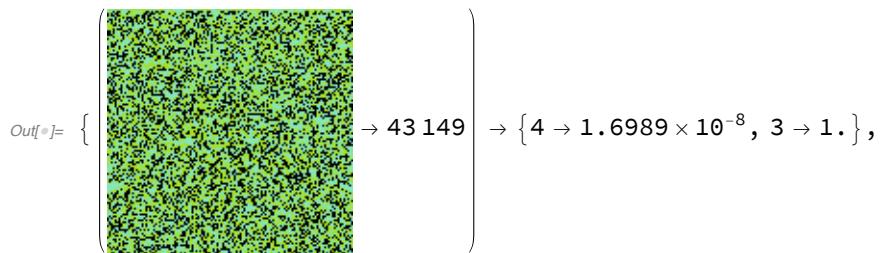
$\left\{ \begin{array}{c} \text{[A blue and orange square pattern]} \\ \rightarrow 7622301560954 \end{array} \right\} \rightarrow \{3 \rightarrow 0.0391643, 2 \rightarrow 0.960836\},$

$\left\{ \begin{array}{c} \text{[A red and yellow square pattern]} \\ \rightarrow 3685910174297 \end{array} \right\} \rightarrow \{3 \rightarrow 2.7602 \times 10^{-8}, 4 \rightarrow 1.\},$

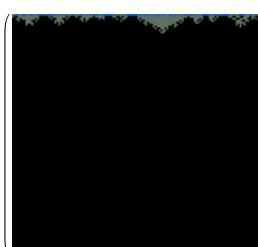


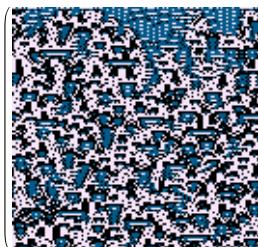
3-colour totalistic, range 2

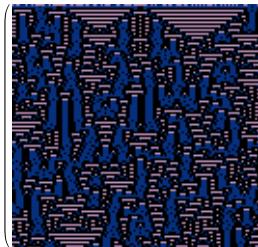
```
In[]:= test4Data3kr2C17 = datak3r2C[128, 128, 8];
Thread[
  test4Data3kr2C17 \[Rule] netECA17[Keys@test4Data3kr2C17, {"TopProbabilities", 2}]]
```

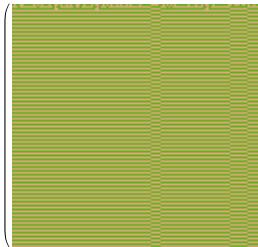


 → 172 239 } → { 1 → 0.00705153, 2 → 0.992948 },

 → 174 680 } → { 2 → 5.824 × 10⁻¹¹, 1 → 1. },

 → 55 945 } → { 4 → 0.0138349, 3 → 0.986165 },

 → 113 483 } → { 4 → 3.72822 × 10⁻⁶, 3 → 0.999996 },

 → 67 810 } → { 1 → 6.91386 × 10⁻¹⁷, 2 → 1. }

3-colour totalistic, range 3

```
In[④]:= test4Data3kr3C17 = datak3r3C[128, 128, 8];
Thread[
test4Data3kr3C17 → netECA17[Keys@test4Data3kr3C17, {"TopProbabilities", 2}]]
```

Out[•]= $\left\{ \begin{array}{l} \text{[A green noisy image]} \\ \rightarrow 3\ 046\ 610 \end{array} \right\} \rightarrow \{4 \rightarrow 7.58312 \times 10^{-7}, 3 \rightarrow 0.999999\},$

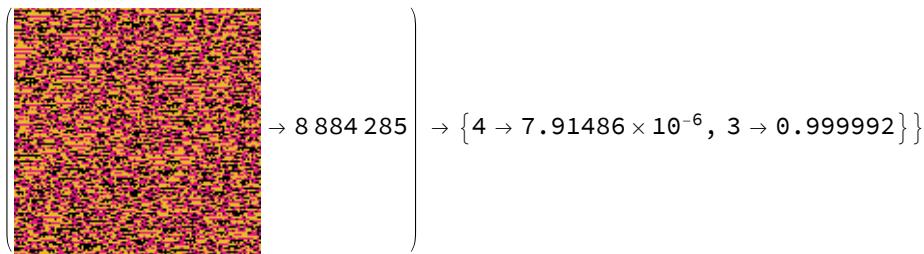
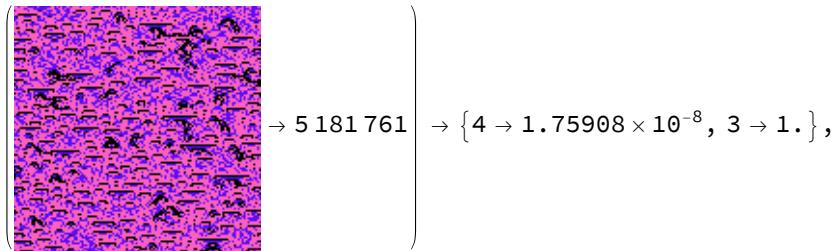
$\left\{ \begin{array}{l} \text{[A blue noisy image]} \\ \rightarrow 7\ 801\ 434 \end{array} \right\} \rightarrow \{1 \rightarrow 1.19167 \times 10^{-14}, 2 \rightarrow 1.\},$

$\left\{ \begin{array}{l} \text{[A blue and green noisy image]} \\ \rightarrow 5\ 445\ 843 \end{array} \right\} \rightarrow \{4 \rightarrow 1.60992 \times 10^{-19}, 3 \rightarrow 1.\},$

$\left\{ \begin{array}{l} \text{[A purple noisy image]} \\ \rightarrow 1\ 451\ 413 \end{array} \right\} \rightarrow \{4 \rightarrow 0.144413, 3 \rightarrow 0.855587\},$

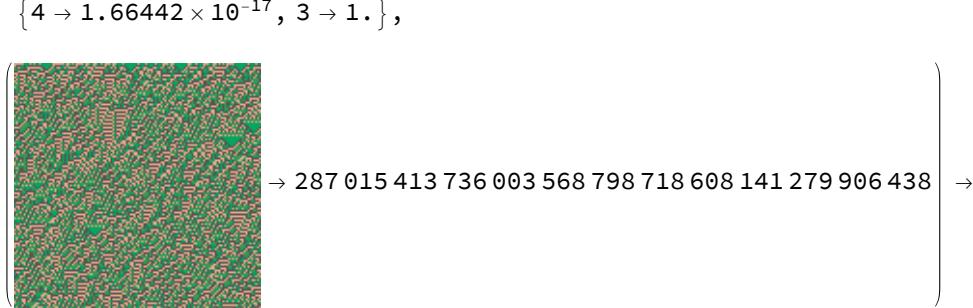
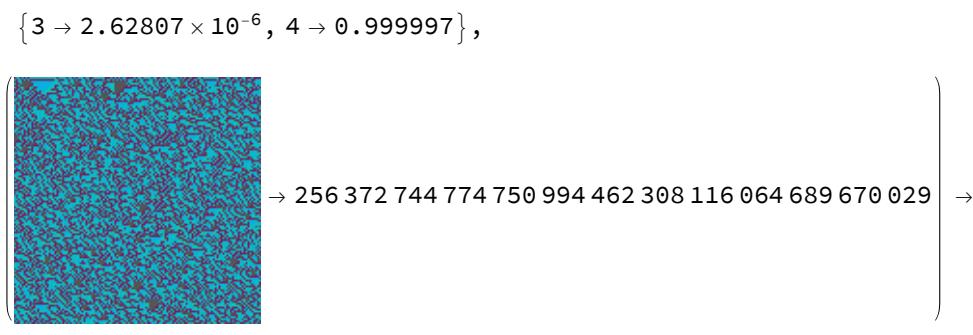
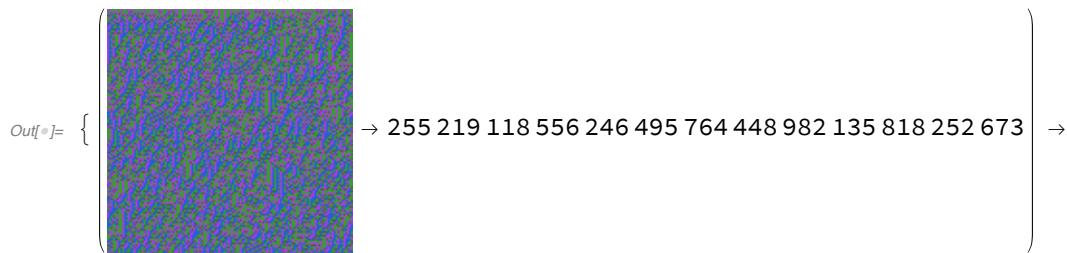
$\left\{ \begin{array}{l} \text{[A brown noisy image]} \\ \rightarrow 10\ 676\ 790 \end{array} \right\} \rightarrow \{3 \rightarrow 0.0738921, 4 \rightarrow 0.926108\},$

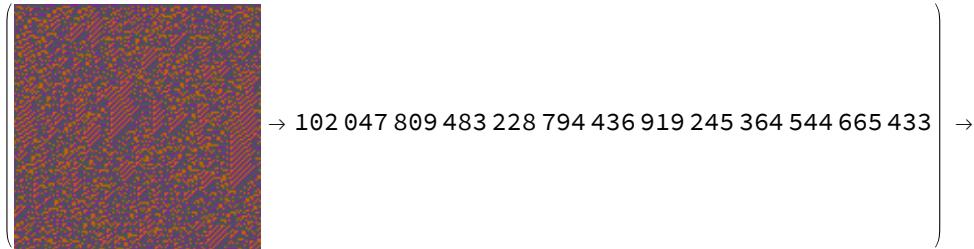
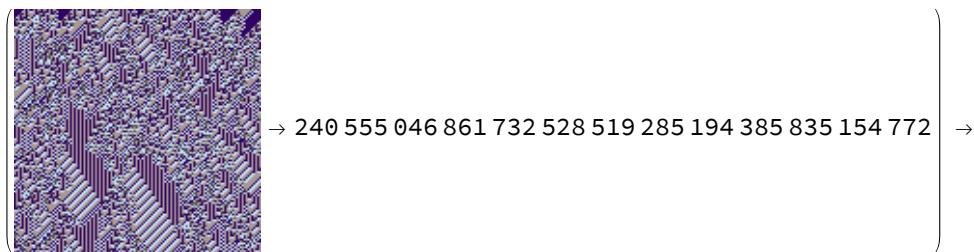
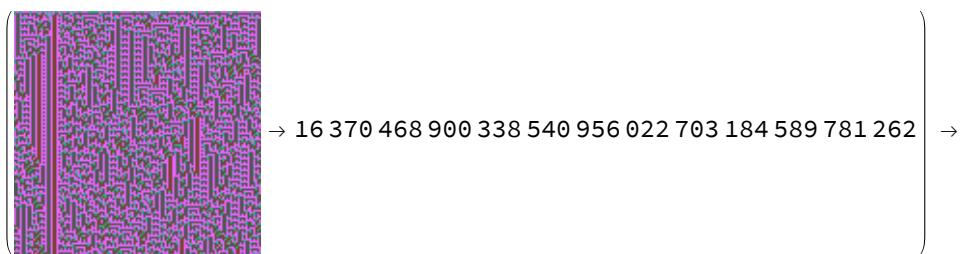
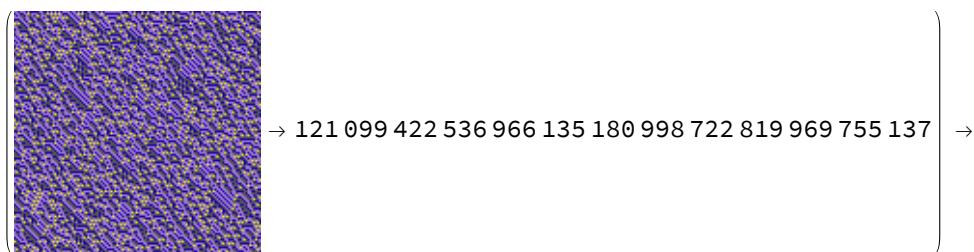
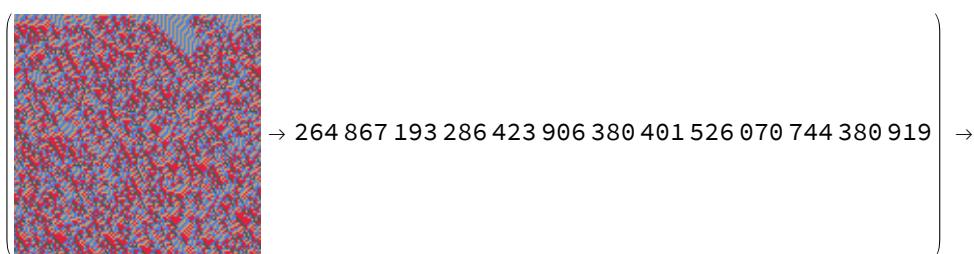
$\left\{ \begin{array}{l} \text{[A pink and black noisy image]} \\ \rightarrow 10\ 375\ 449 \end{array} \right\} \rightarrow \{4 \rightarrow 1.04031 \times 10^{-17}, 3 \rightarrow 1.\},$



4-colour non-totalistic, range 1

```
In[]:= test4Data4kr1C17 = datak4r1NT[128, 128, 8];
Thread[
test4Data4kr1C17 → netECA17[Keys@test4Data4kr1C17, {"TopProbabilities", 2}]]
```



$\{4 \rightarrow 2.56385 \times 10^{-7}, 3 \rightarrow 1.\},$

 $\{4 \rightarrow 0.000696463, 3 \rightarrow 0.999304\},$

 $\{4 \rightarrow 3.62136 \times 10^{-16}, 3 \rightarrow 1.\},$

 $\{3 \rightarrow 1.45252 \times 10^{-15}, 4 \rightarrow 1.\},$

 $\{4 \rightarrow 0.0000270873, 3 \rightarrow 0.999973\},$

 $\{4 \rightarrow 0.105214, 3 \rightarrow 0.894786\}$

4-colour totalistic, range 2

```
In[]:= test4Data4kr2C17 = datak4r2C[128, 128, 8];
Thread[
  test4Data4kr2C17 → netECA17[Keys@test4Data4kr2C17, {"TopProbabilities", 2}]]
```

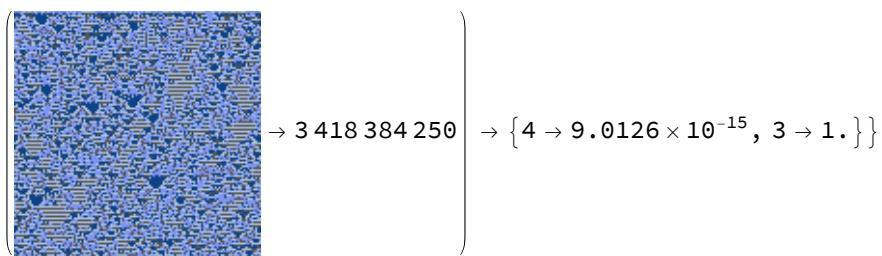
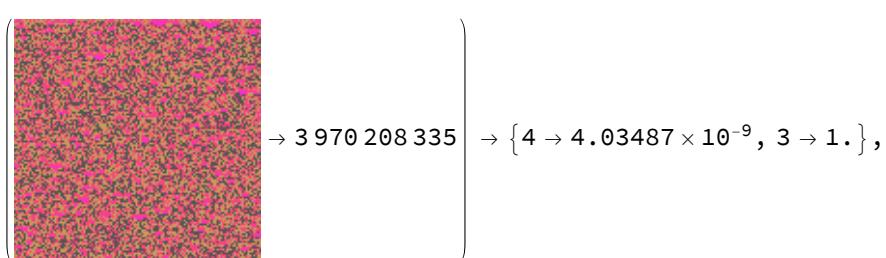
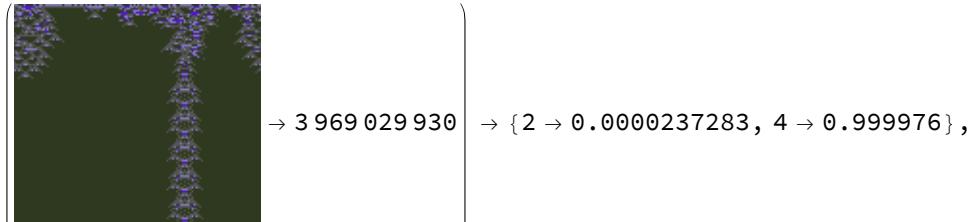
$$\text{Out}[]= \left\{ \begin{array}{l} \text{[A 128x128 pixel image showing a pattern of green, yellow, red, and blue]} \\ \rightarrow 616\ 082\ 315 \end{array} \right\} \rightarrow \{4 \rightarrow 8.8653 \times 10^{-10}, 3 \rightarrow 1.\},$$

$$\left\{ \begin{array}{l} \text{[A 128x128 pixel image showing a pattern of green, yellow, red, and blue]} \\ \rightarrow 1\ 568\ 191\ 428 \end{array} \right\} \rightarrow \{4 \rightarrow 5.21264 \times 10^{-11}, 3 \rightarrow 1.\},$$

$$\left\{ \begin{array}{l} \text{[A 128x128 pixel image showing a pattern of green, yellow, red, and blue]} \\ \rightarrow 1\ 216\ 110\ 065 \end{array} \right\} \rightarrow \{4 \rightarrow 0.000040346, 3 \rightarrow 0.99996\},$$

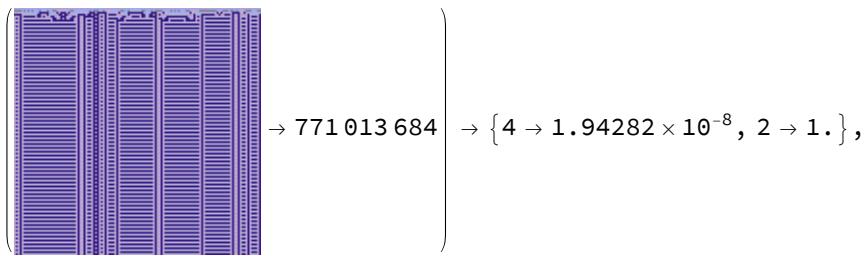
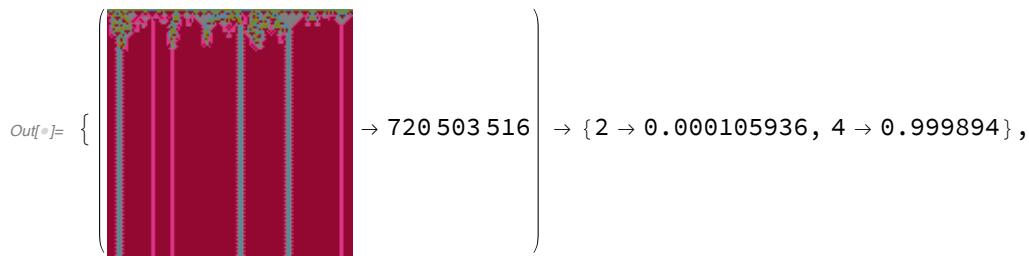
$$\left\{ \begin{array}{l} \text{[A 128x128 pixel image showing a pattern of green, yellow, red, and blue]} \\ \rightarrow 2\ 419\ 903\ 949 \end{array} \right\} \rightarrow \{4 \rightarrow 3.69897 \times 10^{-10}, 3 \rightarrow 1.\},$$

$$\left\{ \begin{array}{l} \text{[A 128x128 pixel image showing a pattern of green, yellow, red, and blue]} \\ \rightarrow 453\ 961\ 055 \end{array} \right\} \rightarrow \{4 \rightarrow 3.89961 \times 10^{-8}, 3 \rightarrow 1.\},$$



5-colour totalistic, range 1

```
In[]:= test4Data5kr1C17 = data5T2C[8, 128, 128];
Thread[
  test4Data5kr1C17 &gt; netECA17[Keys@test4Data5kr1C17, {"TopProbabilities", 2}]]
```



$$\left(\begin{array}{c} \text{[A 19x200 grid of random colors]} \\ \rightarrow 543\,872\,434 \end{array} \right) \rightarrow \{4 \rightarrow 6.11423 \times 10^{-7}, 3 \rightarrow 0.999999\},$$

$$\left(\begin{array}{c} \text{[A 19x200 grid of random colors]} \\ \rightarrow 341\,908\,586 \end{array} \right) \rightarrow \{4 \rightarrow 0.310854, 3 \rightarrow 0.689146\},$$

$$\left(\begin{array}{c} \text{[A 19x200 grid of random colors]} \\ \rightarrow 664\,036\,861 \end{array} \right) \rightarrow \{2 \rightarrow 0.00511847, 4 \rightarrow 0.994882\},$$

$$\left(\begin{array}{c} \text{[A 19x200 grid of random colors]} \\ \rightarrow 1\,182\,110\,899 \end{array} \right) \rightarrow \{4 \rightarrow 0.039023, 3 \rightarrow 0.960977\},$$

$$\left(\begin{array}{c} \text{[A 19x200 grid of random colors]} \\ \rightarrow 976\,082\,949 \end{array} \right) \rightarrow \{4 \rightarrow 9.09593 \times 10^{-19}, 2 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 19x200 grid of random colors]} \\ \rightarrow 1\,019\,517\,181 \end{array} \right) \rightarrow \{1 \rightarrow 6.47917 \times 10^{-10}, 2 \rightarrow 1.\}$$

6-colour totalistic, range 1

```
In[]:= test4Data6kr1C17 = data6TC[8, 128, 128];
Thread[
  test4Data6kr1C17 → netECA17[Keys@test4Data6kr1C17, {"TopProbabilities", 2}]]
```

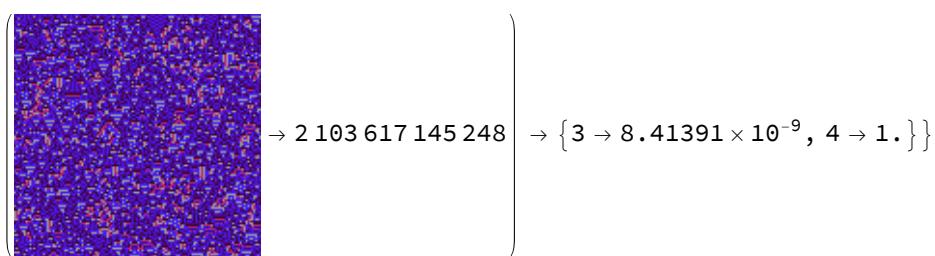
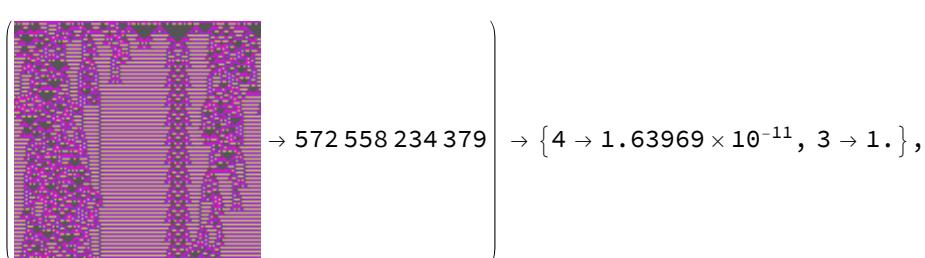
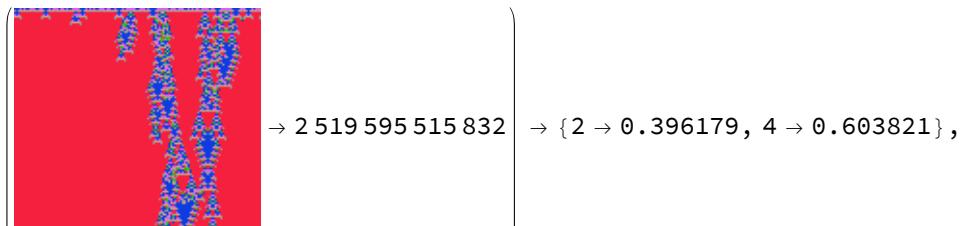
Out[]:= $\left\{ \begin{array}{c} \text{[A 128x128 grid of alternating green and blue horizontal stripes]} \\ \rightarrow 1\ 128\ 957\ 409\ 115 \end{array} \right\} \rightarrow \{2 \rightarrow 0.387573, 1 \rightarrow 0.612427\},$

$\left\{ \begin{array}{c} \text{[A 128x128 grid showing a complex, fractal-like pattern of black, yellow, and purple cells]} \\ \rightarrow 744\ 151\ 919\ 694 \end{array} \right\} \rightarrow \{3 \rightarrow 1.28454 \times 10^{-11}, 4 \rightarrow 1.\},$

$\left\{ \begin{array}{c} \text{[A 128x128 grid showing a dense, granular pattern of red, green, and blue cells]} \\ \rightarrow 411\ 482\ 269\ 593 \end{array} \right\} \rightarrow \{4 \rightarrow 9.50671 \times 10^{-6}, 3 \rightarrow 0.99999\},$

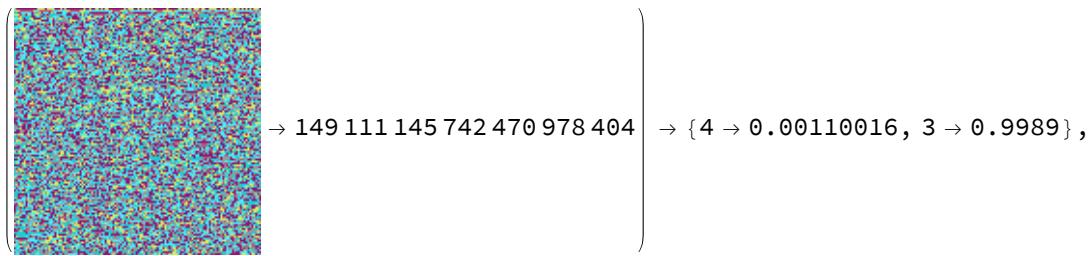
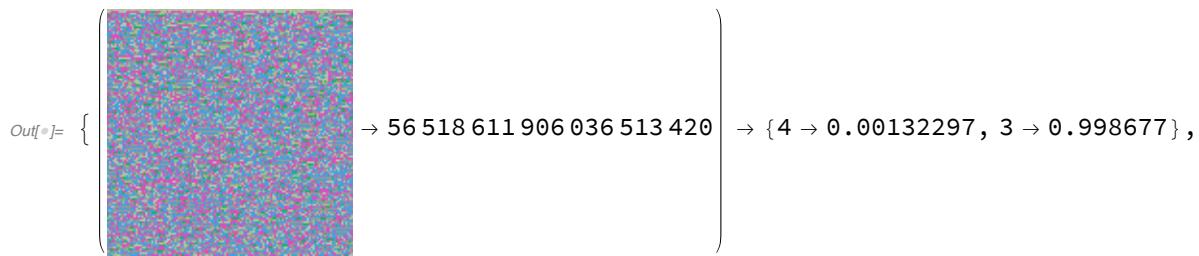
$\left\{ \begin{array}{c} \text{[A 128x128 grid showing a sparse, noisy pattern of blue, yellow, and red cells]} \\ \rightarrow 2\ 122\ 826\ 252\ 429 \end{array} \right\} \rightarrow \{4 \rightarrow 4.58698 \times 10^{-10}, 3 \rightarrow 1.\},$

$\left\{ \begin{array}{c} \text{[A 128x128 grid showing a pattern of red, green, and blue cells with horizontal bands]} \\ \rightarrow 2\ 443\ 710\ 325\ 124 \end{array} \right\} \rightarrow \{4 \rightarrow 5.97811 \times 10^{-9}, 3 \rightarrow 1.\},$



6-colour totalistic, range 2

```
In[]:= test4Data6kr2C17 = data6T2C[8, 128, 128];
Thread[
  test4Data6kr2C17 → netECA17[Keys@test4Data6kr2C17, {"TopProbabilities", 2}]]
```



$$\left(\begin{array}{c} \text{[A 19x200 grid of blue and orange pixels]} \\ \rightarrow 60\ 075\ 298\ 400\ 874\ 491\ 559 \end{array} \right) \rightarrow \{4 \rightarrow 0.0000816385, 3 \rightarrow 0.999918\},$$

$$\left(\begin{array}{c} \text{[A 19x200 grid of green and purple pixels]} \\ \rightarrow 61\ 137\ 219\ 885\ 741\ 406\ 688 \end{array} \right) \rightarrow \{4 \rightarrow 6.01526 \times 10^{-9}, 3 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 19x200 grid of green and red pixels]} \\ \rightarrow 138\ 083\ 937\ 800\ 052\ 503\ 915 \end{array} \right) \rightarrow \{4 \rightarrow 1.63338 \times 10^{-6}, 3 \rightarrow 0.999998\},$$

$$\left(\begin{array}{c} \text{[A 19x200 grid of red and yellow pixels]} \\ \rightarrow 102\ 848\ 890\ 668\ 267\ 918\ 696 \end{array} \right) \rightarrow \{4 \rightarrow 4.51684 \times 10^{-8}, 3 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 19x200 grid of blue and purple pixels]} \\ \rightarrow 52\ 002\ 759\ 529\ 482\ 240\ 344 \end{array} \right) \rightarrow \{4 \rightarrow 0.0161382, 3 \rightarrow 0.983862\},$$

$$\left(\begin{array}{c} \text{[A 19x200 grid of green and pink pixels]} \\ \rightarrow 3\ 771\ 326\ 190\ 903\ 203\ 597 \end{array} \right) \rightarrow \{4 \rightarrow 1.57635 \times 10^{-10}, 3 \rightarrow 1.\}\}$$

7-colour totalistic, range 1

```
In[]:= test4Data7kr1C17 = data7TC[8, 128, 128];
Thread[
  test4Data7kr1C17 → netECA17[Keys@test4Data7kr1C17, {"TopProbabilities", 2}]]
```

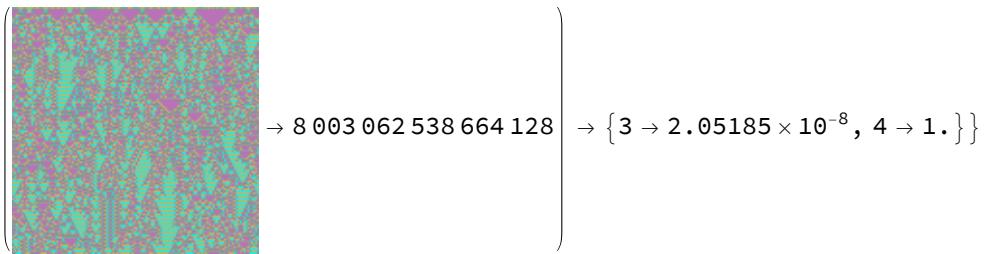
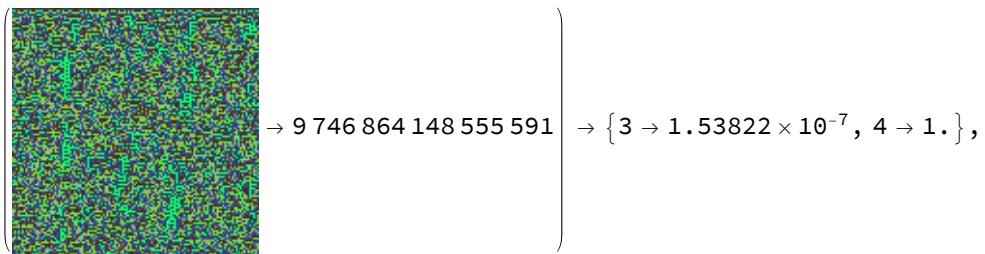
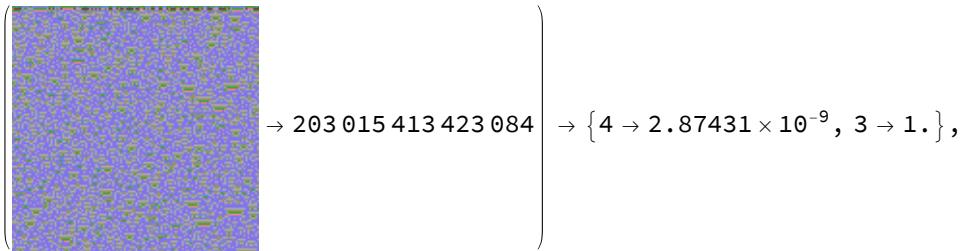
$$\left. \left(\begin{array}{c} \text{A 128x128 pixel image showing a random distribution of 7 colors (blue, green, red, yellow, orange, purple, brown)} \\ \rightarrow 249\,739\,897\,876\,317 \end{array} \right) \rightarrow \left\{ 4 \rightarrow 7.58753 \times 10^{-13}, 3 \rightarrow 1. \right\}, \right.$$

$$\left. \left(\begin{array}{c} \text{A 128x128 pixel image showing a pattern of blue, green, and purple cells on a black background} \\ \rightarrow 6\,589\,873\,174\,284\,234 \end{array} \right) \rightarrow \left\{ 4 \rightarrow 3.70203 \times 10^{-21}, 3 \rightarrow 1. \right\}, \right.$$

$$\left. \left(\begin{array}{c} \text{A 128x128 pixel image showing a complex, mostly gray pattern with some green and blue highlights} \\ \rightarrow 2\,838\,251\,451\,633\,386 \end{array} \right) \rightarrow \left\{ 3 \rightarrow 0.0000362001, 4 \rightarrow 0.999964 \right\}, \right.$$

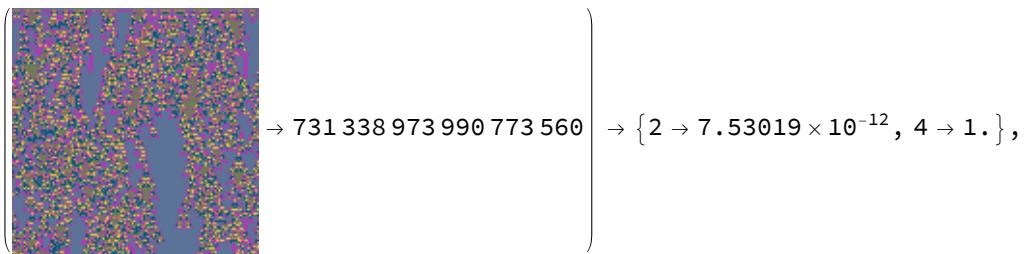
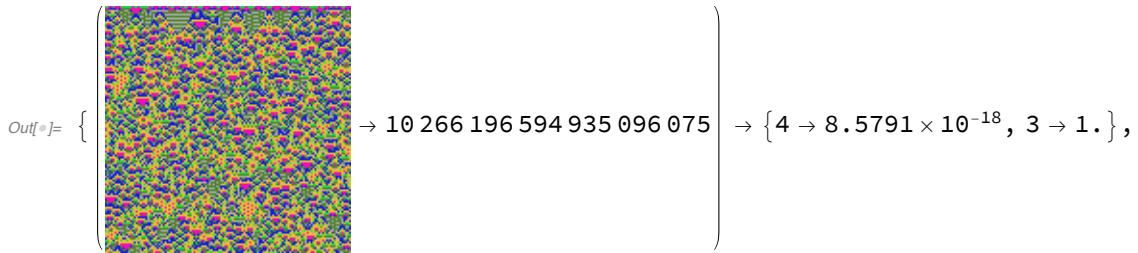
$$\left. \left(\begin{array}{c} \text{A 128x128 pixel image showing a pattern of red, orange, and blue cells on a dark background} \\ \rightarrow 3\,069\,021\,856\,393\,877 \end{array} \right) \rightarrow \left\{ 4 \rightarrow 4.6982 \times 10^{-6}, 3 \rightarrow 0.999995 \right\}, \right.$$

$$\left. \left(\begin{array}{c} \text{A 128x128 pixel image showing a pattern of green, orange, and gray cells} \\ \rightarrow 10\,282\,712\,720\,317\,214 \end{array} \right) \rightarrow \left\{ 3 \rightarrow 4.14045 \times 10^{-19}, 4 \rightarrow 1. \right\}, \right.$$



8-colour totalistic, range 1

```
In[6]:= test4Data8kr1C17 = data8TC[8, 128, 128];
          Thread[
            test4Data8kr1C17 → netECA17[Keys@test4Data8kr1C17, {"TopProbabilities", 2}]]
```



$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 11\ 247\ 173\ 012\ 174\ 218\ 620 \end{array} \right) \rightarrow \{4 \rightarrow 0.0000380778, 3 \rightarrow 0.999962\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 63\ 742\ 472\ 032\ 617\ 219\ 918 \end{array} \right) \rightarrow \{4 \rightarrow 0.0000371126, 3 \rightarrow 0.999963\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 7\ 382\ 455\ 380\ 800\ 363\ 015 \end{array} \right) \rightarrow \{4 \rightarrow 8.07468 \times 10^{-15}, 3 \rightarrow 1.\},$$

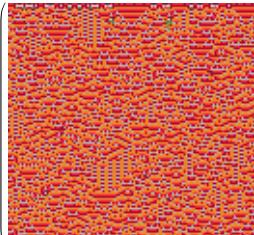
$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 59\ 100\ 651\ 667\ 569\ 734\ 000 \end{array} \right) \rightarrow \{4 \rightarrow 1.27228 \times 10^{-11}, 3 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 24\ 971\ 306\ 247\ 396\ 766\ 335 \end{array} \right) \rightarrow \{4 \rightarrow 0.0333734, 3 \rightarrow 0.966627\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 45\ 946\ 581\ 080\ 593\ 555\ 746 \end{array} \right) \rightarrow \{4 \rightarrow 1.08598 \times 10^{-15}, 3 \rightarrow 1.\}\}$$

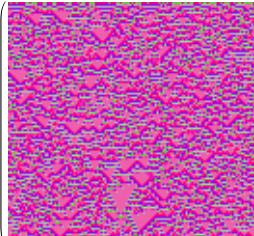
```
In[8]:= test4Data8kr1C17 = data8TC[8, 128, 128];
Thread[
  test4Data8kr1C17 → netECA17[Keys@test4Data8kr1C17, {"TopProbabilities", 2}]]
```

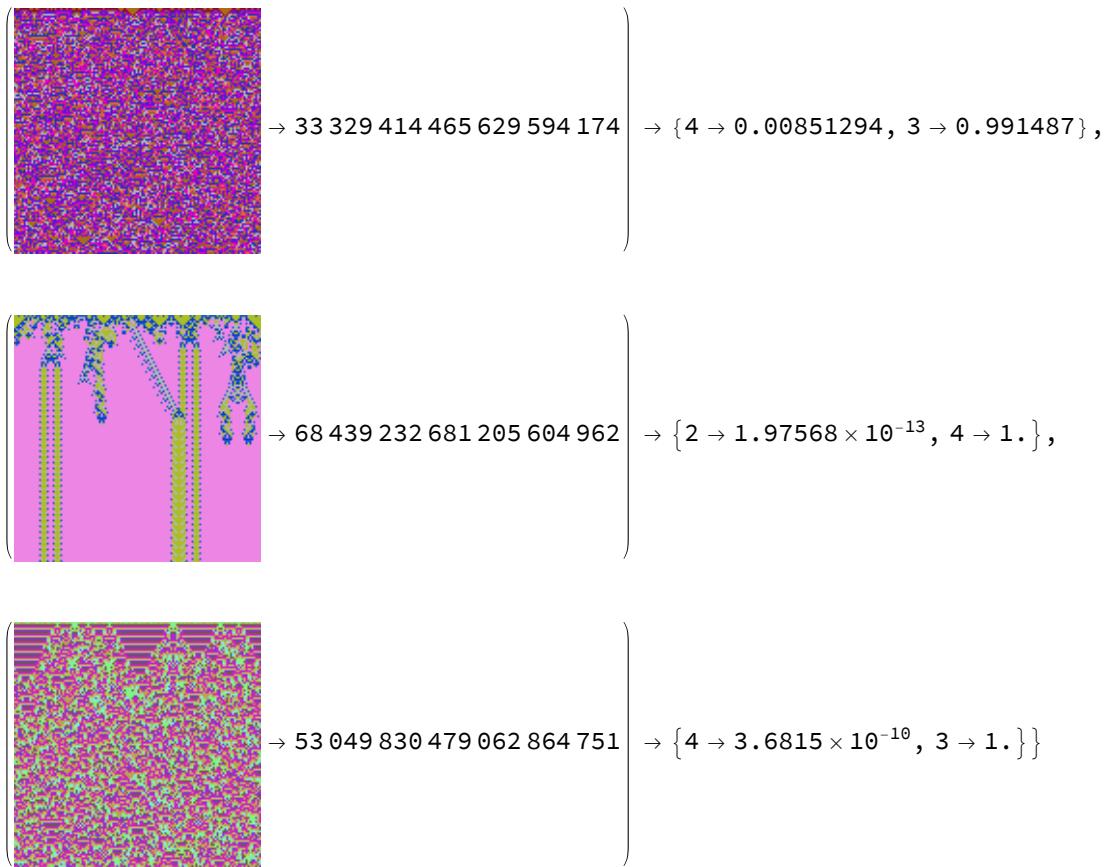
Out[8]= { → 14 955 350 598 586 141 683}

{ → 30 727 455 169 449 395 964}

{ → 42 490 152 676 883 207 115}

{ → 18 395 296 261 071 222 192}

{ → 22 317 090 484 634 250 431}

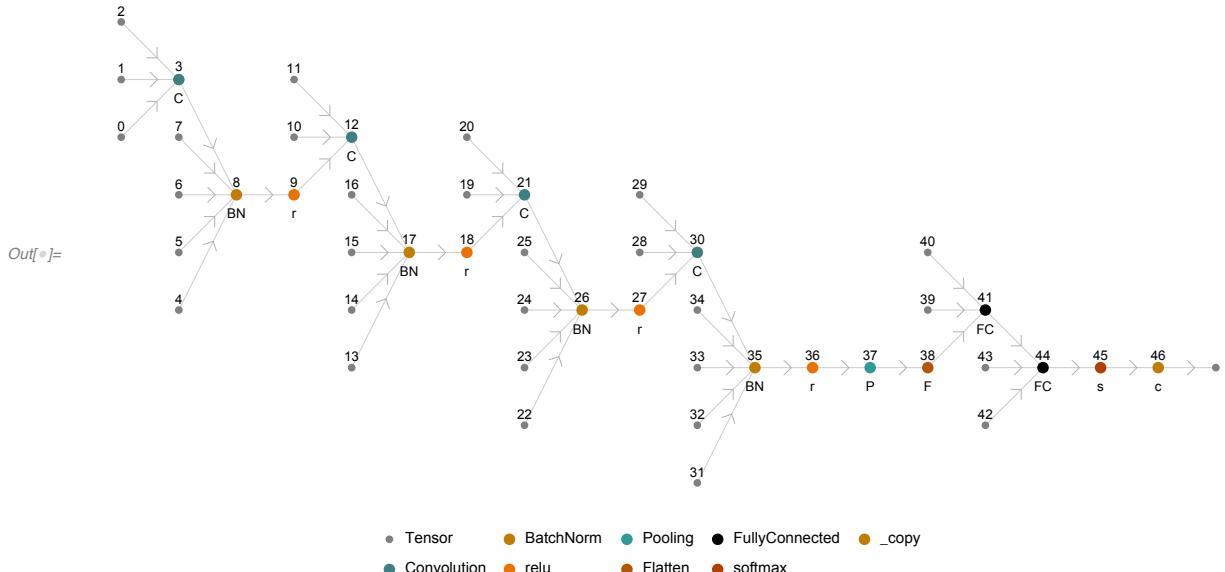


Network XVIII- Four convolutions, dropout on linear only, BatchNorm

```
In[8]:= netECA18 = netTenCC1024drop[128, 128]
```

```
Out[8]= NetChain[ Input port: image  
Output port: class  
Number of layers: 18]
```

```
In[④]:= NetInformation[netECA18, "MXNetNodeGraphPlot"]
```



```
In[⑤]:= NetInformation[netECA18, "SummaryGraphic"]
```



```
In[⑥]:= dataECA18 = dataC[128, 128, 16 384];
```

```
In[⑦]:= dataTotalistic2BigC18 = genData2r2C[128, 128, 4096];
```

```
In[⑧]:= dataTotalistic3BigC18 = data3T2C[128, 128, 4096];
```

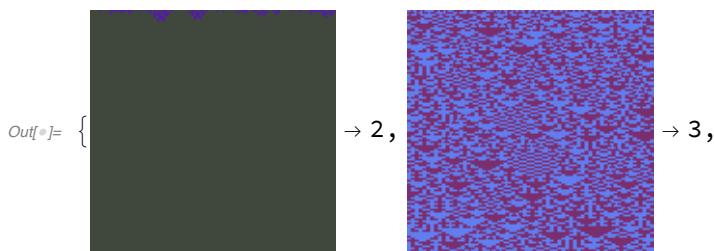
```
In[⑨]:= dataTotalistic4BigC18 = data4TC[128, 128, 4096];
```

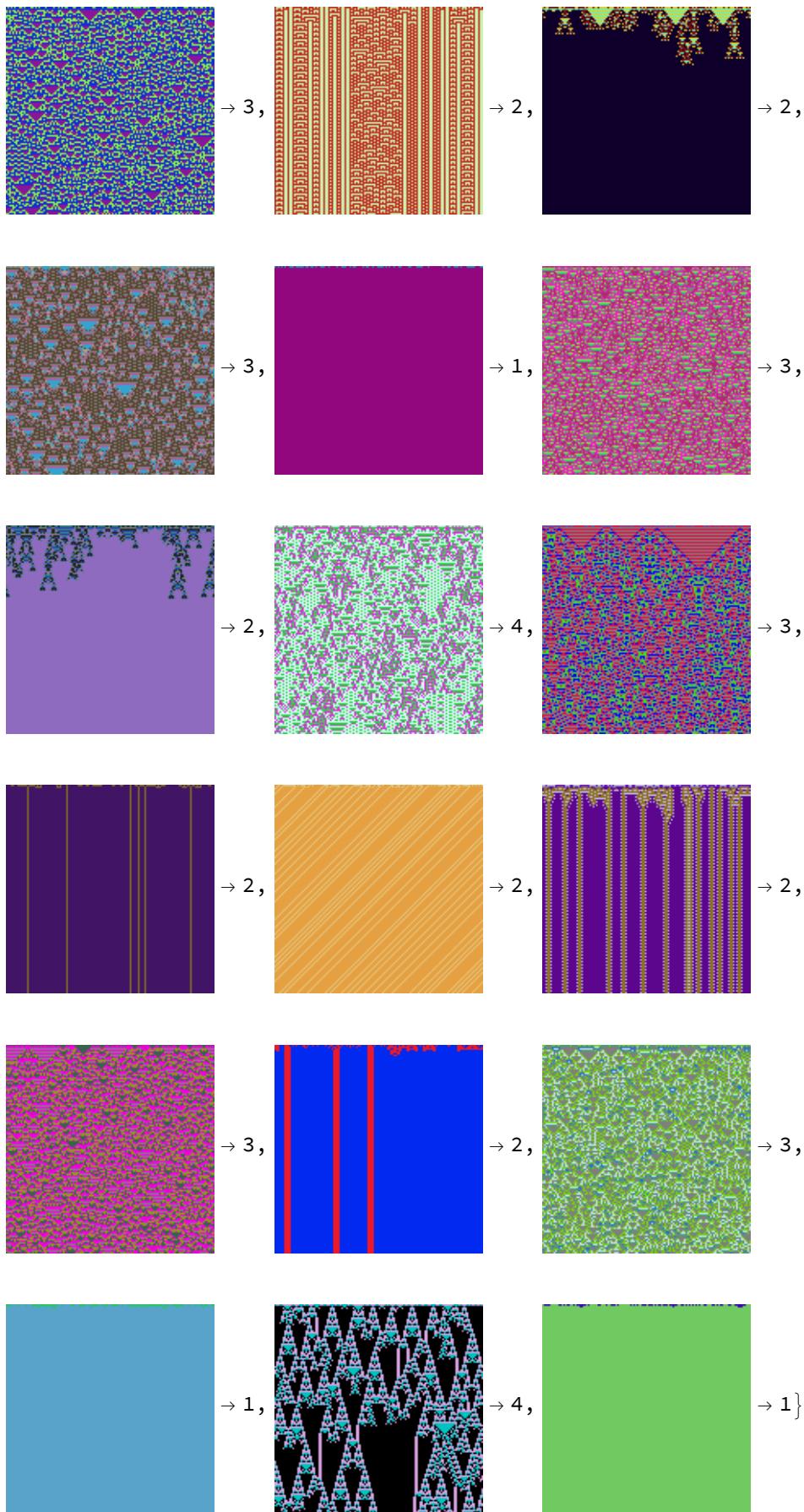
```
In[⑩]:= dataTotalistic5BigC18 = genData5TCC[128, 128, 16 384];
```

```
In[⑪]:= fullTrainingBigC18 = Join[dataECA18, dataTotalistic2BigC18,
    dataTotalistic3BigC18, dataTotalistic4BigC18, dataTotalistic5BigC18];
Length[fullTrainingBigC18]
```

Out[⑪]= 90112

```
In[⑫]:= RandomSample[fullTrainingBigC18, 20]
```





```
In[®]:= dir = SetDirectory[NotebookDirectory[]]
Out[®]= /home/esilverman/Documents

In[®]:= "/home/esilverman/Documents"
Out[®]= /home/esilverman/Documents

In[®]:= netECA18 = NetTrain[netECA18, fullTrainingBigC18,
  MaxTrainingRounds → 200, BatchSize → 256, TargetDevice → "GPU",
  TrainingProgressCheckpointing → {"Directory", dir}]
```

Out[®]= NetChain[Input port: Output port: Number of layers: image class 18]

```
In[®]:= netECA18 = Import["netECA18-r200.wlnet"]
```

Out[®]= NetChain[Input port: Output port: Number of layers: image class 18]

Generate test data for Network XVII (200 epochs)

```
In[®]:= dir = SetDirectory[NotebookDirectory[]]
Out[®]= /Users/thorsilver/Downloads/Wolfram notebooks
```

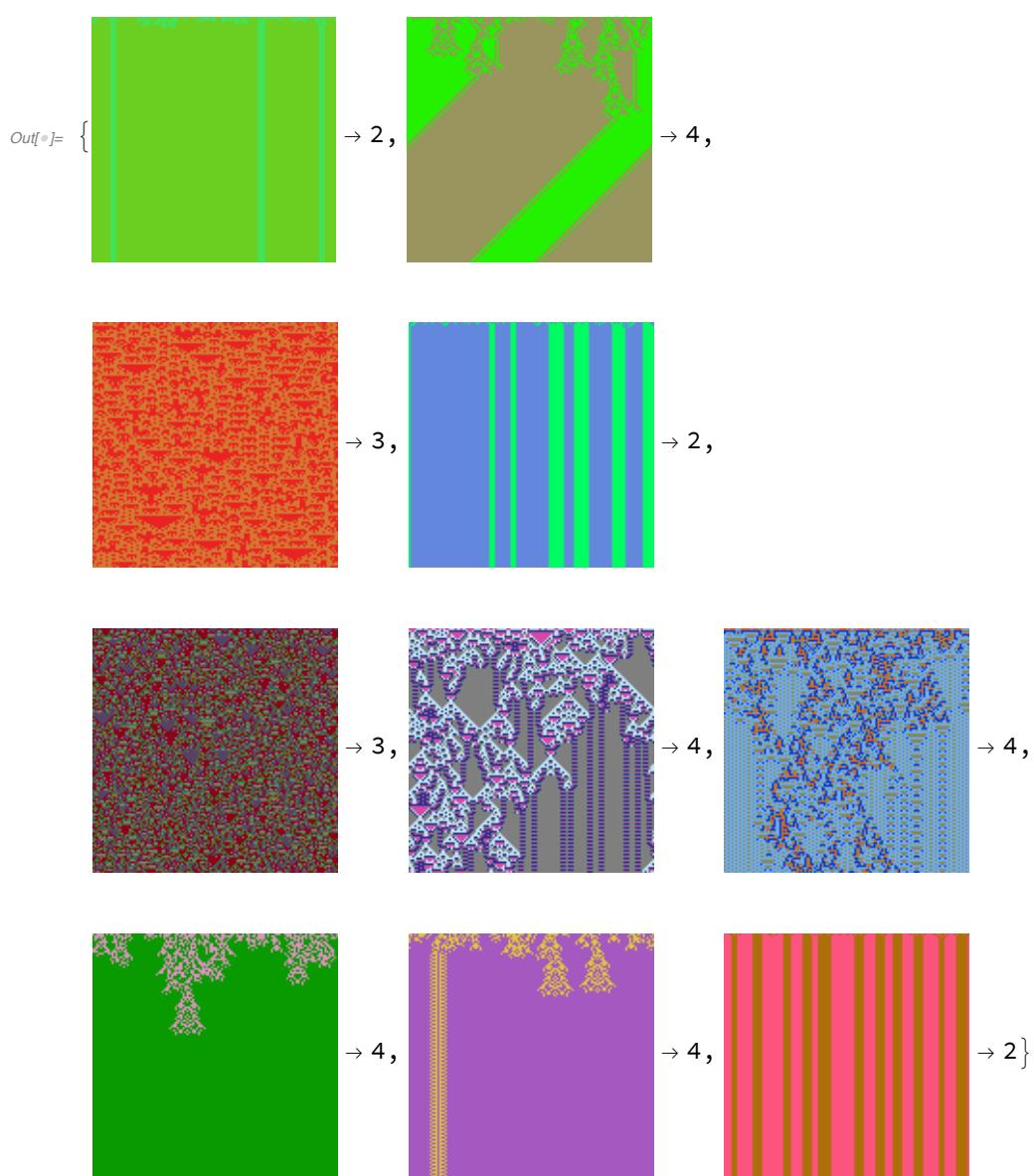
```
In[180]:= netECA18 = Import["netECA18-r200.wlnet"]
```

Out[180]= NetChain[Input port: Output port: Number of layers: image class 18]

```
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]
```

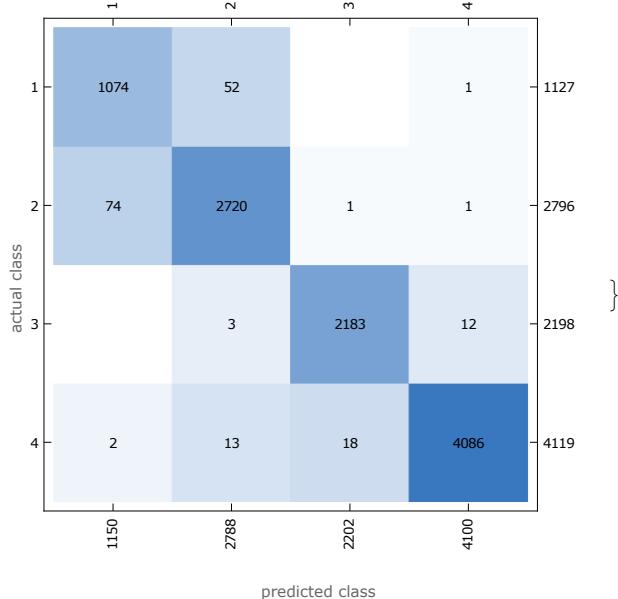
Out[®]= 10 240

In[]:= RandomSample[fullTestSetBigC, 10]

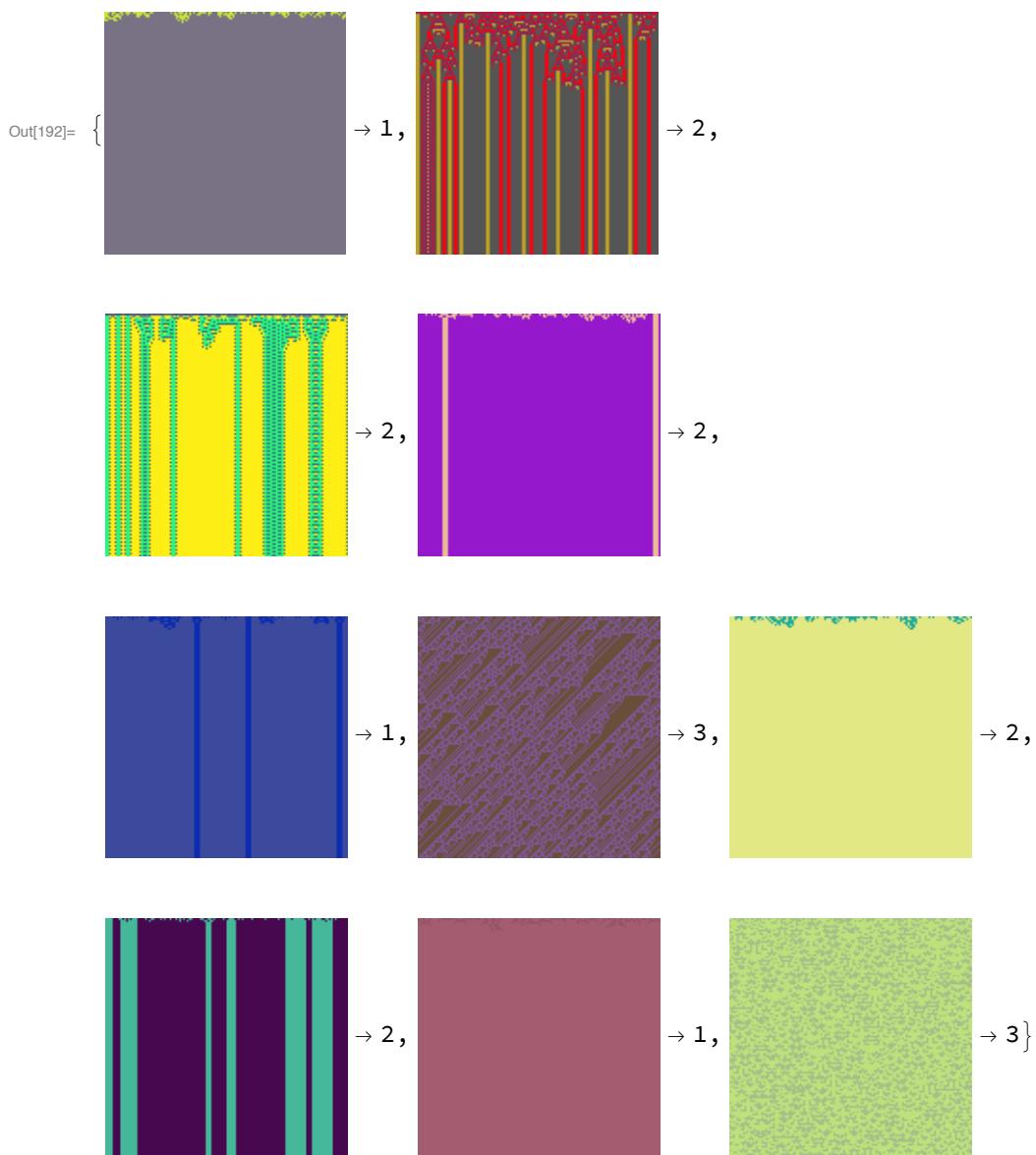


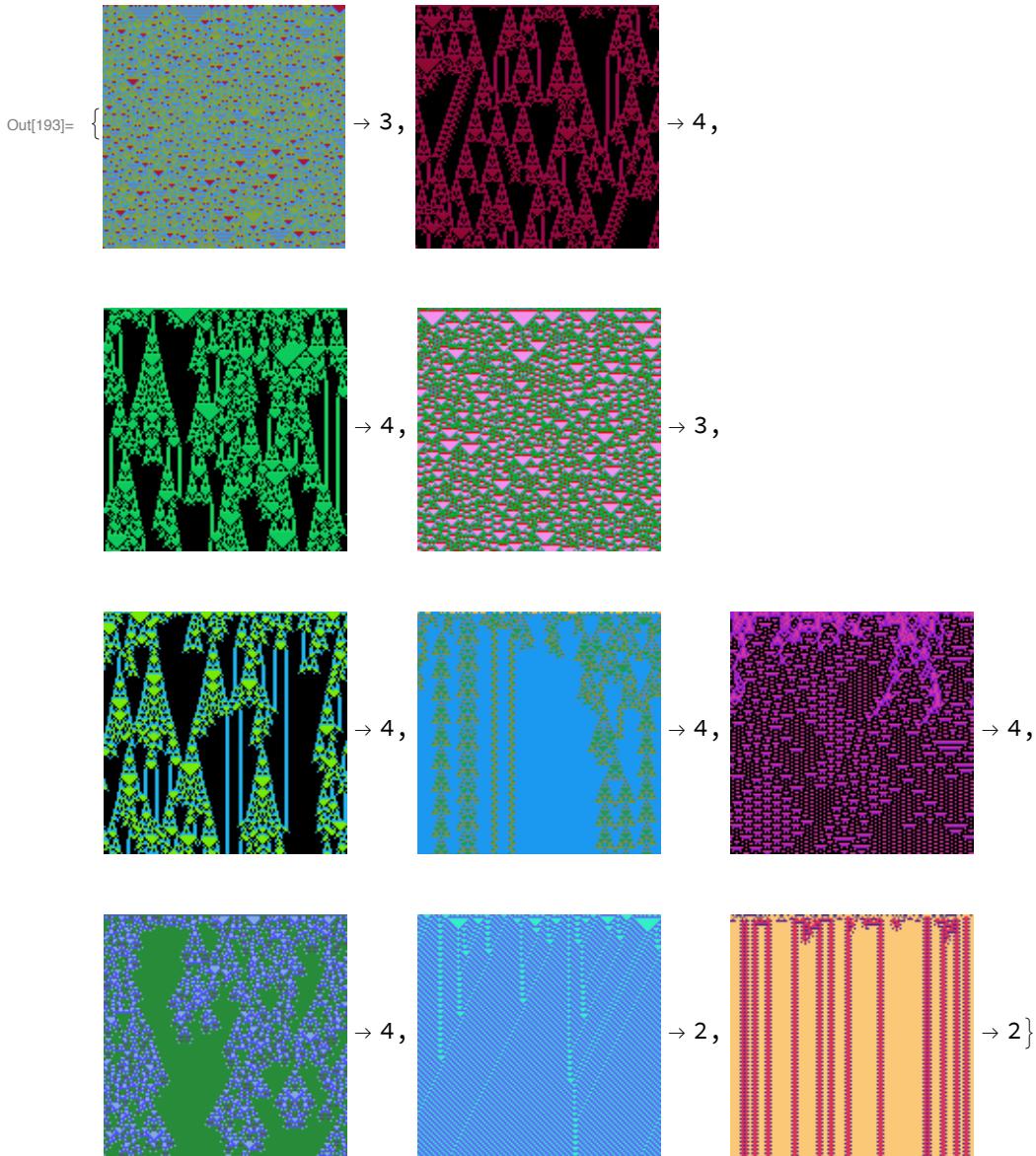
```
In[181]:= NetMeasurements[netECA18, fullTestSetBigC,
 {"Accuracy", "Precision", "ConfusionMatrixPlot"}]

Out[181]= {0.982715, {1 → 0.933913, 2 → 0.97561, 3 → 0.991371, 4 → 0.996585}, }
```



```
In[188]:= entropyImagesBigC = RandomSample[Keys[fullTestSetBigC], 500];
entropiesBigC = netECA18[entropyImagesBigC, "Entropy"];
highEntBigC = entropyImagesBigC[[Ordering[entropiesBigC, -10]]];
lowEntBigC = entropyImagesBigC[[Ordering[entropiesBigC, 10]]];
Thread[highEntBigC → netECA18[highEntBigC]]
Thread[lowEntBigC → netECA18[lowEntBigC]]
```





Testing Network XVIII (200 epochs) on unseen CA rule spaces

2-colour non-totalistic, range 2

```
In[194]:= test4Data2kr2C18 = datak2r2C[128, 128, 8];
Thread[
  test4Data2kr2C18  $\rightarrow$  netECA18[Keys@test4Data2kr2C18, {"TopProbabilities", 2}]]
```

Out[195]= {

$\rightarrow 104\ 119\ 361 \rightarrow \{2 \rightarrow 0.0334506, 4 \rightarrow 0.966538\},$

$$\left(\begin{array}{c} \text{[A 2x2 grid of blue and red pixels]} \\ \rightarrow 426\,073\,771 \end{array} \right) \rightarrow \{3 \rightarrow 0.0891399, 4 \rightarrow 0.910856\},$$

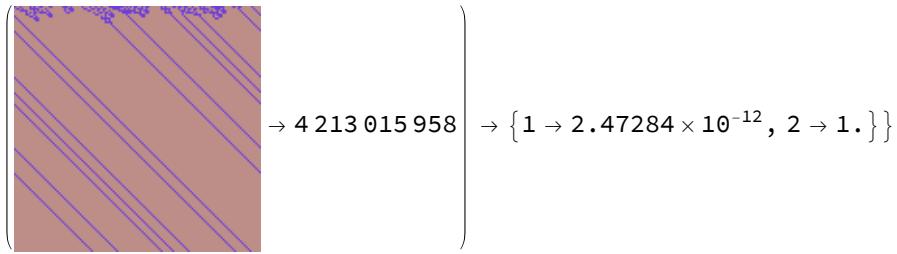
$$\left(\begin{array}{c} \text{[A 2x2 grid of blue and red pixels]} \\ \rightarrow 1\,487\,290\,163 \end{array} \right) \rightarrow \{4 \rightarrow 8.29353 \times 10^{-14}, 3 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of green and red pixels]} \\ \rightarrow 3\,761\,497\,755 \end{array} \right) \rightarrow \{4 \rightarrow 0.484906, 3 \rightarrow 0.514237\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of blue and red pixels]} \\ \rightarrow 1\,503\,689\,727 \end{array} \right) \rightarrow \{3 \rightarrow 6.00879 \times 10^{-8}, 4 \rightarrow 1.\},$$

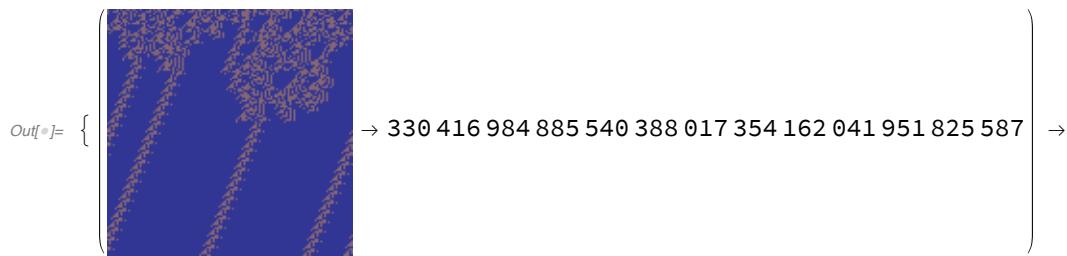
$$\left(\begin{array}{c} \text{[A 2x2 grid of purple and red pixels]} \\ \rightarrow 2\,106\,940\,334 \end{array} \right) \rightarrow \{4 \rightarrow 5.44016 \times 10^{-23}, 3 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of green and red pixels]} \\ \rightarrow 2\,590\,447\,558 \end{array} \right) \rightarrow \{4 \rightarrow 2.78794 \times 10^{-8}, 3 \rightarrow 1.\},$$

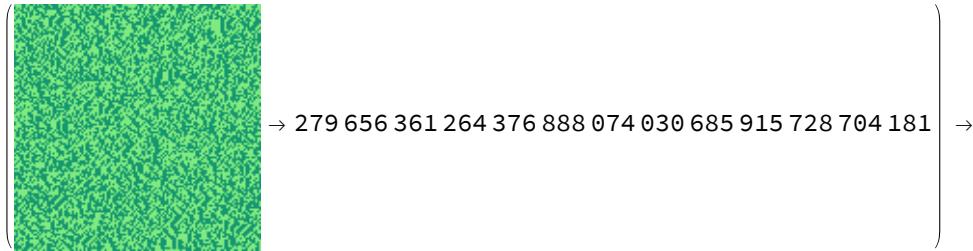


2-colour non-totalistic, range 3

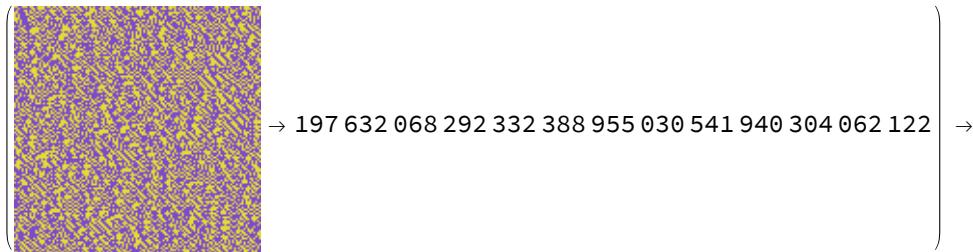
```
In[6]:= test4Data2kr3C18 = datak2r3NT[128, 128, 8];
Thread[
test4Data2kr3C18 → netECA18[Keys@test4Data2kr3C18, {"TopProbabilities", 2}]]
```



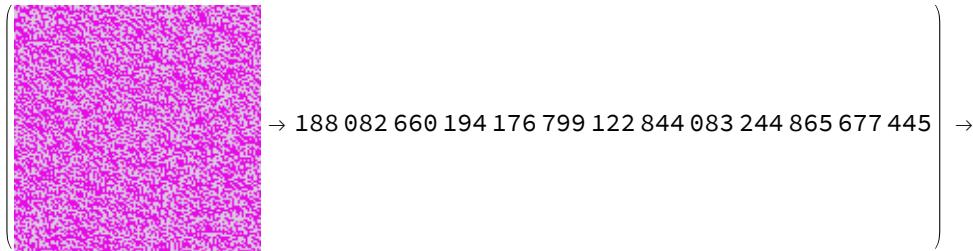
$\{3 \rightarrow 8.74296 \times 10^{-8}, 4 \rightarrow 1.\},$



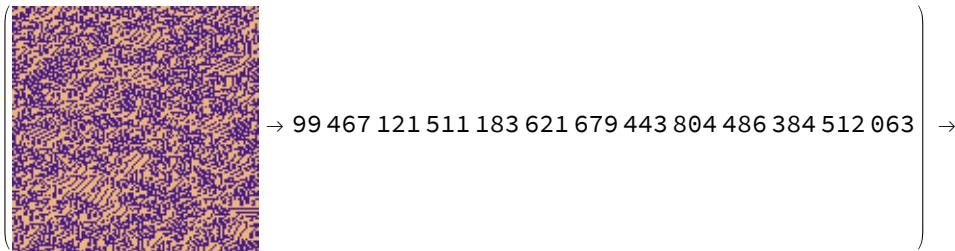
$\{4 \rightarrow 0.0213521, 3 \rightarrow 0.978648\},$



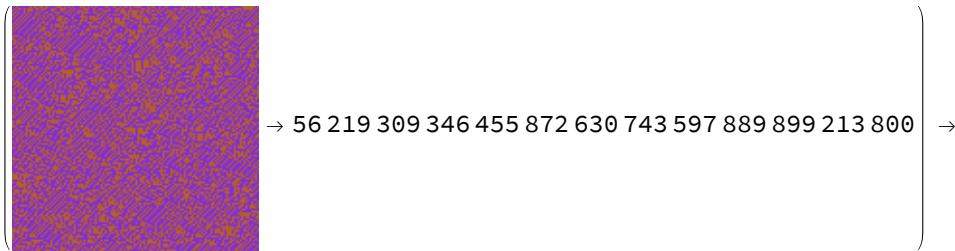
$\{4 \rightarrow 5.0499 \times 10^{-16}, 3 \rightarrow 1.\},$



$\{4 \rightarrow 2.34238 \times 10^{-6}, 3 \rightarrow 0.999998\},$



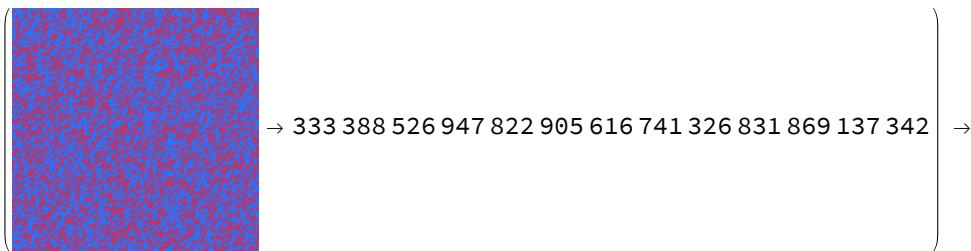
$\{4 \rightarrow 0.00329566, 3 \rightarrow 0.996704\},$



$\{4 \rightarrow 1.38574 \times 10^{-10}, 3 \rightarrow 1.\},$



$\{4 \rightarrow 5.1263 \times 10^{-8}, 3 \rightarrow 1.\},$



$\{4 \rightarrow 7.10494 \times 10^{-8}, 3 \rightarrow 1.\}\}$

3-colour non-totalistic, range 1

```
In[6]:= test4Data3kr1C18 = datak3r1NT[128, 128, 8];
Thread[
test4Data3kr1C18 → netECA18[Keys@test4Data3kr1C18, {"TopProbabilities", 2}]]
```

$$Out[\textcolor{brown}{\#}]= \left\{ \begin{array}{l} \text{A 2D grid of yellow and black dots} \\ \rightarrow 1\ 592\ 394\ 332\ 064 \end{array} \right\} \rightarrow \{2 \rightarrow 7.59314 \times 10^{-6}, 4 \rightarrow 0.999992\},$$

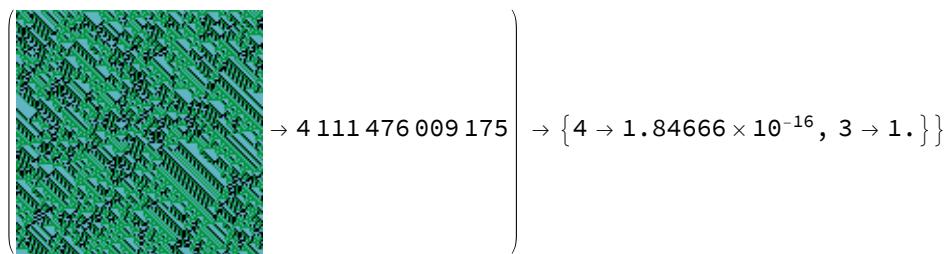
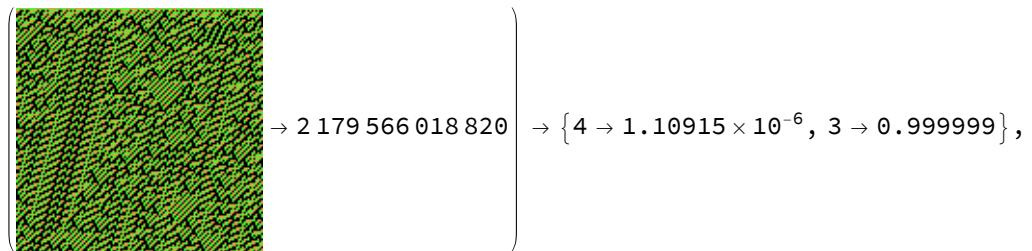
$$\left\{ \begin{array}{l} \text{A 2D grid of purple dots} \\ \rightarrow 4\ 098\ 174\ 485\ 356 \end{array} \right\} \rightarrow \{4 \rightarrow 8.44302 \times 10^{-20}, 2 \rightarrow 1.\},$$

$$\left\{ \begin{array}{l} \text{A 2D grid of blue dots} \\ \rightarrow 5\ 930\ 373\ 291\ 731 \end{array} \right\} \rightarrow \{1 \rightarrow 2.34989 \times 10^{-7}, 2 \rightarrow 1.\},$$

$$\left\{ \begin{array}{l} \text{A 2D grid of green dots} \\ \rightarrow 6\ 363\ 744\ 081\ 807 \end{array} \right\} \rightarrow \{3 \rightarrow 0.0000390704, 4 \rightarrow 0.999961\},$$

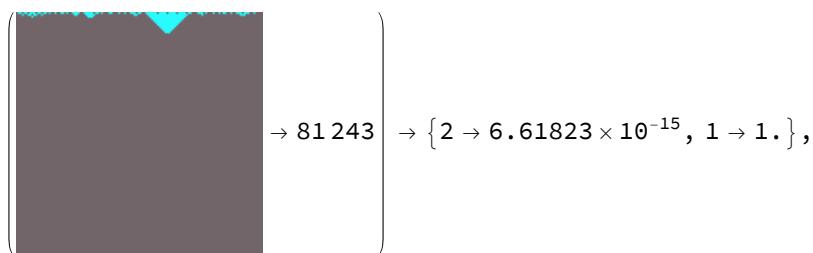
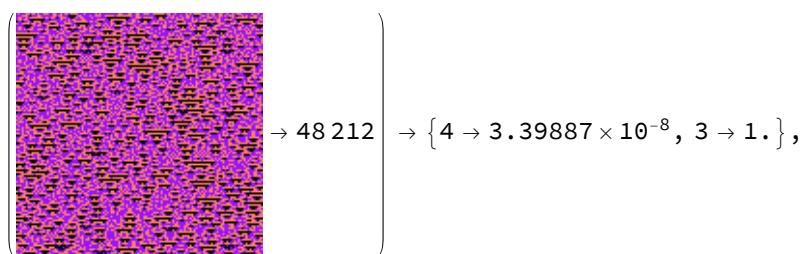
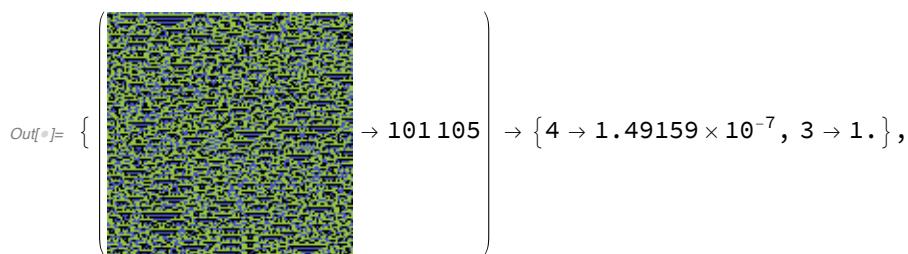
$$\left\{ \begin{array}{l} \text{A 2D grid of yellow and blue dots} \\ \rightarrow 1\ 193\ 083\ 886\ 293 \end{array} \right\} \rightarrow \{4 \rightarrow 0.0126455, 3 \rightarrow 0.987355\},$$

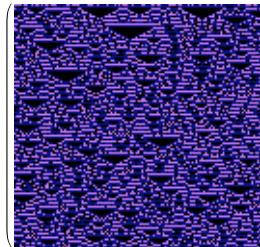
$$\left\{ \begin{array}{l} \text{A 2D grid of green and black dots} \\ \rightarrow 1\ 957\ 822\ 902\ 340 \end{array} \right\} \rightarrow \{3 \rightarrow 0.0000561806, 2 \rightarrow 0.999944\},$$

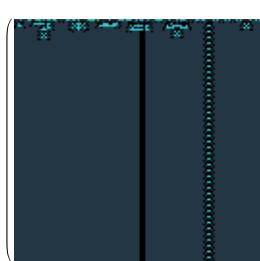


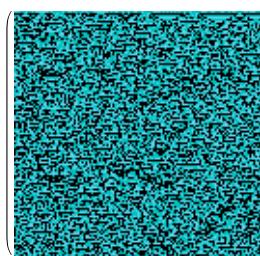
3-colour totalistic, range 2

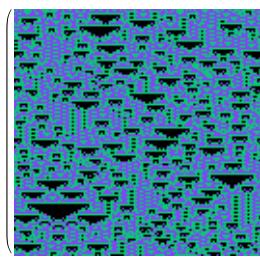
```
In[]:= test4Data3kr2C18 = datak3r2C[128, 128, 8];
Thread[
  test4Data3kr2C18 → netECA18[Keys@test4Data3kr2C18, {"TopProbabilities", 2}]]
```

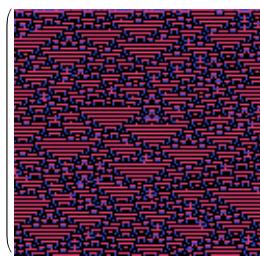


 $\rightarrow 144\ 952 \left. \right\} \rightarrow \{ 4 \rightarrow 5.58692 \times 10^{-14}, 3 \rightarrow 1. \},$

 $\rightarrow 167\ 730 \left. \right\} \rightarrow \{ 1 \rightarrow 3.79715 \times 10^{-7}, 2 \rightarrow 1. \},$

 $\rightarrow 102\ 220 \left. \right\} \rightarrow \{ 4 \rightarrow 3.5215 \times 10^{-7}, 3 \rightarrow 1. \},$

 $\rightarrow 129\ 071 \left. \right\} \rightarrow \{ 4 \rightarrow 5.28522 \times 10^{-29}, 3 \rightarrow 1. \},$

 $\rightarrow 94\ 027 \left. \right\} \rightarrow \{ 4 \rightarrow 3.95426 \times 10^{-7}, 3 \rightarrow 1. \}$

3-colour totalistic, range 3

```
In[⑩]:= test4Data3kr3C18 = datak3r3C[128, 128, 8];
Thread[
test4Data3kr3C18 → netECA18[Keys@test4Data3kr3C18, {"TopProbabilities", 2}]]
```

Out[•]= $\left\{ \begin{array}{l} \text{A 10x10 grid of blue and yellow pixels} \\ \rightarrow 461960 \end{array} \right\} \rightarrow \{4 \rightarrow 4.84455 \times 10^{-6}, 3 \rightarrow 0.999995\},$

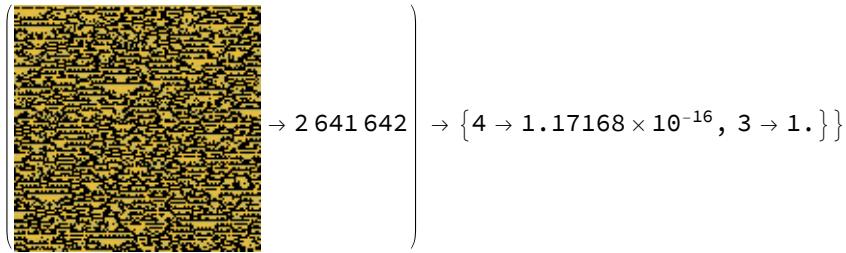
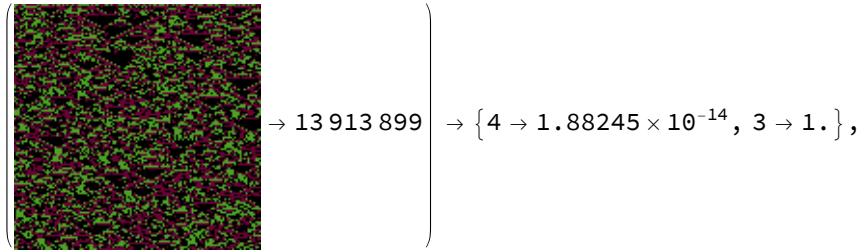
$\left\{ \begin{array}{l} \text{A 10x10 grid of blue and brown pixels} \\ \rightarrow 4823863 \end{array} \right\} \rightarrow \{4 \rightarrow 1.80913 \times 10^{-22}, 3 \rightarrow 1.\},$

$\left\{ \begin{array}{l} \text{A 10x10 grid of green and black pixels} \\ \rightarrow 7272180 \end{array} \right\} \rightarrow \{3 \rightarrow 3.43734 \times 10^{-9}, 4 \rightarrow 1.\},$

$\left\{ \begin{array}{l} \text{A 10x10 grid of blue and black pixels} \\ \rightarrow 8672980 \end{array} \right\} \rightarrow \{4 \rightarrow 6.70981 \times 10^{-6}, 3 \rightarrow 0.999993\},$

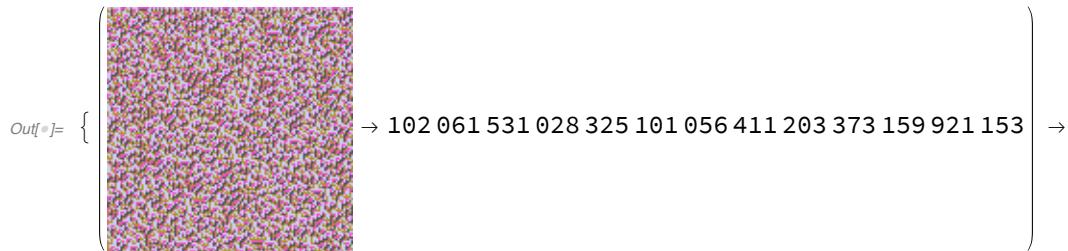
$\left\{ \begin{array}{l} \text{A 10x10 grid of magenta and black pixels} \\ \rightarrow 254357 \end{array} \right\} \rightarrow \{4 \rightarrow 2.17773 \times 10^{-6}, 3 \rightarrow 0.999998\},$

$\left\{ \begin{array}{l} \text{A 10x10 grid of dark green and black pixels} \\ \rightarrow 9226537 \end{array} \right\} \rightarrow \{4 \rightarrow 1.70317 \times 10^{-12}, 3 \rightarrow 1.\},$

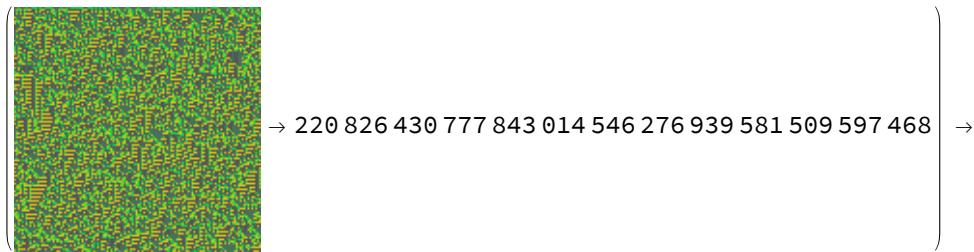


4-colour non-totalistic, range 1

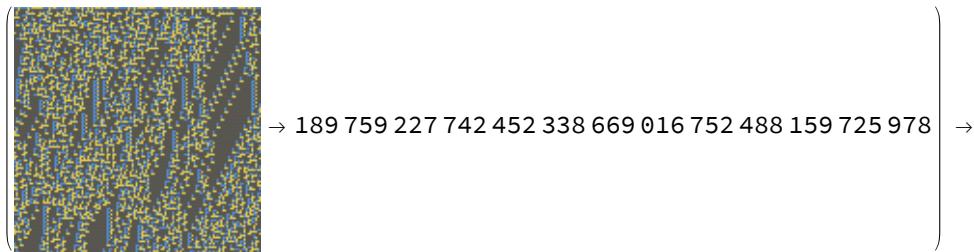
```
In[]:= test4Data4kr1C18 = datak4r1NT[128, 128, 8];
Thread[
  test4Data4kr1C18 → netECA18[Keys@test4Data4kr1C18, {"TopProbabilities", 2}]]
```



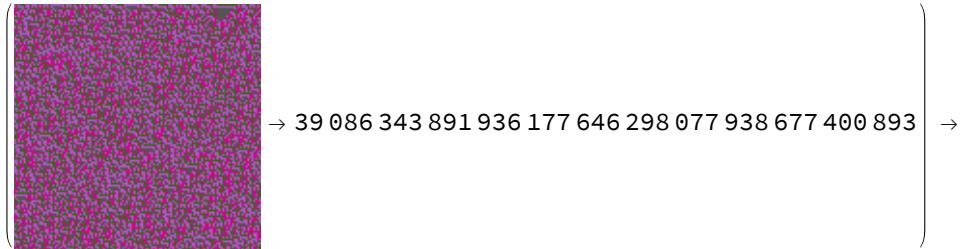
$\{ 4 \rightarrow 1.52655 \times 10^{-6}, 3 \rightarrow 0.999998 \},$



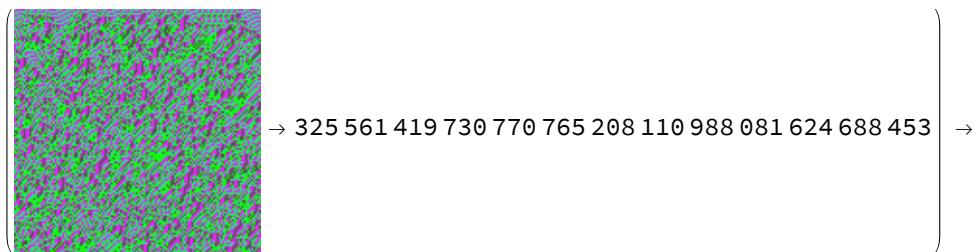
$\{ 4 \rightarrow 3.71156 \times 10^{-15}, 3 \rightarrow 1. \},$



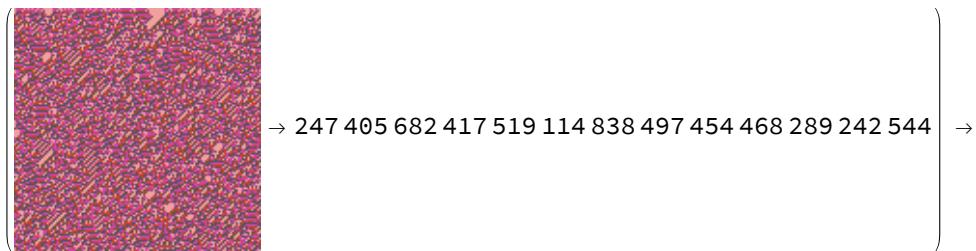
$$\{3 \rightarrow 1.71606 \times 10^{-19}, 4 \rightarrow 1.\},$$



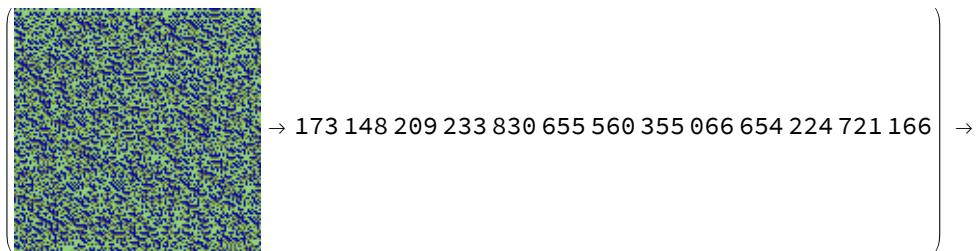
$$\{4 \rightarrow 0.0000617923, 3 \rightarrow 0.999938\},$$



$$\{4 \rightarrow 4.25321 \times 10^{-7}, 3 \rightarrow 1.\},$$



$$\{4 \rightarrow 3.94091 \times 10^{-12}, 3 \rightarrow 1.\},$$



$$\{4 \rightarrow 1.19081 \times 10^{-14}, 3 \rightarrow 1.\},$$



$$\{3 \rightarrow 2.26679 \times 10^{-10}, 4 \rightarrow 1.\}$$

4-colour totalistic, range 2

```
In[]:= test4Data4kr2C18 = datak4r2C[128, 128, 8];
Thread[
  test4Data4kr2C18 → netECA18[Keys@test4Data4kr2C18, {"TopProbabilities", 2}]]
```

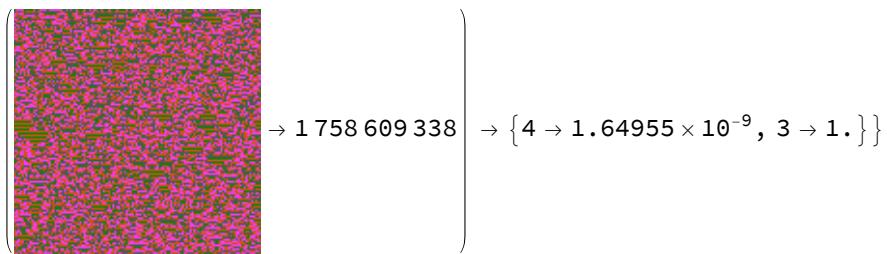
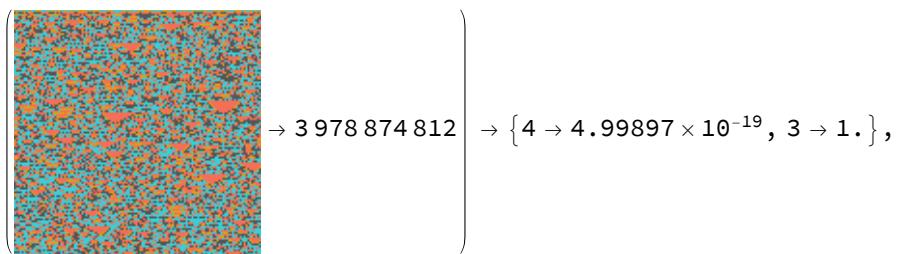
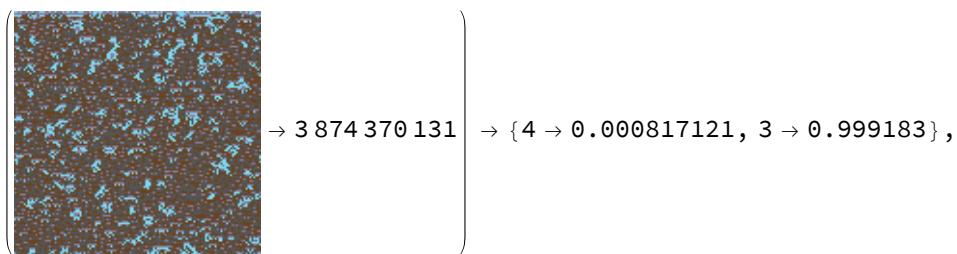
Out[]:= $\left\{ \begin{array}{l} \text{[A 128x128 grid of dots in blue, yellow, red, and green]} \\ \rightarrow 3511876239 \end{array} \right\} \rightarrow \{2 \rightarrow 1.5807 \times 10^{-10}, 4 \rightarrow 1.\},$

Out[]:= $\left\{ \begin{array}{l} \text{[A 128x128 grid of dots in blue, yellow, red, and green]} \\ \rightarrow 1629765289 \end{array} \right\} \rightarrow \{4 \rightarrow 1.84811 \times 10^{-17}, 3 \rightarrow 1.\},$

Out[]:= $\left\{ \begin{array}{l} \text{[A 128x128 grid of dots in blue, yellow, red, and green]} \\ \rightarrow 3309785711 \end{array} \right\} \rightarrow \{4 \rightarrow 5.75659 \times 10^{-20}, 3 \rightarrow 1.\},$

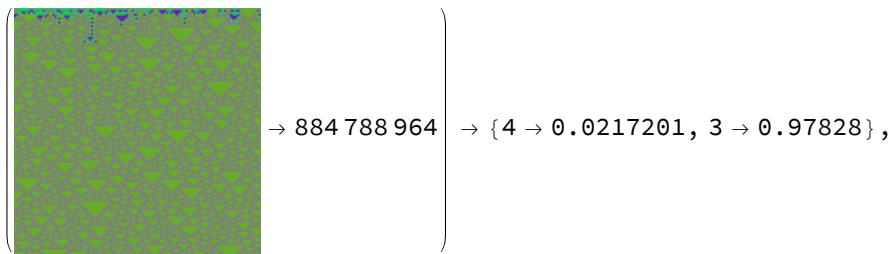
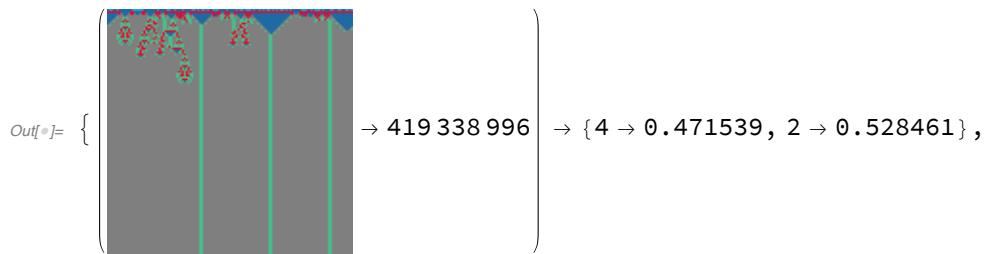
Out[]:= $\left\{ \begin{array}{l} \text{[A 128x128 grid of dots in blue, yellow, red, and green]} \\ \rightarrow 521880538 \end{array} \right\} \rightarrow \{4 \rightarrow 2.42952 \times 10^{-8}, 3 \rightarrow 1.\},$

Out[]:= $\left\{ \begin{array}{l} \text{[A 128x128 grid of dots in blue, yellow, red, and green]} \\ \rightarrow 2882903289 \end{array} \right\} \rightarrow \{4 \rightarrow 0.00262183, 3 \rightarrow 0.997378\},$



5-colour totalistic, range 1

```
In[8]:= test4Data5kr1C18 = data5T2C[8, 128, 128];
Thread[
  test4Data5kr1C18 → netECA18[Keys@test4Data5kr1C18, {"TopProbabilities", 2}]]
```



$$\left(\begin{array}{c} \text{[A 2x2 grid of colored dots]} \\ \rightarrow 743\,542\,029 \end{array} \right) \rightarrow \{3 \rightarrow 1.08355 \times 10^{-9}, 4 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of colored dots]} \\ \rightarrow 782\,108\,342 \end{array} \right) \rightarrow \{4 \rightarrow 3.73846 \times 10^{-6}, 3 \rightarrow 0.999996\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of colored dots]} \\ \rightarrow 785\,621\,045 \end{array} \right) \rightarrow \{4 \rightarrow 1.13554 \times 10^{-10}, 3 \rightarrow 1.\},$$

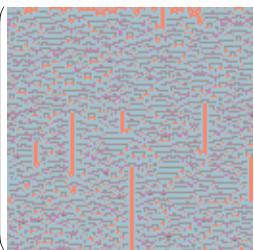
$$\left(\begin{array}{c} \text{[A 2x2 grid of colored dots]} \\ \rightarrow 540\,834\,160 \end{array} \right) \rightarrow \{4 \rightarrow 0.0000100212, 3 \rightarrow 0.99999\},$$

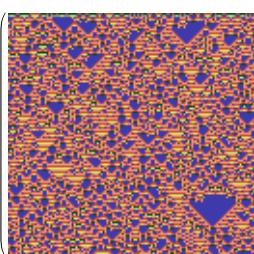
$$\left(\begin{array}{c} \text{[A 2x2 grid of colored dots]} \\ \rightarrow 1\,180\,125\,611 \end{array} \right) \rightarrow \{3 \rightarrow 8.69272 \times 10^{-10}, 4 \rightarrow 1.\},$$

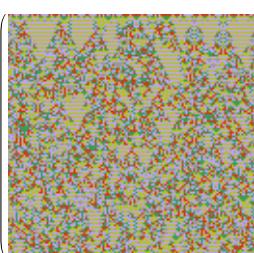
$$\left(\begin{array}{c} \text{[A 2x2 grid of colored dots]} \\ \rightarrow 604\,699\,906 \end{array} \right) \rightarrow \{4 \rightarrow 5.02809 \times 10^{-11}, 3 \rightarrow 1.\}$$

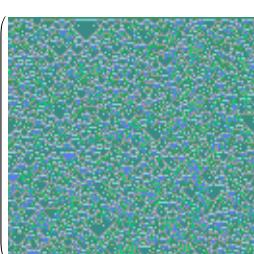
6-colour totalistic, range 1

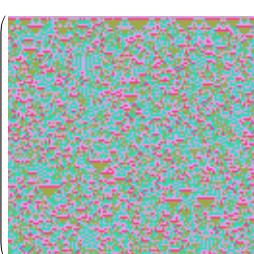
```
In[]:= test4Data6kr1C18 = data6TC[8, 128, 128];
Thread[
  test4Data6kr1C18 → netECA18[Keys@test4Data6kr1C18, {"TopProbabilities", 2}]]
```

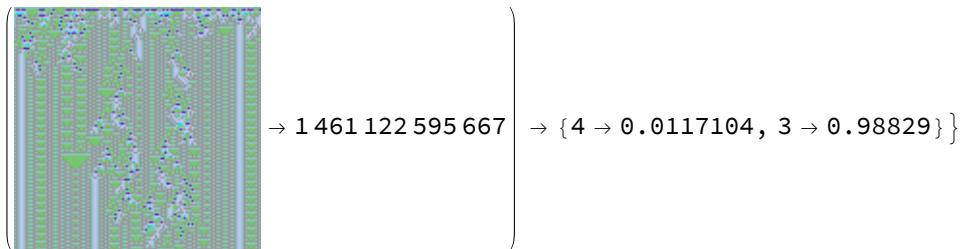
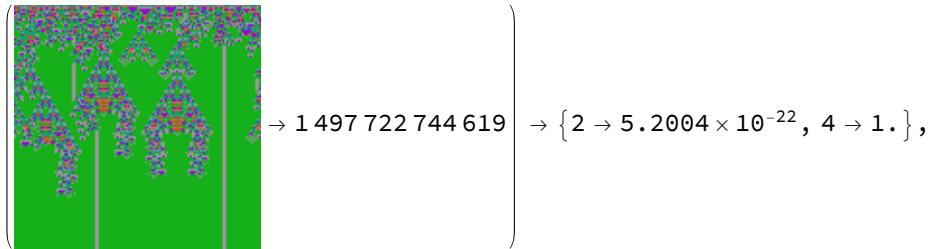
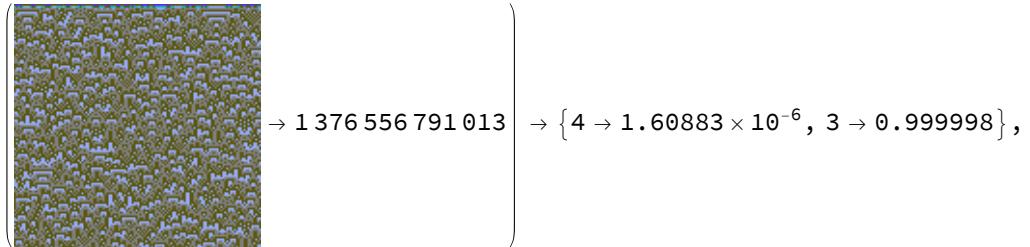
Out[]:= { → 1 598 104 240 744} → {4 → 0.385354, 3 → 0.614646},

{ → 2 744 610 103 617} → {4 → 4.14684 × 10⁻¹², 3 → 1.},

{ → 2 679 723 007 553} → {4 → 0.0146554, 3 → 0.985345},

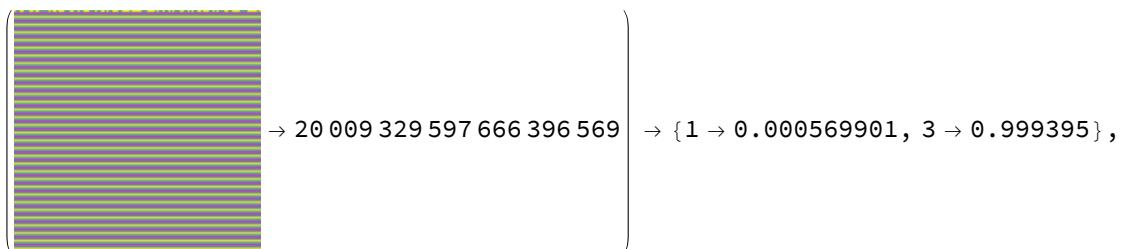
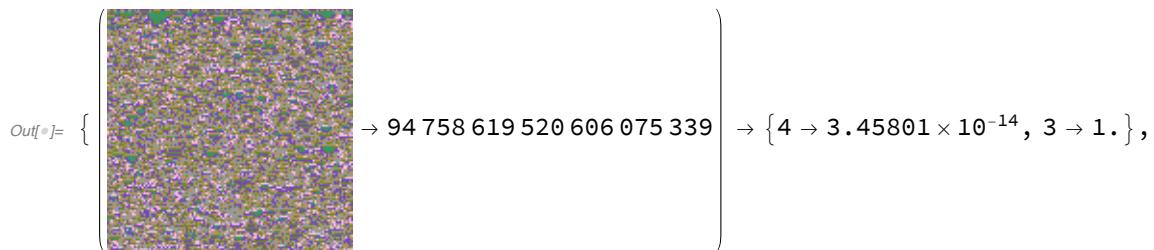
{ → 333 206 194 422} → {4 → 1.77212 × 10⁻⁶, 3 → 0.999998},

{ → 385 745 608 648} → {4 → 4.96414 × 10⁻¹⁸, 3 → 1.},



6-colour totalistic, range 2

```
In[]:= test4Data6kr2C18 = data6T2C[8, 128, 128];
Thread[
  test4Data6kr2C18 → netECA18[Keys@test4Data6kr2C18, {"TopProbabilities", 2}]]
```



$$\left(\begin{array}{c} \text{[A 4x3 grid of random colors]} \\ \rightarrow 143\ 751\ 744\ 015\ 528\ 766\ 387 \end{array} \right) \rightarrow \{ 4 \rightarrow 4.63781 \times 10^{-12}, 3 \rightarrow 1. \},$$

$$\left(\begin{array}{c} \text{[A 4x3 grid of random colors]} \\ \rightarrow 14\ 907\ 007\ 420\ 911\ 525\ 245 \end{array} \right) \rightarrow \{ 4 \rightarrow 2.71632 \times 10^{-7}, 3 \rightarrow 1. \},$$

$$\left(\begin{array}{c} \text{[A 4x3 grid of random colors]} \\ \rightarrow 153\ 725\ 842\ 134\ 059\ 084\ 151 \end{array} \right) \rightarrow \{ 4 \rightarrow 8.53867 \times 10^{-11}, 3 \rightarrow 1. \},$$

$$\left(\begin{array}{c} \text{[A 4x3 grid of random colors]} \\ \rightarrow 21\ 849\ 107\ 846\ 366\ 361\ 856 \end{array} \right) \rightarrow \{ 4 \rightarrow 4.26147 \times 10^{-8}, 3 \rightarrow 1. \},$$

$$\left(\begin{array}{c} \text{[A 4x3 grid of random colors]} \\ \rightarrow 39\ 897\ 609\ 306\ 289\ 130\ 946 \end{array} \right) \rightarrow \{ 4 \rightarrow 3.43225 \times 10^{-8}, 3 \rightarrow 1. \},$$

$$\left(\begin{array}{c} \text{[A 4x3 grid of random colors]} \\ \rightarrow 24\ 452\ 844\ 112\ 980\ 510\ 505 \end{array} \right) \rightarrow \{ 3 \rightarrow 2.30799 \times 10^{-17}, 4 \rightarrow 1. \}$$

7-colour totalistic, range 1

```
In[]:= test4Data7kr1C18 = data7TC[8, 128, 128];
Thread[
  test4Data7kr1C18 → netECA18[Keys@test4Data7kr1C18, {"TopProbabilities", 2}]]
```

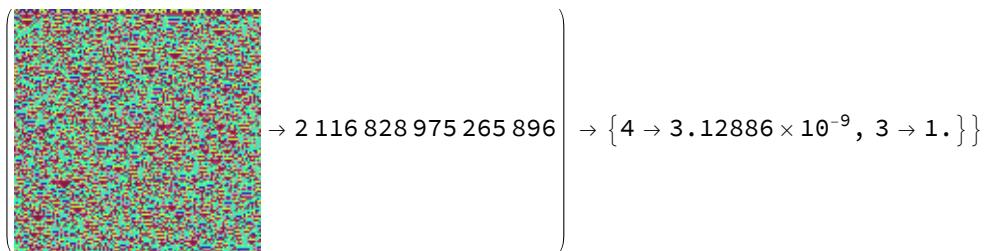
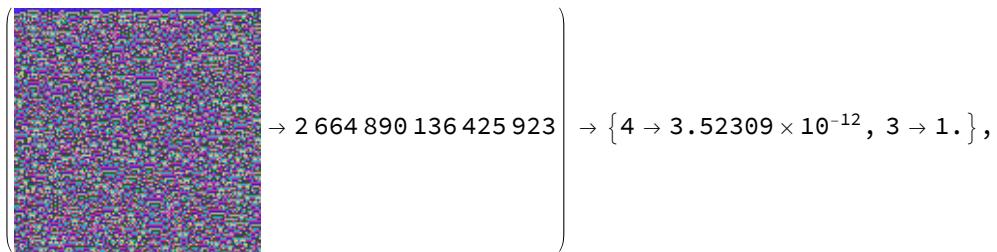
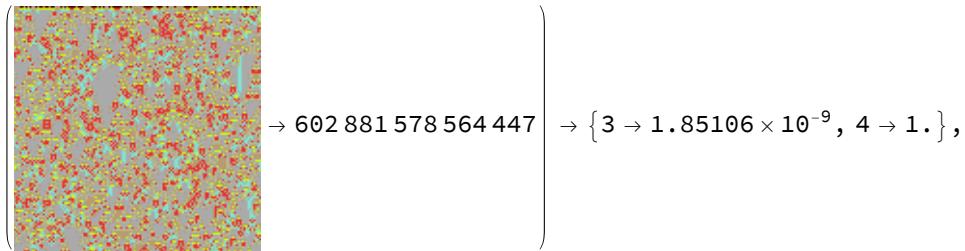
Out[]:= $\left\{ \begin{array}{c} \text{A 128x128 grid of 7 colors (red, green, blue, yellow, cyan, magenta, black) showing a pattern of vertical stripes.} \\ \rightarrow 9377524399313965 \end{array} \right\} \rightarrow \{3 \rightarrow 1.74389 \times 10^{-8}, 4 \rightarrow 1.\},$

Out[]:= $\left\{ \begin{array}{c} \text{A 128x128 grid of 7 colors showing a more uniform, noisy pattern compared to the first one.} \\ \rightarrow 4962953862340599 \end{array} \right\} \rightarrow \{4 \rightarrow 0.0137316, 3 \rightarrow 0.986268\},$

Out[]:= $\left\{ \begin{array}{c} \text{A 128x128 grid of 7 colors showing a dense, granular pattern.} \\ \rightarrow 8745570953687246 \end{array} \right\} \rightarrow \{4 \rightarrow 2.19284 \times 10^{-7}, 3 \rightarrow 1.\},$

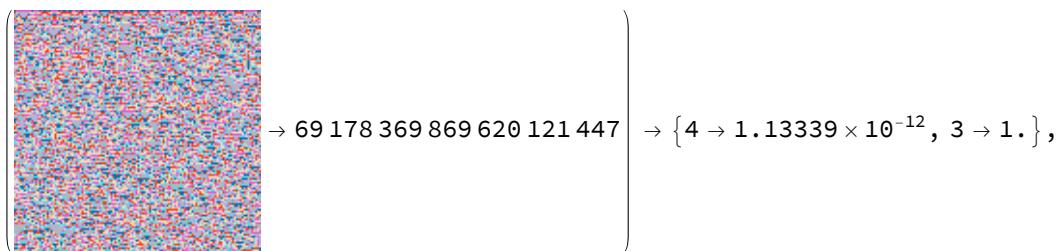
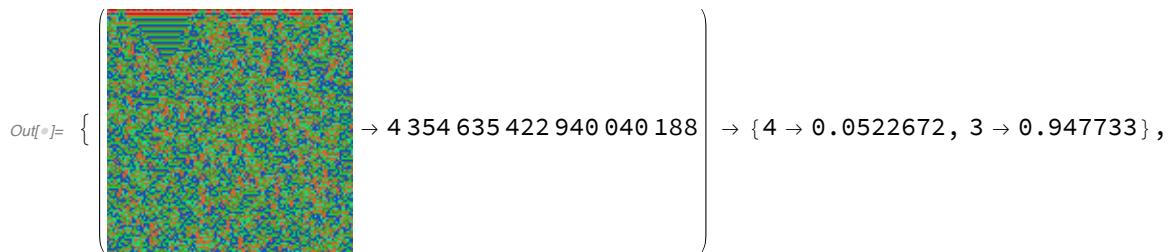
Out[]:= $\left\{ \begin{array}{c} \text{A 128x128 grid of 7 colors showing a sparse, scattered pattern.} \\ \rightarrow 5868018872447407 \end{array} \right\} \rightarrow \{4 \rightarrow 0.000111761, 3 \rightarrow 0.999888\},$

Out[]:= $\left\{ \begin{array}{c} \text{A 128x128 grid of 7 colors showing a very sparse, almost uniform pattern.} \\ \rightarrow 4309418628605253 \end{array} \right\} \rightarrow \{4 \rightarrow 1.75407 \times 10^{-6}, 3 \rightarrow 0.999998\},$



8-colour totalistic, range 1

```
In[8]:= test4Data8kr1C18 = data8TC[8, 128, 128];
Thread[
  test4Data8kr1C18 → netECA18[Keys@test4Data8kr1C18, {"TopProbabilities", 2}]]
```



$$\left(\begin{array}{c} \text{Image 1: A 10x10 grid with various colored cells (red, green, blue, yellow, purple)} \\ \rightarrow 52\ 954\ 223\ 906\ 783\ 093\ 008 \end{array} \right) \rightarrow \{3 \rightarrow 7.29147 \times 10^{-15}, 4 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{Image 2: A 10x10 grid with mostly red and green cells, some blue and yellow} \\ \rightarrow 68\ 658\ 165\ 468\ 973\ 438\ 000 \end{array} \right) \rightarrow \{4 \rightarrow 1.9166 \times 10^{-11}, 3 \rightarrow 1.\},$$

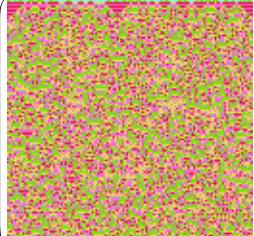
$$\left(\begin{array}{c} \text{Image 3: A 10x10 grid with mostly blue and green cells, some red and yellow} \\ \rightarrow 40\ 882\ 704\ 313\ 683\ 534\ 715 \end{array} \right) \rightarrow \{4 \rightarrow 0.0000183002, 3 \rightarrow 0.999982\},$$

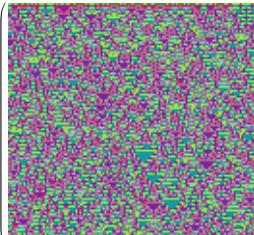
$$\left(\begin{array}{c} \text{Image 4: A 10x10 grid with mostly green and blue cells, some red and yellow} \\ \rightarrow 4\ 334\ 236\ 228\ 138\ 547\ 400 \end{array} \right) \rightarrow \{4 \rightarrow 1.8216 \times 10^{-12}, 3 \rightarrow 1.\},$$

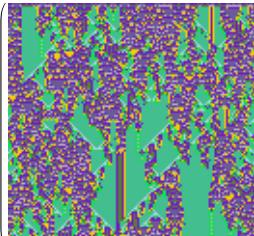
$$\left(\begin{array}{c} \text{Image 5: A 10x10 grid with mostly yellow and green cells, some red and blue} \\ \rightarrow 38\ 056\ 813\ 477\ 139\ 716\ 563 \end{array} \right) \rightarrow \{4 \rightarrow 0.025224, 3 \rightarrow 0.974776\},$$

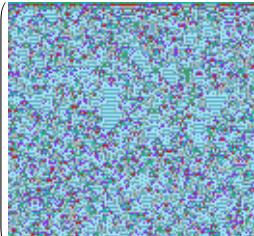
$$\left(\begin{array}{c} \text{Image 6: A 10x10 grid with mostly yellow and blue cells, some red and green} \\ \rightarrow 17\ 144\ 034\ 197\ 046\ 476\ 300 \end{array} \right) \rightarrow \{4 \rightarrow 1.1918 \times 10^{-10}, 3 \rightarrow 1.\}$$

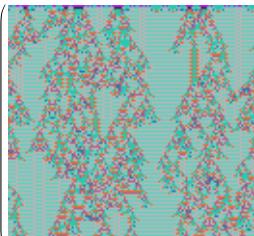
```
In[8]:= test4Data8kr1C18 = data8TC[8, 128, 128];
Thread[
  test4Data8kr1C18 → netECA18[Keys@test4Data8kr1C18, {"TopProbabilities", 2}]]
```

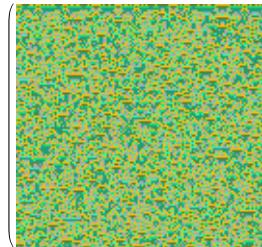
Out[8]= { → 27 295 602 810 117 462 452 } → {4 → 1.93716 × 10⁻¹⁴, 3 → 1.},

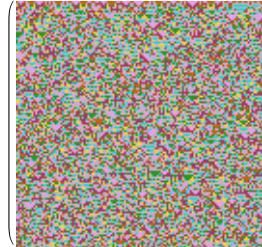
{ → 68 187 226 482 692 112 227 } → {4 → 1.97888 × 10⁻¹⁵, 3 → 1.},

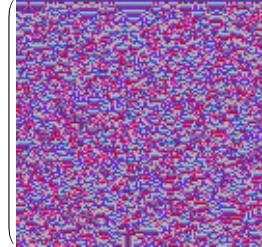
{ → 26 338 422 679 712 858 793 } → {2 → 1.54265 × 10⁻¹⁵, 4 → 1.},

{ → 20 106 191 194 925 098 456 } → {4 → 1.32784 × 10⁻⁹, 3 → 1.},

{ → 27 427 530 853 867 733 909 } → {3 → 7.69696 × 10⁻⁶, 4 → 0.999992},

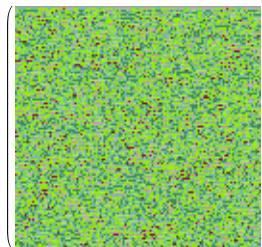
 → 67 626 281 665 658 424 537 } → { 4 → 1.31383×10^{-8} , 3 → 1. },

 → 25 326 375 293 896 897 208 } → { 4 → 9.39517×10^{-8} , 3 → 1. },

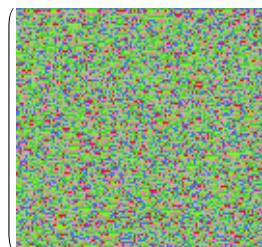
 → 17 284 363 590 068 343 962 } → { 4 → 0.000164327, 3 → 0.999836 }

8-colour totalistic, range 2

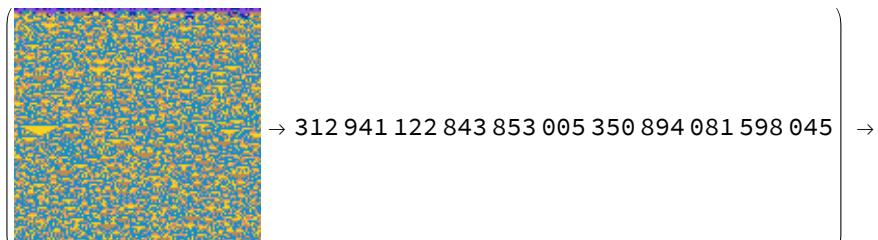
```
In[]:= test4Data8kr2C18 = data8T2C[8, 128, 128];
Thread[
  test4Data8kr2C18 → netECA18[Keys@test4Data8kr2C18, {"TopProbabilities", 2}]]
```

Out[]:= { → 91 605 229 994 459 866 473 701 555 510 459 } →

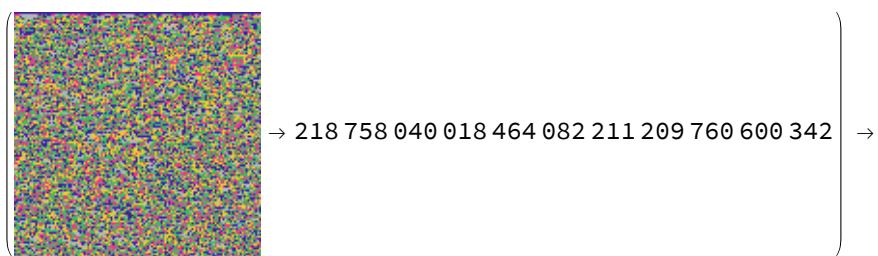
{ 4 → 8.95721×10^{-9} , 3 → 1. },

 → 148 194 329 210 486 766 360 332 149 681 908 } →

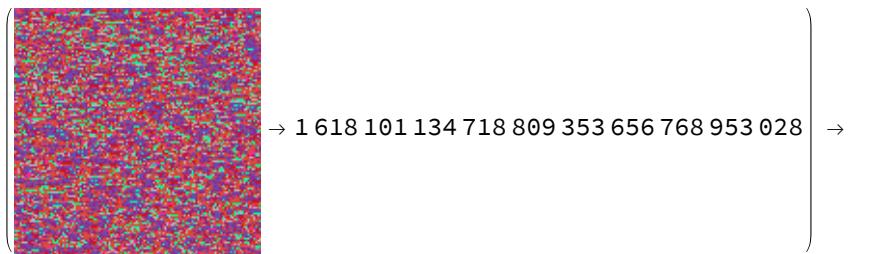
{ 4 → 0.000259168, 3 → 0.999741 },



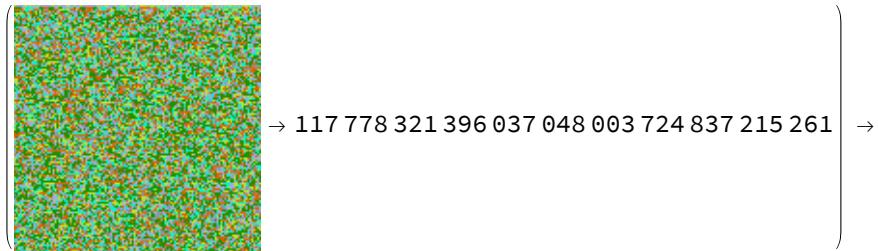
$\{4 \rightarrow 3.01437 \times 10^{-25}, 3 \rightarrow 1.\},$



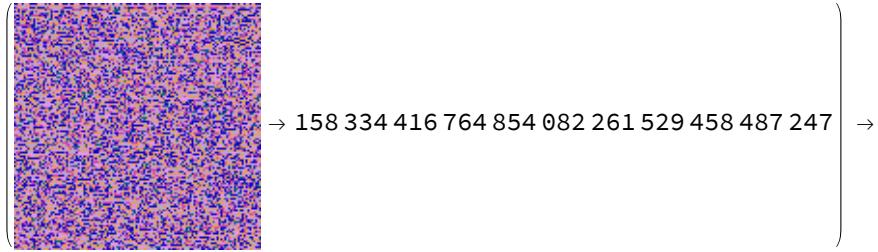
$\{4 \rightarrow 1.84707 \times 10^{-6}, 3 \rightarrow 0.999998\},$



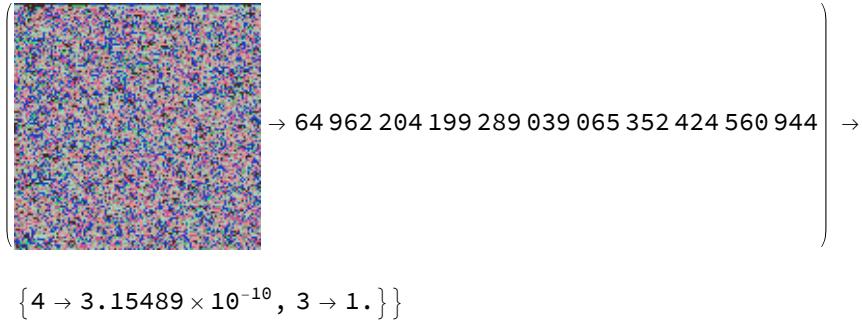
$\{4 \rightarrow 8.91462 \times 10^{-12}, 3 \rightarrow 1.\},$



$\{4 \rightarrow 1.56349 \times 10^{-7}, 3 \rightarrow 1.\},$

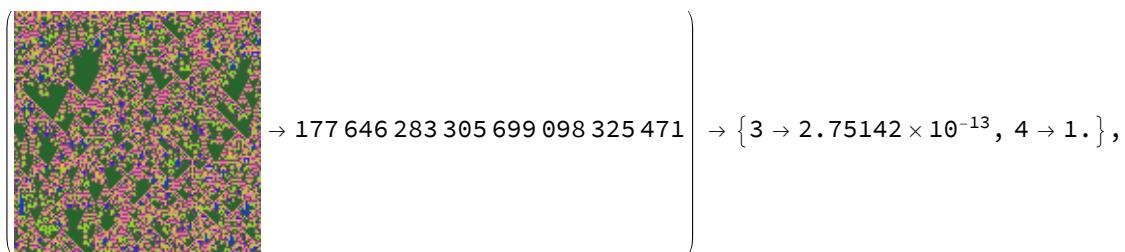
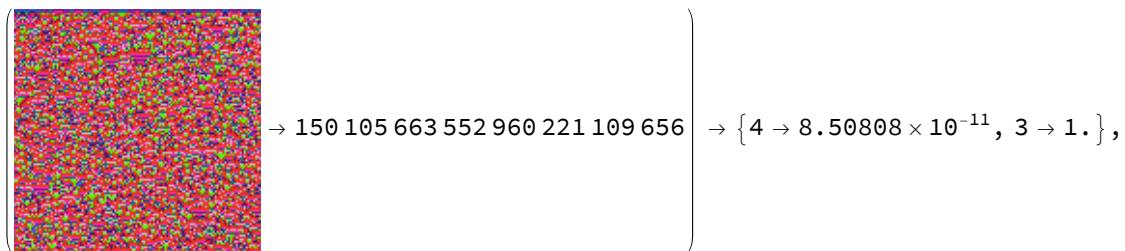
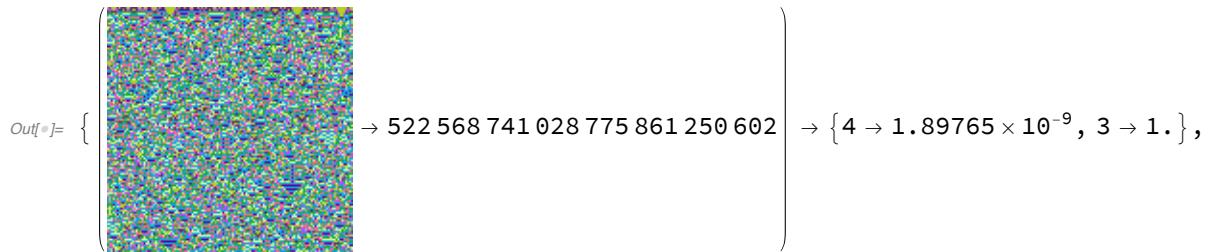


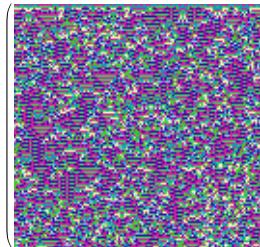
$\{3 \rightarrow 0.381514, 4 \rightarrow 0.618486\},$

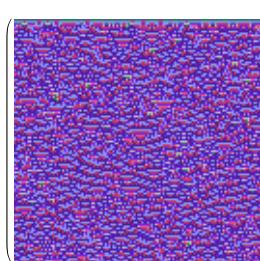


9-colour totalistic, range 1

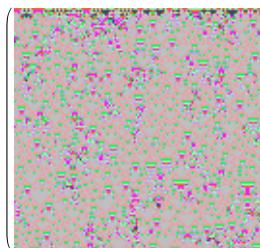
```
In[8]:= test4Data9kr1C18 = data9TC[8, 128, 128];
Thread[
  test4Data9kr1C18 &gt;> netECA18[Keys@test4Data9kr1C18, {"TopProbabilities", 2}]]
```



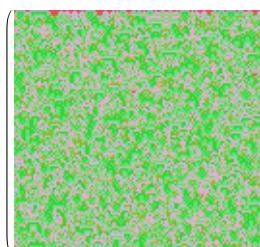

 $\rightarrow 572\ 736\ 978\ 221\ 231\ 214\ 545\ 140 \quad \left. \right\} \rightarrow \{4 \rightarrow 1.19931 \times 10^{-8}, 3 \rightarrow 1.\},$


 $\rightarrow 577\ 735\ 506\ 397\ 144\ 743\ 916\ 701 \quad \left. \right\} \rightarrow$

$\{4 \rightarrow 5.16186 \times 10^{-6}, 3 \rightarrow 0.999995\},$

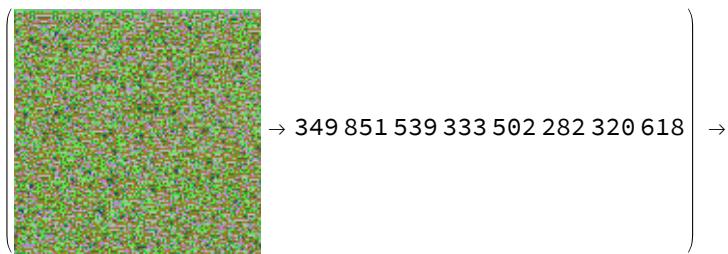
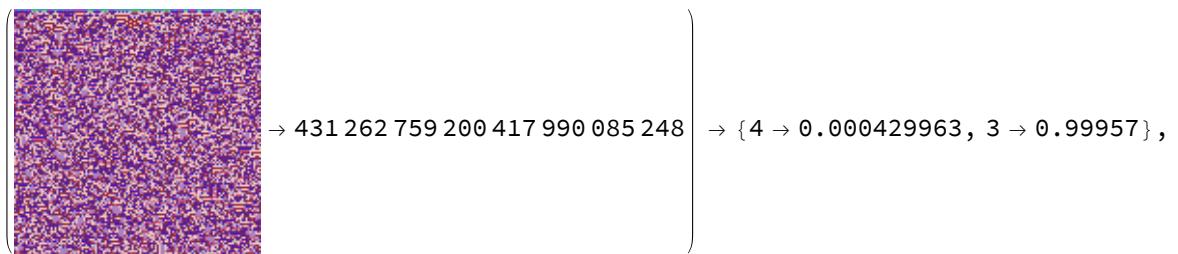
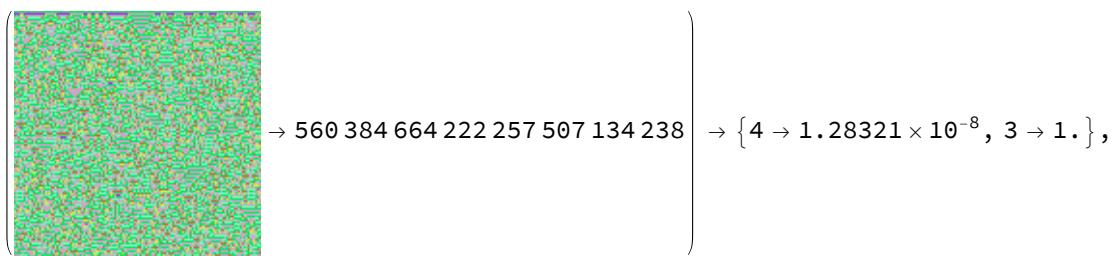
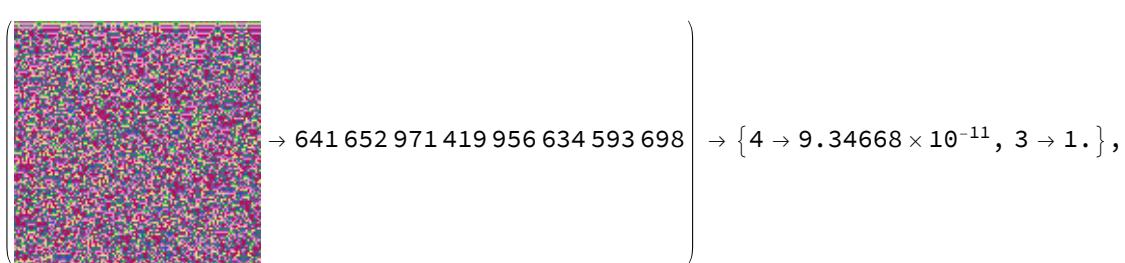
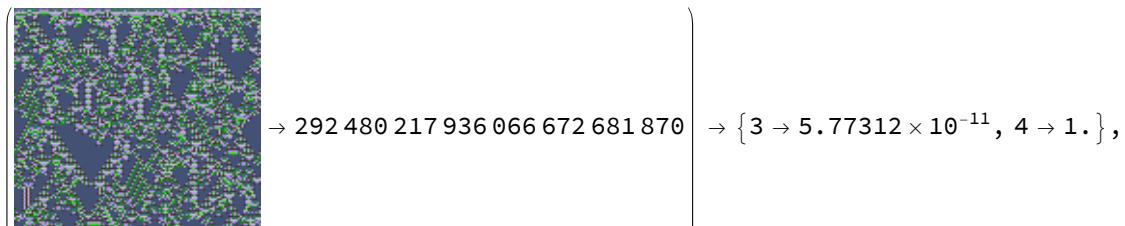

 $\rightarrow 38\ 290\ 460\ 957\ 561\ 945\ 226\ 664 \quad \left. \right\} \rightarrow$

$\{4 \rightarrow 0.0000332421, 3 \rightarrow 0.999967\},$


 $\rightarrow 65\ 266\ 980\ 214\ 577\ 653\ 296\ 276 \quad \left. \right\} \rightarrow \{4 \rightarrow 2.0037 \times 10^{-9}, 3 \rightarrow 1.\}$

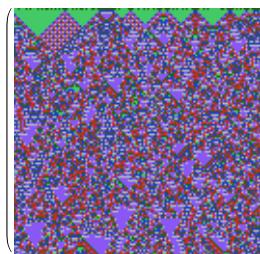
```
In[6]:= test4Data9kr1C18 = data9TC[8, 128, 128];
Thread[
  test4Data9kr1C18 \[Function] netECA18[Keys@test4Data9kr1C18, {"TopProbabilities", 2}]]
```

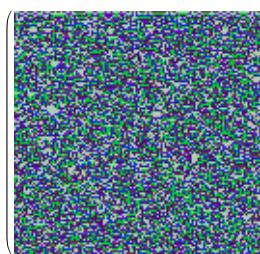
$Out[6]= \left\{ \begin{array}{l} \text{A 128x128 pixel grayscale image showing a pattern of red, green, and blue pixels.} \\ \rightarrow 376\ 251\ 875\ 419\ 739\ 043\ 750\ 089 \end{array} \right\} \rightarrow \{4 \rightarrow 8.56952 \times 10^{-8}, 3 \rightarrow 1.\},$



$\{4 \rightarrow 5.50927 \times 10^{-7}, 3 \rightarrow 0.999999\},$

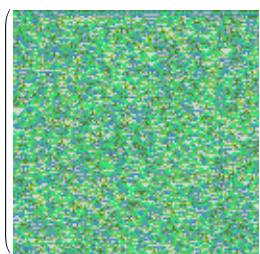
```

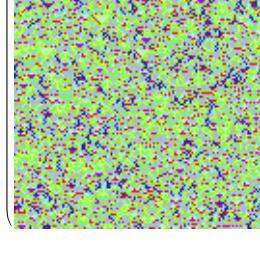

 $\rightarrow 141\ 618\ 270\ 878\ 027\ 879\ 702\ 319$ 
 $\left. \right\} \rightarrow$ 
 $\{4 \rightarrow 0.0000610287, 3 \rightarrow 0.999939\},$ 

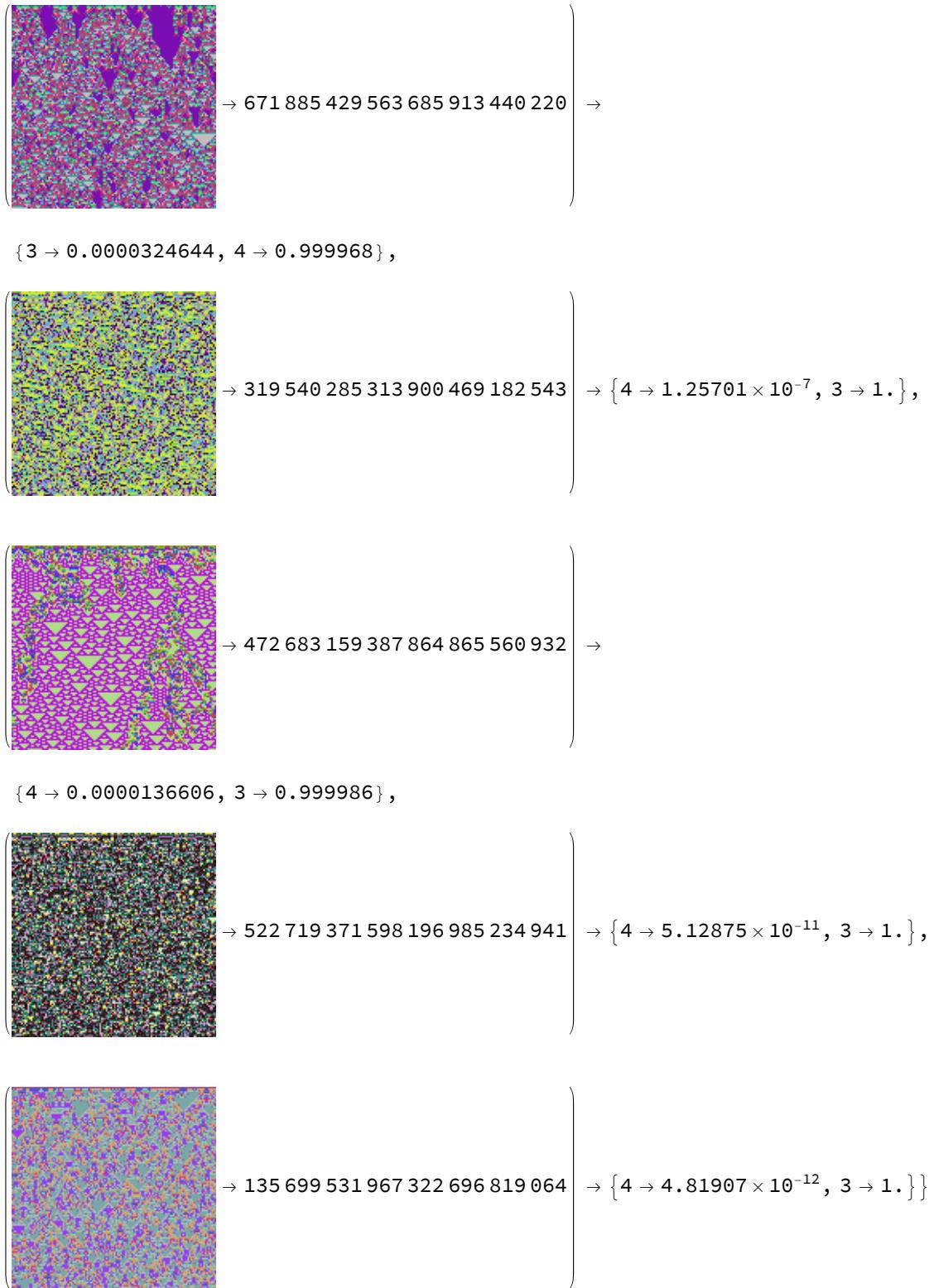

 $\rightarrow 401\ 516\ 309\ 538\ 894\ 848\ 288\ 118$ 
 $\left. \right\} \rightarrow \{4 \rightarrow 6.7734 \times 10^{-12}, 3 \rightarrow 1.\}\}$ 

In[8]:= test4Data9kr1C18 = data9TC[8, 128, 128];
Thread[
  test4Data9kr1C18 \[Function] netECA18[Keys@test4Data9kr1C18, {"TopProbabilities", 2}]]
```

Out[8]= {


 $\rightarrow 102\ 484\ 955\ 339\ 910\ 707\ 201\ 065$
 $\left. \right\} \rightarrow \{4 \rightarrow 2.85292 \times 10^{-12}, 3 \rightarrow 1.\},$

 $\rightarrow 225\ 104\ 493\ 515\ 167\ 213\ 968\ 116$
 $\left. \right\} \rightarrow \{4 \rightarrow 2.59132 \times 10^{-19}, 3 \rightarrow 1.\},$

 $\rightarrow 82\ 955\ 736\ 870\ 484\ 114\ 072\ 206$
 $\left. \right\} \rightarrow \{4 \rightarrow 7.69447 \times 10^{-10}, 3 \rightarrow 1.\},$



Network XIX - Four convolutions, dropout on linear only, BatchNorm, MaxPool

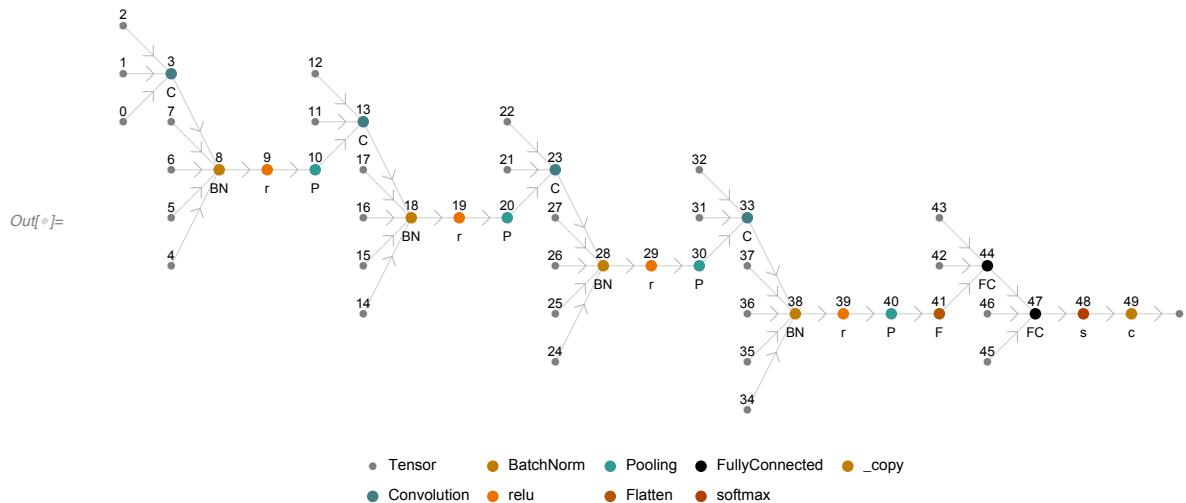
```
In[6]:= netECA19 = netElevenCC1024drop[128, 128]
```

```

Out[]:= NetChain[]
          Input
          conv1 ConvolutionLayer
          bat1 BatchNormalizationLayer
          ramp1 Ramp
          pooling1 PoolingLayer
          conv2 ConvolutionLayer
          bat2 BatchNormalizationLayer
          ramp2 Ramp
          pooling2 PoolingLayer
          conv3 ConvolutionLayer
          bat3 BatchNormalizationLayer
          ramp3 Ramp
          pooling3 PoolingLayer
          conv4 ConvolutionLayer
          bat4 BatchNormalizationLayer
          ramp4 Ramp
          pooling4 PoolingLayer
          flatten FlattenLayer
          linear LinearLayer
          drop2 DropoutLayer
          linear2 LinearLayer
          softmax SoftmaxLayer
          Output
          image array (size: 3 × 128 × 128)
          array (size: 48 × 126 × 126)
          array (size: 48 × 126 × 126)
          array (size: 48 × 126 × 126)
          array (size: 48 × 125 × 125)
          array (size: 24 × 123 × 123)
          array (size: 24 × 123 × 123)
          array (size: 24 × 123 × 123)
          array (size: 24 × 122 × 122)
          array (size: 24 × 120 × 120)
          array (size: 24 × 120 × 120)
          array (size: 24 × 120 × 120)
          array (size: 24 × 119 × 119)
          array (size: 12 × 117 × 117)
          array (size: 12 × 117 × 117)
          array (size: 12 × 117 × 117)
          array (size: 12 × 116 × 116)
          vector (size: 161472)
          vector (size: 1024)
          vector (size: 1024)
          vector (size: 4)
          vector (size: 4)
          class
        ]

```

```
In[]:= NetInformation[netECA19, "MXNetNodeGraphPlot"]
```



```
In[]:= NetInformation[netECA19, "SummaryGraphic"]
```



```
In[]:= dataECA19 = dataC[128, 128, 16 384];
```

```
In[]:= dataTotalistic2BigC19 = genData2r2C[128, 128, 4096];
```

```
In[]:= dataTotalistic3BigC19 = data3T2C[128, 128, 4096];
```

```
In[]:= dataTotalistic4BigC19 = data4TC[128, 128, 4096];
```

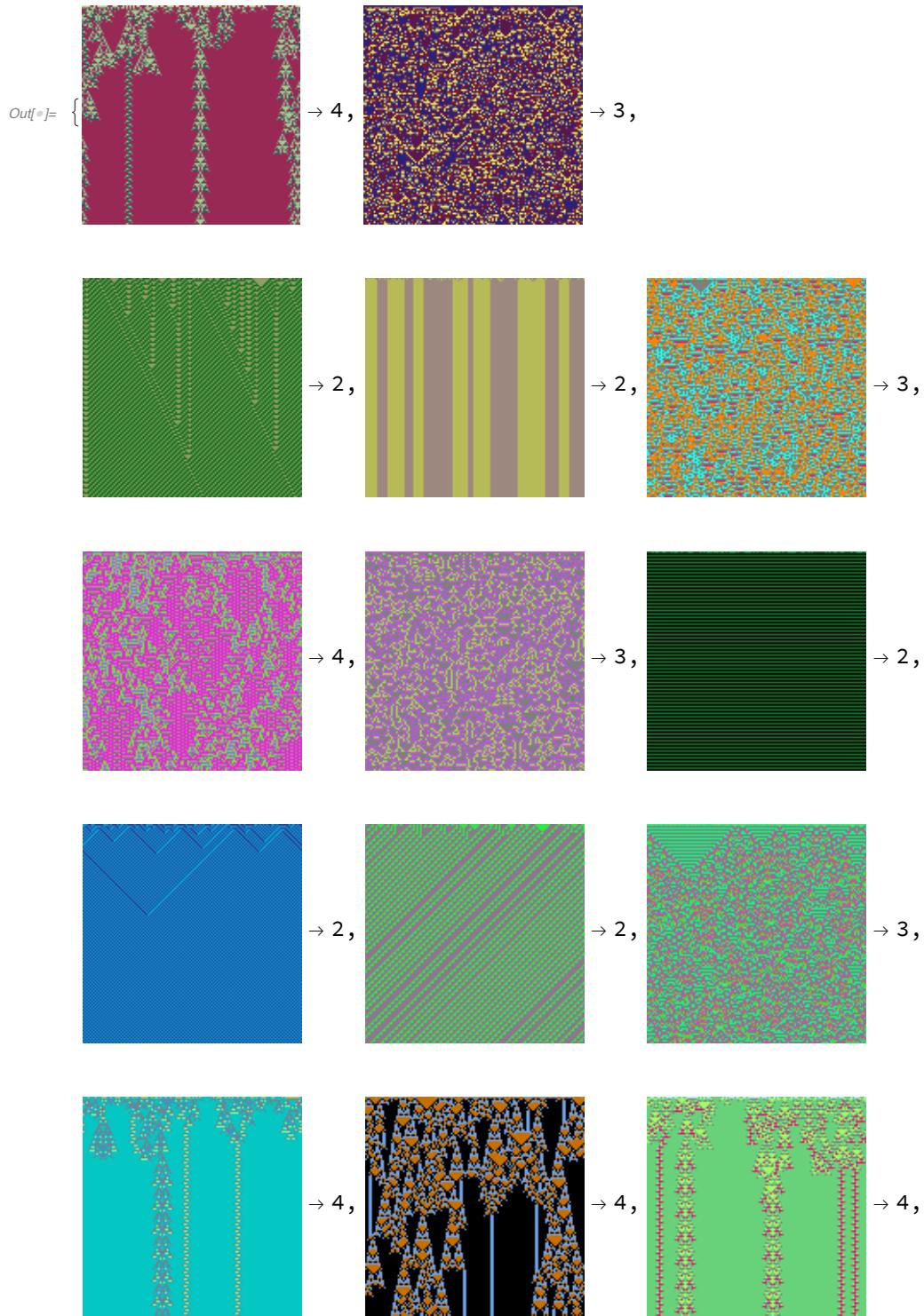
```
In[]:= dataTotalistic5BigC19 = genData5TCC[128, 128, 16 384];
```

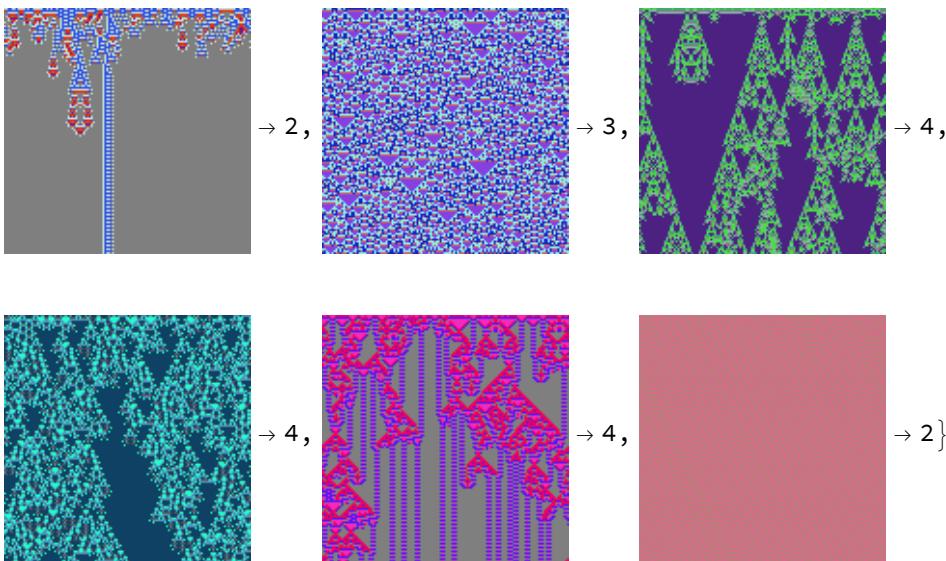
```
In[]:= fullTrainingBigC19 = Join[dataECA19, dataTotalistic2BigC19,
                                dataTotalistic3BigC19, dataTotalistic4BigC19, dataTotalistic5BigC19];
```

```
In[®]:= Length[fullTrainingBigC19]
```

```
Out[®]= 90112
```

```
In[®]:= RandomSample[fullTrainingBigC19, 20]
```



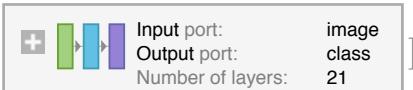


```
In[6]:= dir = SetDirectory[NotebookDirectory[]]
Out[6]= /home/esilverman/Documents

In[7]:= netECA19 = NetTrain[netECA19, fullTrainingBigC19,
    MaxTrainingRounds → 200, BatchSize → 256, TargetDevice → "GPU",
    TrainingProgressCheckpointing → {"Directory", dir}]
```

Generate test data for Network XIX (200 epochs)

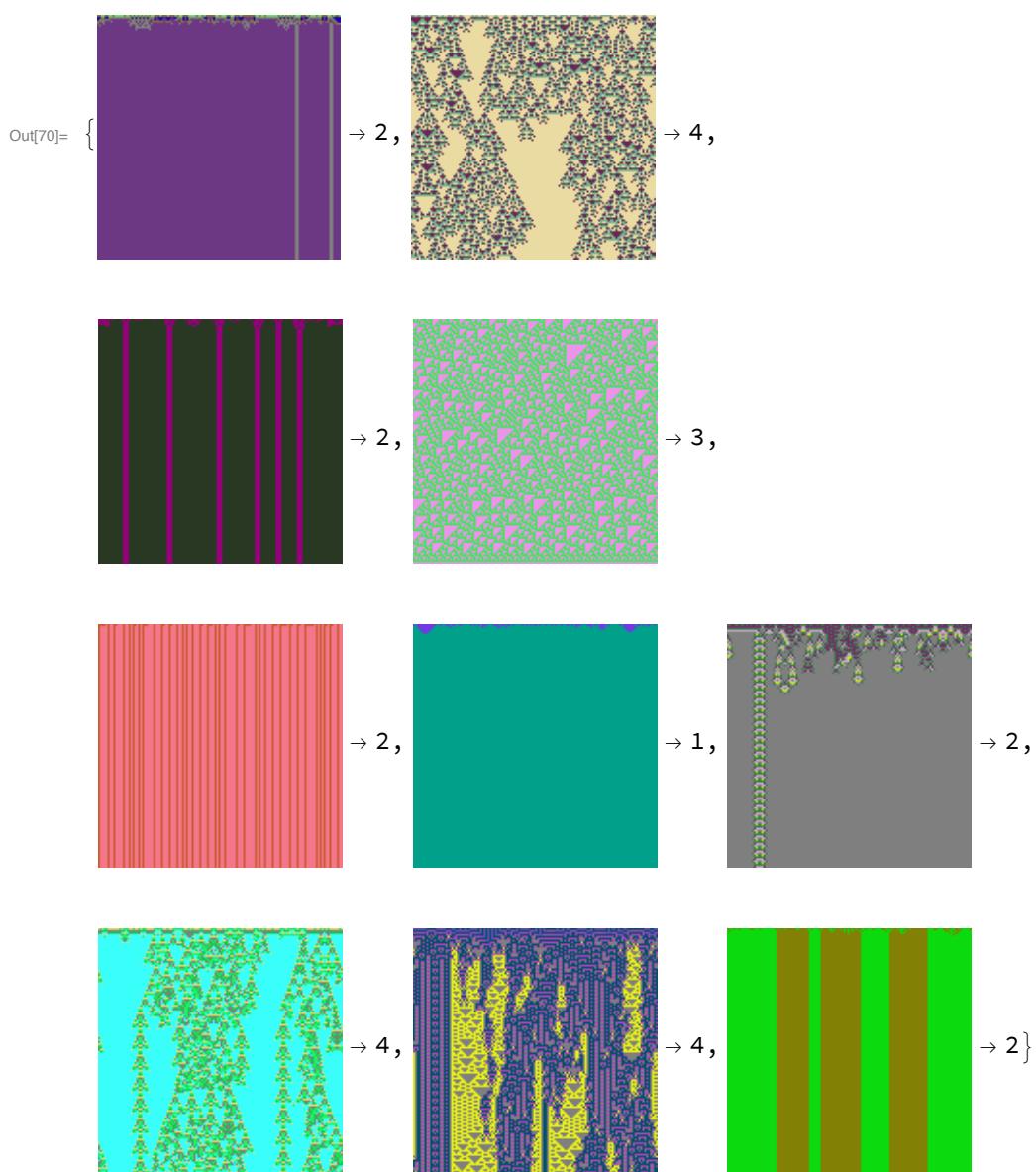
```
In[71]:= dir = SetDirectory[NotebookDirectory[]]
Out[71]= /Users/thorsilver/Downloads/Wolfram notebooks

In[72]:= netECA19 = Import["netECA19-r200.wlnet"]
Out[72]= NetChain[]
Input port: image
Output port: class
Number of layers: 21

In[63]:= 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]

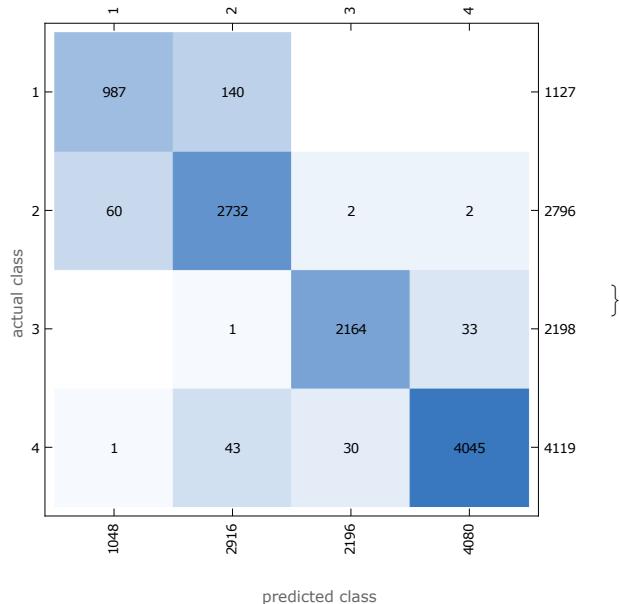
Out[69]= 10 240
```

```
In[70]:= RandomSample[fullTestSetBigC, 10]
```

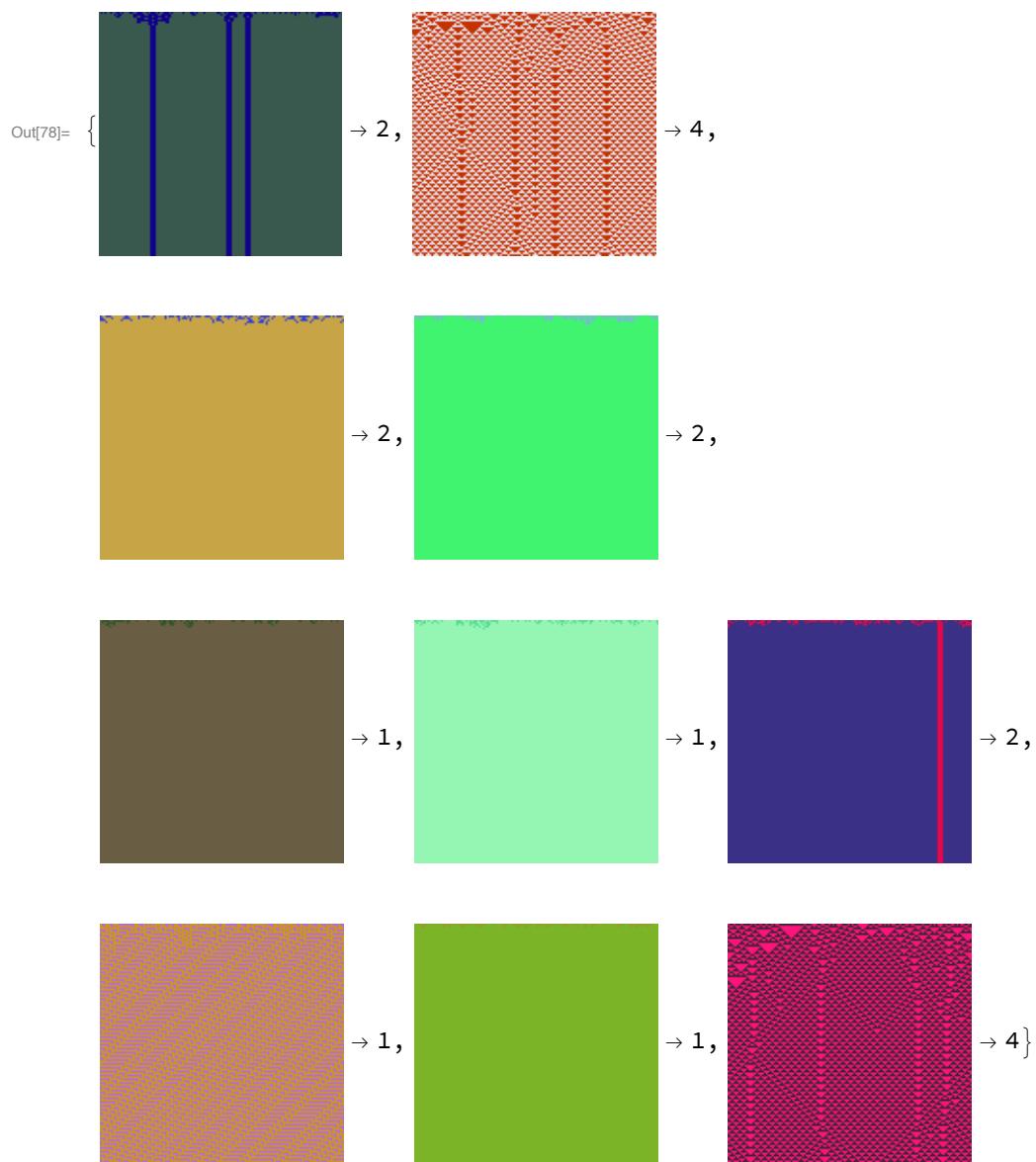


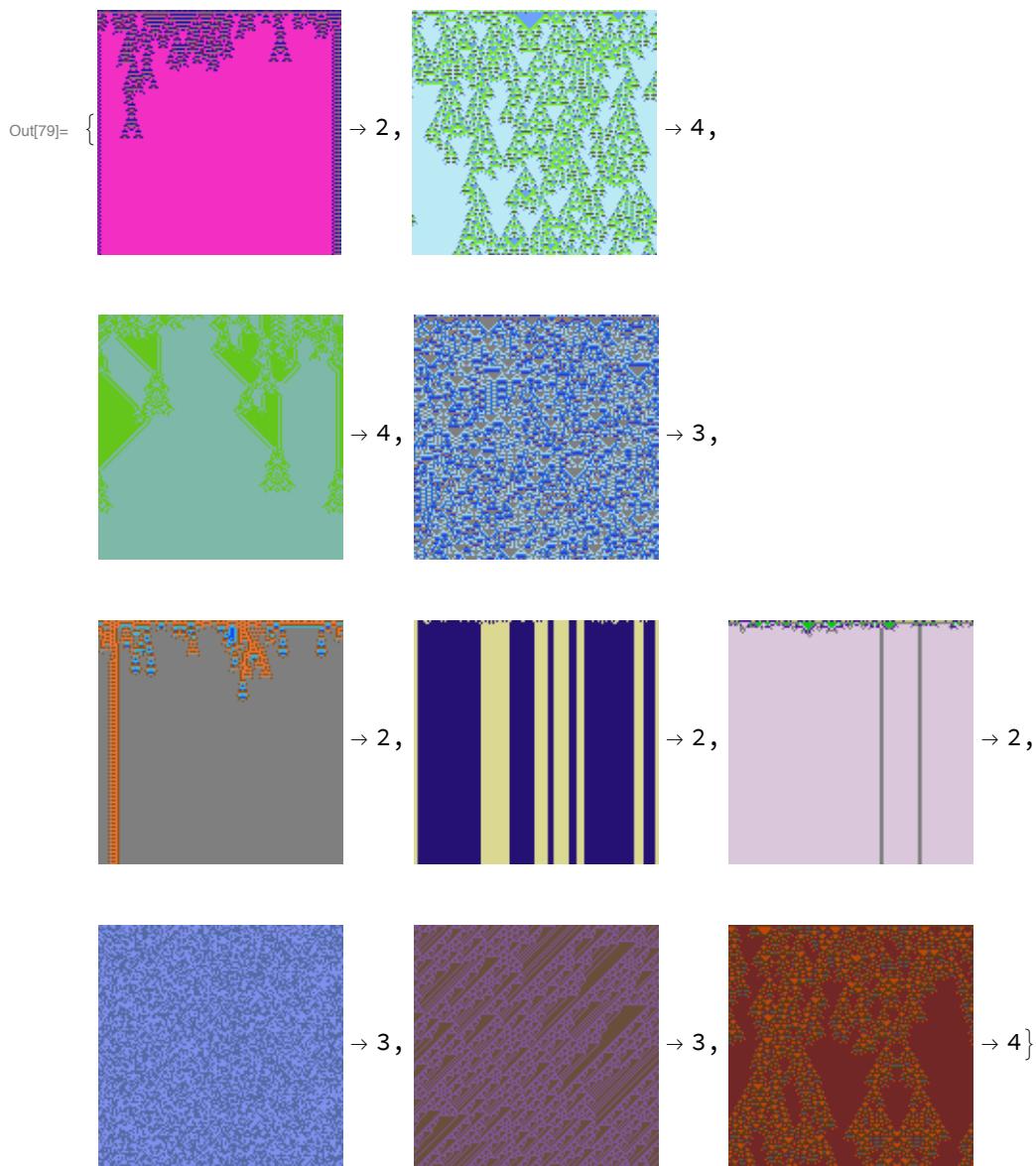
```
In[73]:= NetMeasurements[netECA19, fullTestSetBigC,
 {"Accuracy", "Precision", "ConfusionMatrixPlot"}]

Out[73]= {0.969531, {1 → 0.941794, 2 → 0.9369, 3 → 0.985428, 4 → 0.991422}, }
```



```
In[74]:= entropyImagesBigC = RandomSample[Keys[fullTestSetBigC], 500];
entropiesBigC = netECA19[entropyImagesBigC, "Entropy"];
highEntBigC = entropyImagesBigC[[Ordering[entropiesBigC, -10]]];
lowEntBigC = entropyImagesBigC[[Ordering[entropiesBigC, 10]]];
Thread[highEntBigC → netECA19[highEntBigC]]
Thread[lowEntBigC → netECA19[lowEntBigC]]
```





Testing Network XIX (200 epochs) on unseen CA rule spaces

2-colour non-totalistic, range 2

```
In[84]:= test4Data2kr2C19 = datak2r2C[128, 128, 8];
Thread[
  test4Data2kr2C19 → netECA19[Keys@test4Data2kr2C19, {"TopProbabilities", 2}]]
```

Out[85]= {

$\rightarrow 3\ 623\ 639\ 841$

$\left. \right\} \rightarrow \{4 \rightarrow 5.92466 \times 10^{-19}, 3 \rightarrow 1.\},$

$$\left(\begin{array}{c} \text{[A green pattern with vertical blue lines]} \\ \rightarrow 4\ 204\ 902\ 033 \end{array} \right) \rightarrow \{4 \rightarrow 2.56823 \times 10^{-8}, 2 \rightarrow 1.\},$$

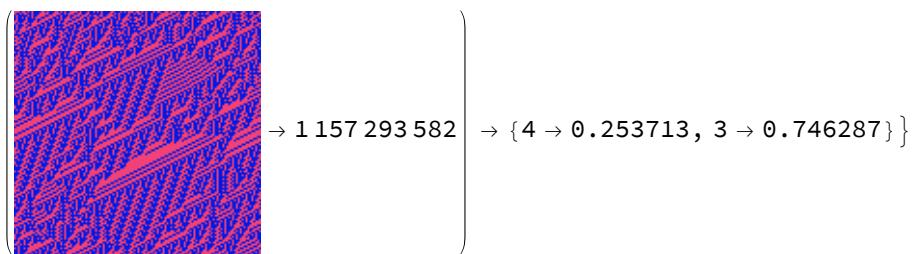
$$\left(\begin{array}{c} \text{[A pink pattern with diagonal black lines]} \\ \rightarrow 3\ 766\ 586\ 648 \end{array} \right) \rightarrow \{1 \rightarrow 0., 3 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A green pattern with small black dots]} \\ \rightarrow 3\ 083\ 711\ 710 \end{array} \right) \rightarrow \{4 \rightarrow 2.17708 \times 10^{-25}, 3 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A purple pattern with diagonal green lines]} \\ \rightarrow 3\ 912\ 062\ 127 \end{array} \right) \rightarrow \{1 \rightarrow 0., 2 \rightarrow 1.\},$$

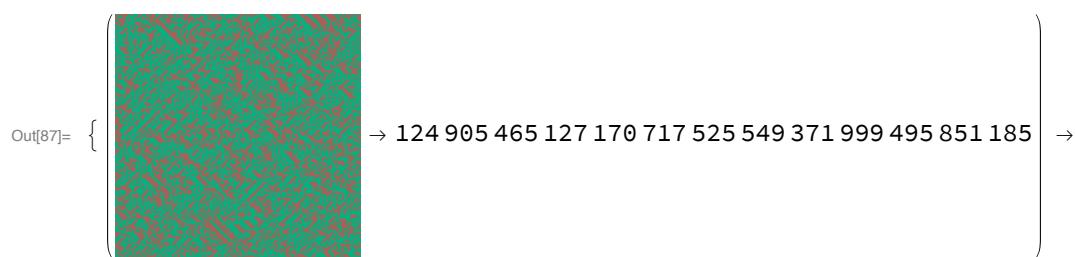
$$\left(\begin{array}{c} \text{[A pink pattern with small black dots]} \\ \rightarrow 3\ 127\ 103\ 417 \end{array} \right) \rightarrow \{1 \rightarrow 0., 3 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A blue pattern with small black dots]} \\ \rightarrow 1\ 368\ 223\ 734 \end{array} \right) \rightarrow \{3 \rightarrow 0.0375692, 4 \rightarrow 0.962431\},$$

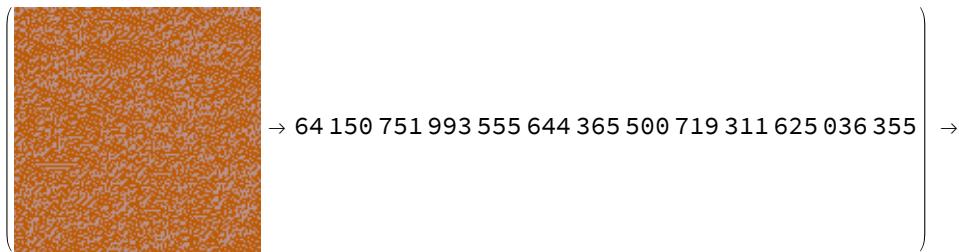


2-colour non-totalistic, range 3

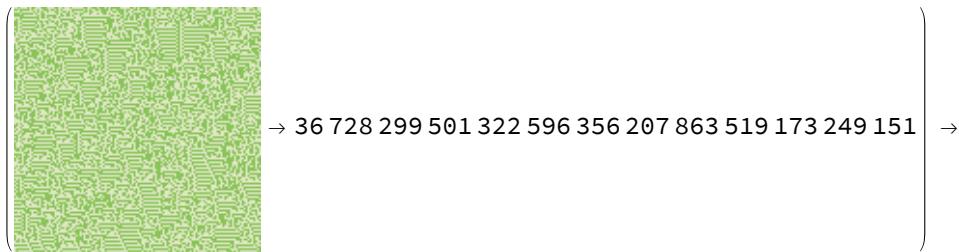
```
In[86]:= test4Data2kr3C19 = datak2r3NT[128, 128, 8];
Thread[
test4Data2kr3C19 → netECA19[Keys@test4Data2kr3C19, {"TopProbabilities", 2}]]
```



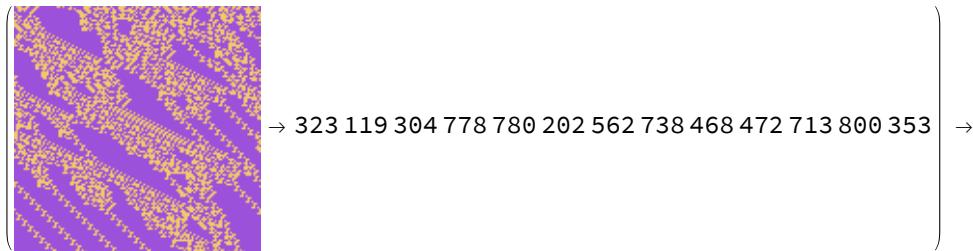
$\{ 4 \rightarrow 4.25787 \times 10^{-22}, 3 \rightarrow 1. \},$



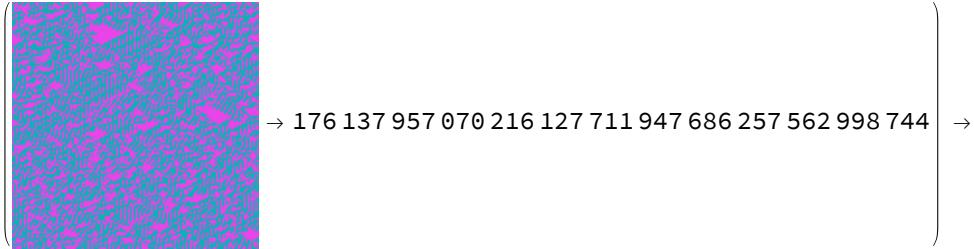
$\{ 4 \rightarrow 3.40968 \times 10^{-31}, 3 \rightarrow 1. \},$



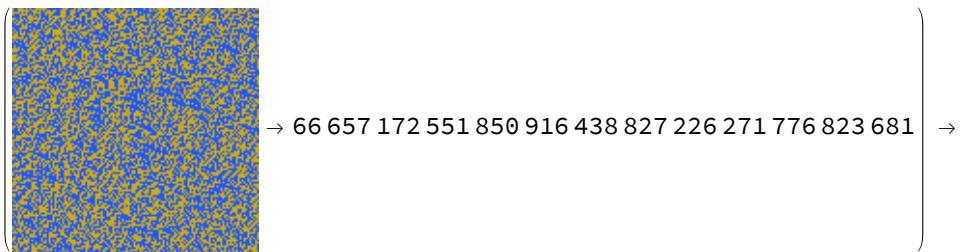
$\{ 4 \rightarrow 1.92235 \times 10^{-12}, 3 \rightarrow 1. \},$



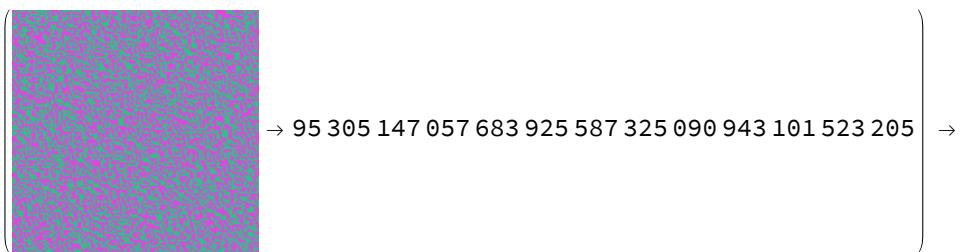
$\{3 \rightarrow 0.190559, 4 \rightarrow 0.809441\},$



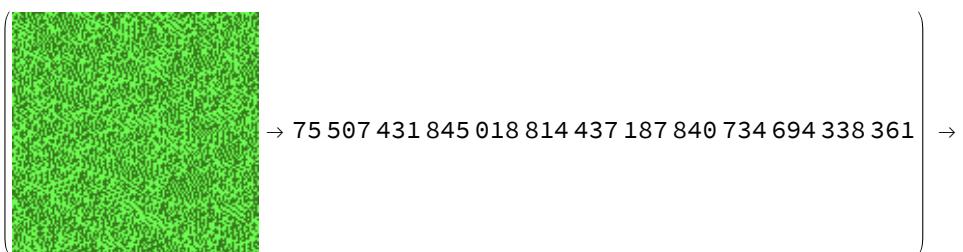
$\{1 \rightarrow 0., 3 \rightarrow 1.\},$



$\{4 \rightarrow 9.37229 \times 10^{-18}, 3 \rightarrow 1.\},$



$\{4 \rightarrow 1.7544 \times 10^{-26}, 3 \rightarrow 1.\},$



$\{4 \rightarrow 1.14088 \times 10^{-28}, 3 \rightarrow 1.\}$

3-colour non-totalistic, range 1

```
In[90]:= test4Data3kr1C19 = datak3r1NT[128, 128, 8];
Thread[
test4Data3kr1C19 → netECA19[Keys@test4Data3kr1C19, {"TopProbabilities", 2}]]
```

Out[91]= $\left\{ \begin{array}{c} \text{(A 10x10 grid of black dots on a white background)} \\ \rightarrow 903\ 740\ 772\ 813 \end{array} \right\} \rightarrow \{4 \rightarrow 1.43387 \times 10^{-14}, 3 \rightarrow 1.\},$

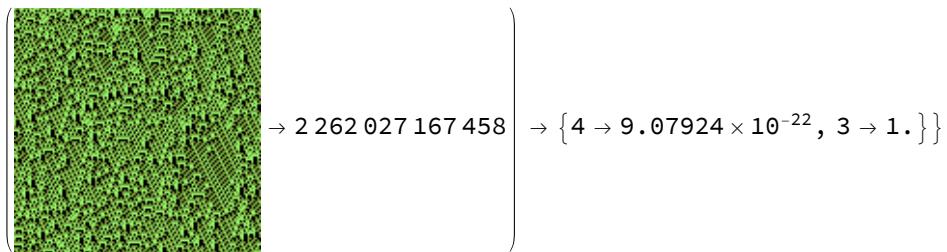
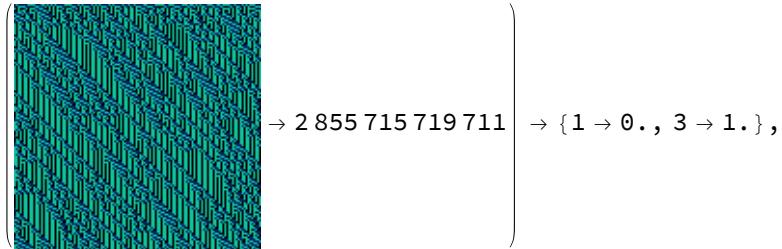
$\left\{ \begin{array}{c} \text{(A 10x10 grid of black dots on a white background with diagonal stripes of red dots)} \\ \rightarrow 4\ 969\ 181\ 144\ 217 \end{array} \right\} \rightarrow \{2 \rightarrow 0.0805151, 4 \rightarrow 0.919485\},$

$\left\{ \begin{array}{c} \text{(A 10x10 grid of black dots on a white background with diagonal stripes of purple dots)} \\ \rightarrow 7\ 038\ 367\ 528\ 689 \end{array} \right\} \rightarrow \{3 \rightarrow 8.64922 \times 10^{-26}, 4 \rightarrow 1.\},$

$\left\{ \begin{array}{c} \text{(A 10x10 grid of black dots on a white background with vertical stripes of red dots)} \\ \rightarrow 432\ 813\ 174\ 387 \end{array} \right\} \rightarrow \{4 \rightarrow 1.4013 \times 10^{-45}, 2 \rightarrow 1.\},$

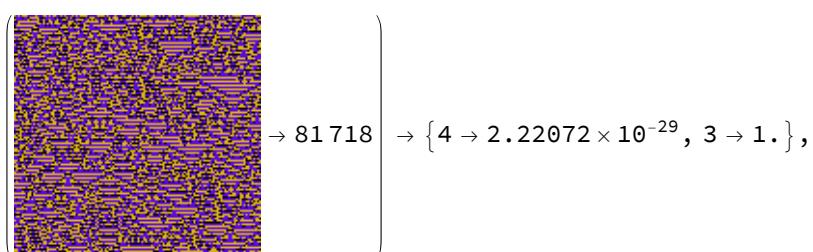
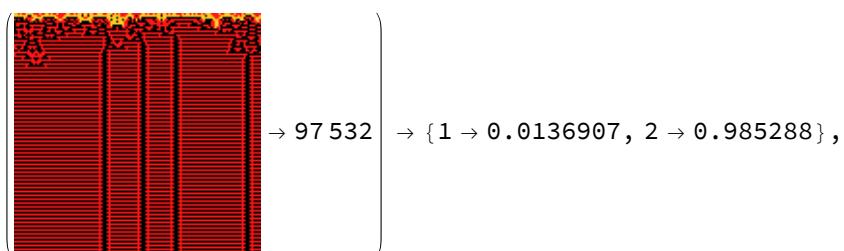
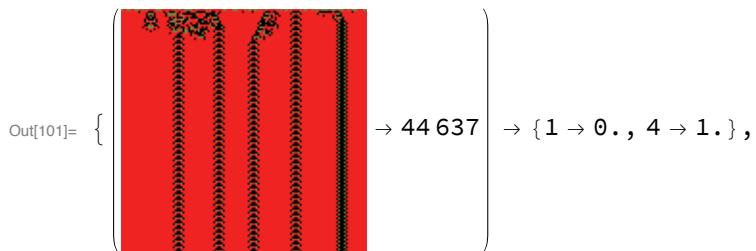
$\left\{ \begin{array}{c} \text{(A 10x10 grid of black dots on a white background with a complex pattern of green dots)} \\ \rightarrow 2\ 083\ 475\ 355\ 420 \end{array} \right\} \rightarrow \{4 \rightarrow 1.38076 \times 10^{-8}, 3 \rightarrow 1.\},$

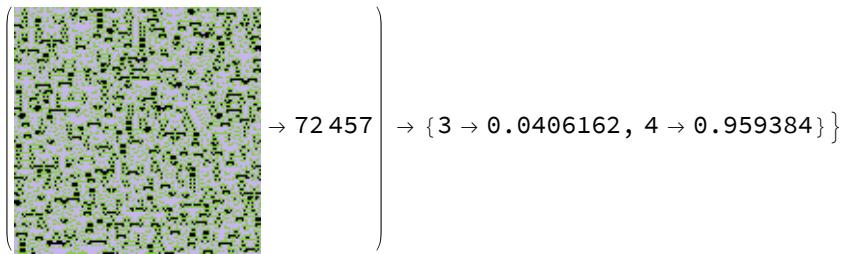
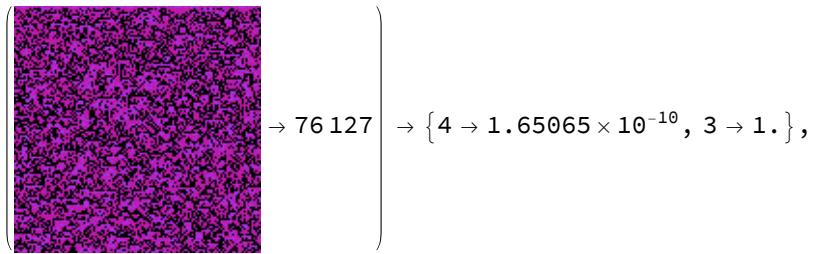
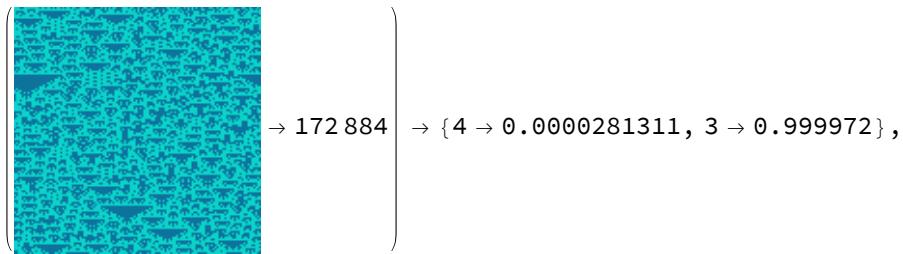
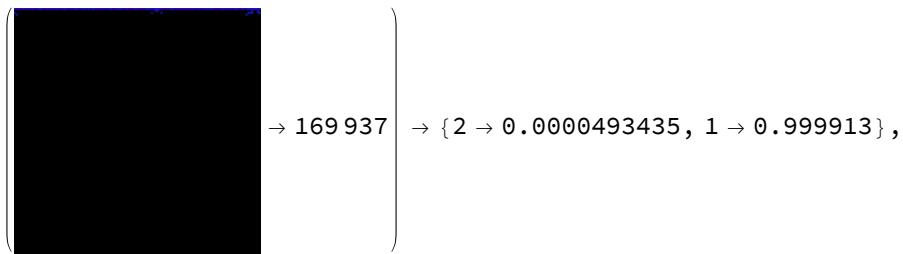
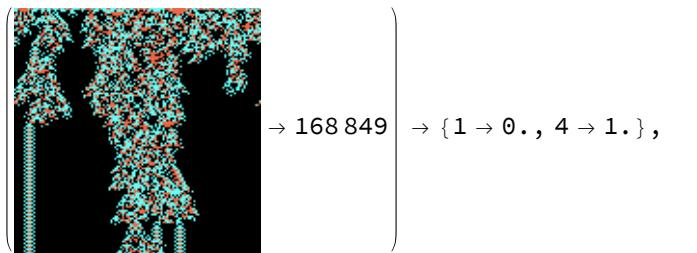
$\left\{ \begin{array}{c} \text{(A 10x10 grid of black dots on a white background with a complex pattern of green dots)} \\ \rightarrow 966\ 244\ 316\ 659 \end{array} \right\} \rightarrow \{4 \rightarrow 8.30269 \times 10^{-33}, 3 \rightarrow 1.\},$



3-colour totalistic, range 2

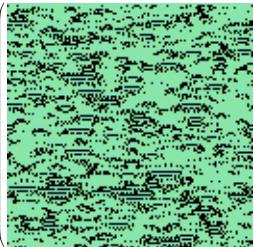
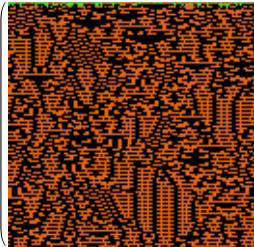
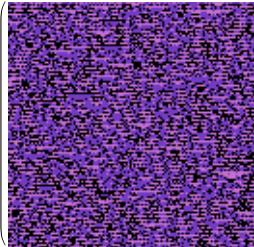
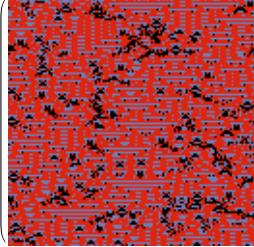
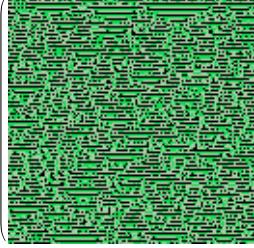
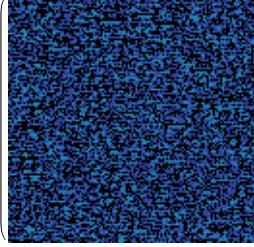
```
In[100]:= test4Data3kr2C19 = datak3r2C[128, 128, 8];
Thread[
  test4Data3kr2C19 → netECA19[Keys@test4Data3kr2C19, {"TopProbabilities", 2}]]
```

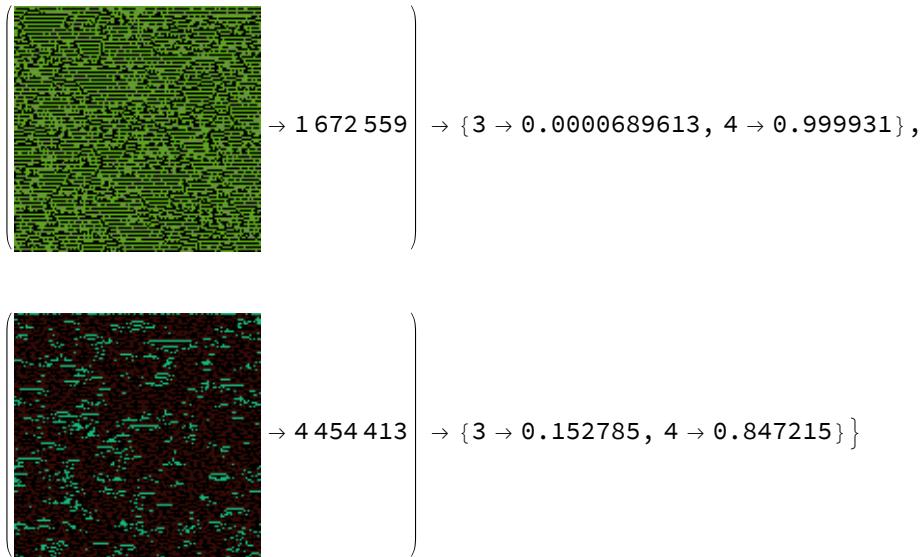




3-colour totalistic, range 3

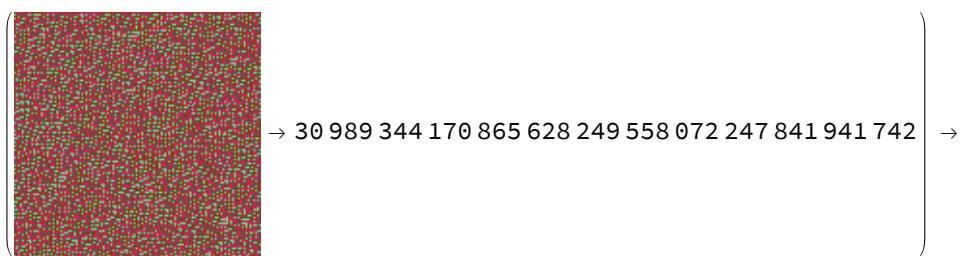
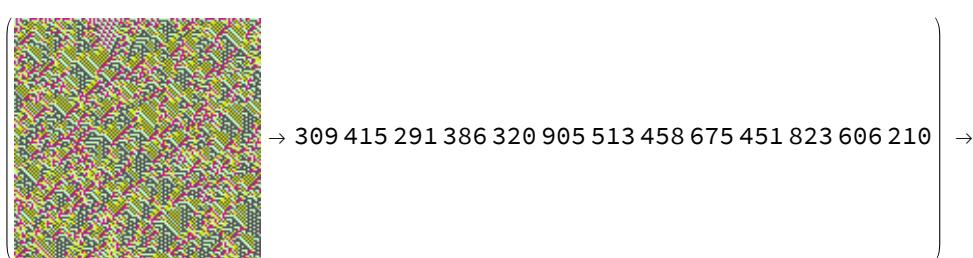
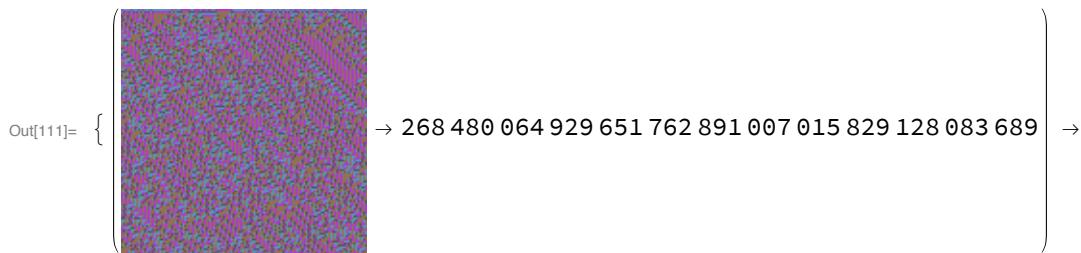
```
In[104]:= test4Data3kr3C19 = datak3r3C[128, 128, 8];
Thread[
test4Data3kr3C19 → netECA19[Keys@test4Data3kr3C19, {"TopProbabilities", 2}]]
```

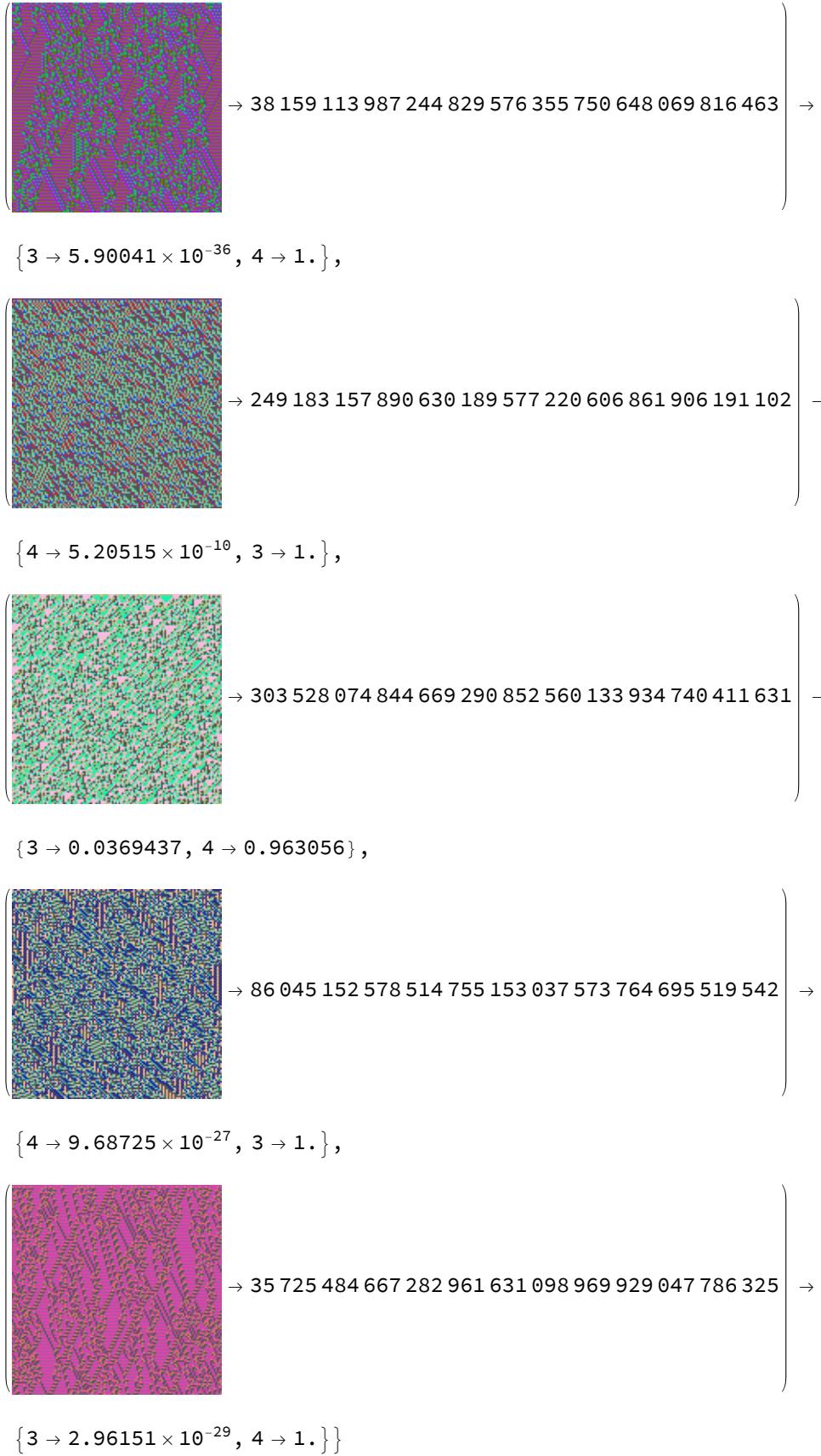
Out[105]=	{		→ 5 332 402	}	→ {1 → 0., 3 → 1.},
			→ 12 215 348	}	→ {3 → 0.0215091, 4 → 0.978491},
			→ 5 882 266	}	→ {4 → 7.74599 × 10⁻¹⁰, 3 → 1.},
			→ 3 262 519	}	→ {1 → 0., 3 → 1.},
			→ 4 981 094	}	→ {4 → 0.000228014, 3 → 0.999772},
			→ 9 082 439	}	→ {4 → 1.88074 × 10⁻¹³, 3 → 1.},



4-colour non-totalistic, range 1

```
In[110]:= test4Data4kr1C19 = datak4r1NT[128, 128, 8];
Thread[
  test4Data4kr1C19 → netECA19[Keys@test4Data4kr1C19, {"TopProbabilities", 2}]]
```





4-colour totalistic, range 2

```
In[112]:= test4Data4kr2C19 = data4r2C[128, 128, 8];
Thread[
  test4Data4kr2C19 \[Function] netECA19[Keys@test4Data4kr2C19, {"TopProbabilities", 2}]]
```

Out[113]= $\left\{ \begin{array}{c} \text{(A 128x128 red noisy image)} \\ \rightarrow 3\ 039\ 279\ 908 \end{array} \right\} \rightarrow \{4 \rightarrow 1.99769 \times 10^{-22}, 3 \rightarrow 1.\},$

Out[113]= $\left\{ \begin{array}{c} \text{(A 128x128 green noisy image)} \\ \rightarrow 1\ 004\ 857\ 722 \end{array} \right\} \rightarrow \{4 \rightarrow 2.69276 \times 10^{-14}, 3 \rightarrow 1.\},$

Out[113]= $\left\{ \begin{array}{c} \text{(A 128x128 yellow noisy image)} \\ \rightarrow 1\ 136\ 086\ 050 \end{array} \right\} \rightarrow \{4 \rightarrow 5.1036 \times 10^{-14}, 3 \rightarrow 1.\},$

Out[113]= $\left\{ \begin{array}{c} \text{(A 128x128 black and white triangular pattern)} \\ \rightarrow 3\ 492\ 358\ 882 \end{array} \right\} \rightarrow \{3 \rightarrow 1.56014 \times 10^{-7}, 4 \rightarrow 1.\},$

Out[113]= $\left\{ \begin{array}{c} \text{(A 128x128 blue noisy image)} \\ \rightarrow 1\ 069\ 866\ 717 \end{array} \right\} \rightarrow \{4 \rightarrow 8.91689 \times 10^{-21}, 3 \rightarrow 1.\},$

$$\left(\begin{array}{c} \text{[A 128x128 pixel grayscale image showing a noisy pattern]} \\ \rightarrow 171\ 122\ 738 \end{array} \right) \rightarrow \{4 \rightarrow 2.21848 \times 10^{-11}, 3 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 128x128 pixel grayscale image showing a noisy pattern]} \\ \rightarrow 3\ 452\ 577\ 709 \end{array} \right) \rightarrow \{4 \rightarrow 1.17042 \times 10^{-13}, 3 \rightarrow 1.\},$$

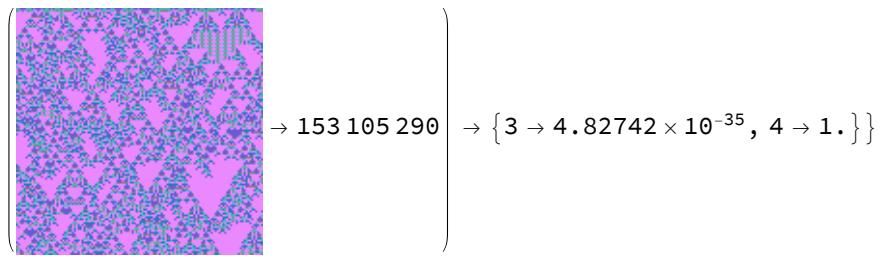
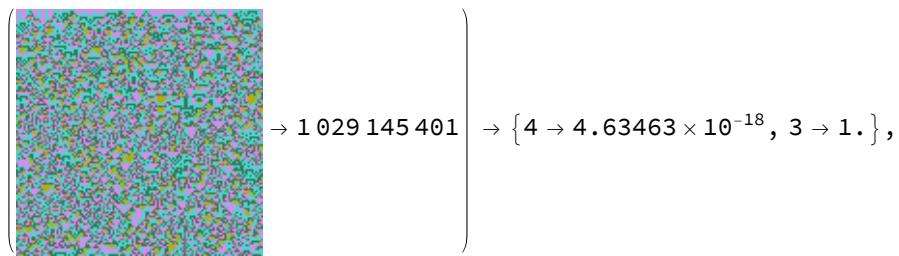
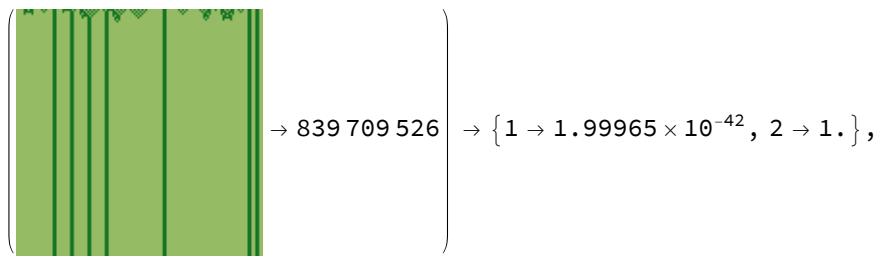
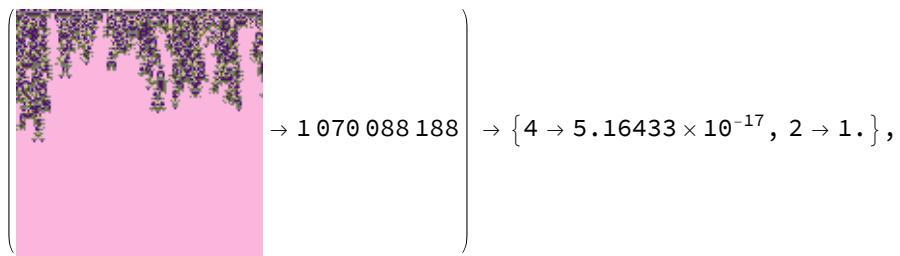
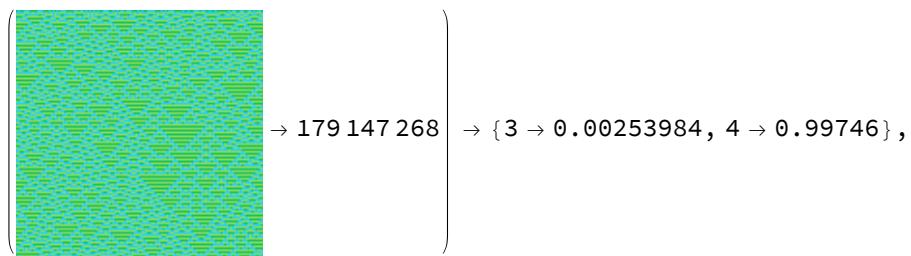
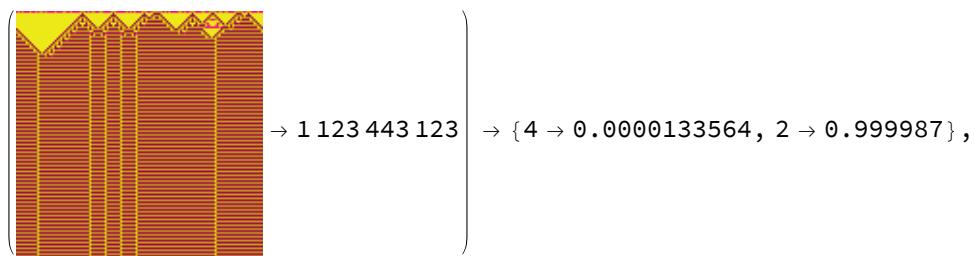
$$\left(\begin{array}{c} \text{[A 128x128 pixel grayscale image showing a noisy pattern]} \\ \rightarrow 701\ 805\ 990 \end{array} \right) \rightarrow \{4 \rightarrow 2.21188 \times 10^{-16}, 3 \rightarrow 1.\}$$

5-colour totalistic, range 1

```
In[116]:= test4Data5kr1C19 = data5T2C[8, 128, 128];
Thread[
  test4Data5kr1C19 \[Function] netECA19[Keys@test4Data5kr1C19, {"TopProbabilities", 2}]]
```

$$\text{Out[117]= } \left\{ \begin{array}{c} \text{[A 128x128 pixel grayscale image showing a pattern with vertical pink stripes]} \\ \rightarrow 1\ 207\ 540\ 399 \end{array} \right\} \rightarrow \{4 \rightarrow 2.97016 \times 10^{-21}, 2 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 128x128 pixel grayscale image showing a pattern with vertical pink stripes]} \\ \rightarrow 1\ 142\ 383\ 118 \end{array} \right) \rightarrow \{1 \rightarrow 0., 4 \rightarrow 1.\},$$



6-colour totalistic, range 1

```
In[124]:= test4Data6kr1C19 = data6TC[8, 128, 128];
Thread[
  test4Data6kr1C19 → netECA19[Keys@test4Data6kr1C19, {"TopProbabilities", 2}]]
```

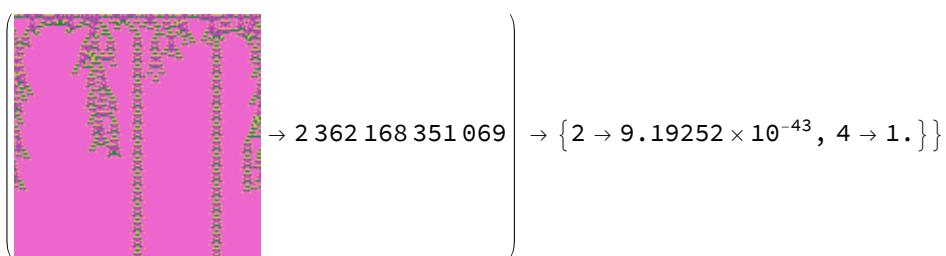
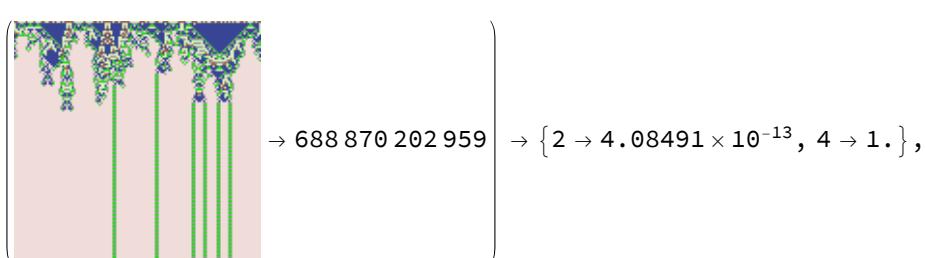
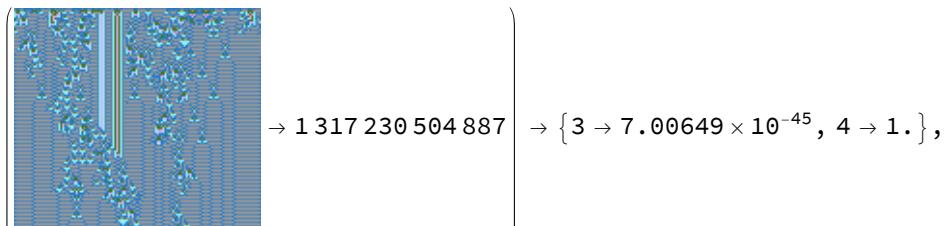
$$\text{Out}[125]= \left\{ \begin{array}{c} \text{[A 128x128 grid of green, blue, and cyan pixels]} \\ \rightarrow 521\ 151\ 757\ 166 \end{array} \right\} \rightarrow \{4 \rightarrow 4.2538 \times 10^{-27}, 3 \rightarrow 1.\},$$

$$\left\{ \begin{array}{c} \text{[A 128x128 grid of green, blue, and cyan pixels]} \\ \rightarrow 1\ 148\ 948\ 615\ 051 \end{array} \right\} \rightarrow \{3 \rightarrow 1.05684 \times 10^{-11}, 4 \rightarrow 1.\},$$

$$\left\{ \begin{array}{c} \text{[A 128x128 grid of green, blue, and cyan pixels]} \\ \rightarrow 1\ 701\ 138\ 861\ 521 \end{array} \right\} \rightarrow \{3 \rightarrow 0.344279, 4 \rightarrow 0.655721\},$$

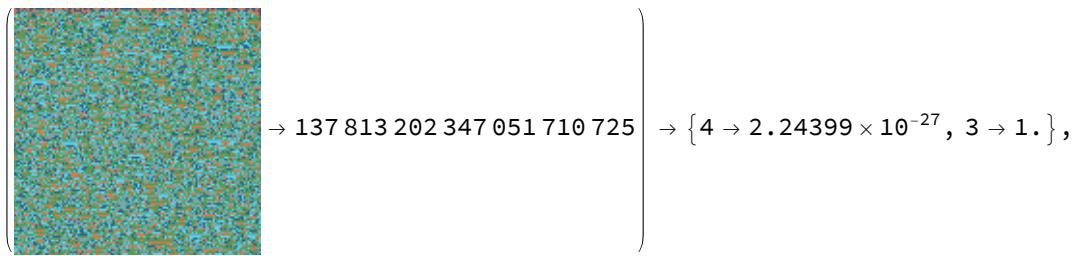
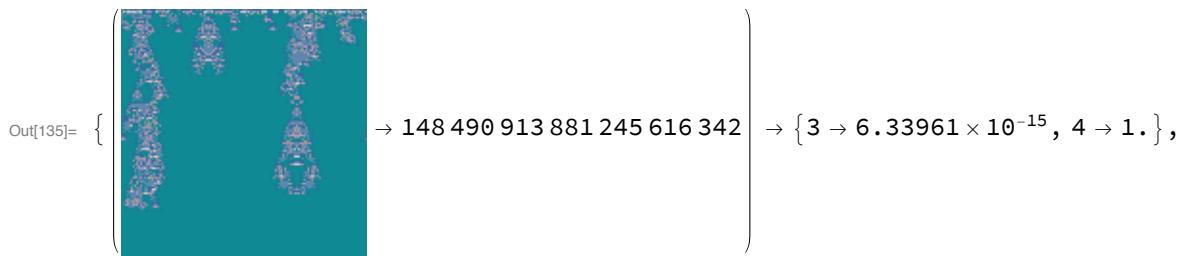
$$\left\{ \begin{array}{c} \text{[A 128x128 grid of red pixels]} \\ \rightarrow 772\ 044\ 852\ 372 \end{array} \right\} \rightarrow \{4 \rightarrow 3.00861 \times 10^{-22}, 2 \rightarrow 1.\},$$

$$\left\{ \begin{array}{c} \text{[A 128x128 grid of red, green, and blue pixels]} \\ \rightarrow 401\ 641\ 356\ 701 \end{array} \right\} \rightarrow \{4 \rightarrow 1.64612 \times 10^{-16}, 3 \rightarrow 1.\},$$



6-colour totalistic, range 2

```
In[134]:= test4Data6kr2C19 = data6T2C[8, 128, 128];
Thread[
  test4Data6kr2C19 → netECA19[Keys@test4Data6kr2C19, {"TopProbabilities", 2}]]
```



$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 145\ 612\ 570\ 579\ 789\ 266\ 485 \end{array} \right) \rightarrow \{4 \rightarrow 1.52405 \times 10^{-9}, 3 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 57\ 362\ 919\ 586\ 594\ 306\ 710 \end{array} \right) \rightarrow \{4 \rightarrow 0.031388, 3 \rightarrow 0.968612\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 24\ 770\ 952\ 214\ 224\ 040\ 296 \end{array} \right) \rightarrow \{4 \rightarrow 5.16516 \times 10^{-16}, 3 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 143\ 600\ 862\ 017\ 240\ 236\ 453 \end{array} \right) \rightarrow \{4 \rightarrow 1.30214 \times 10^{-22}, 3 \rightarrow 1.\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 160\ 410\ 817\ 633\ 450\ 677\ 074 \end{array} \right) \rightarrow \{4 \rightarrow 0.000231853, 3 \rightarrow 0.999768\},$$

$$\left(\begin{array}{c} \text{[A 2x2 grid of random colors]} \\ \rightarrow 99\ 035\ 735\ 849\ 117\ 353\ 433 \end{array} \right) \rightarrow \{4 \rightarrow 7.72208 \times 10^{-20}, 3 \rightarrow 1.\}$$

7-colour totalistic, range 1

```
In[140]:= test4Data7kr1C19 = data7TC[8, 128, 128];
Thread[
  test4Data7kr1C19 → netECA19[Keys@test4Data7kr1C19, {"TopProbabilities", 2}]]
```

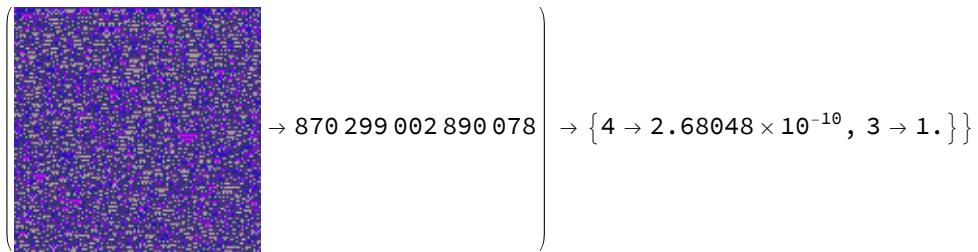
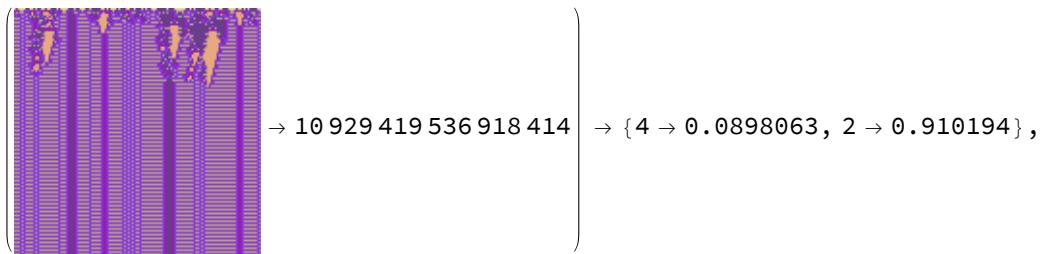
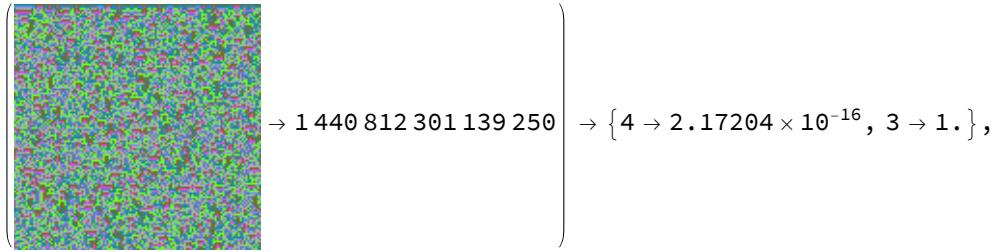
Out[141]= $\left\{ \begin{array}{c} \text{A 128x128 grid of 7 colors (blue, green, red, yellow, cyan, magenta, black)} \\ \rightarrow 7905962486151833 \end{array} \right\} \rightarrow \{4 \rightarrow 0.000554173, 3 \rightarrow 0.999446\},$

$\left\{ \begin{array}{c} \text{A 128x128 grid of 7 colors (blue, green, red, yellow, cyan, magenta, black)} \\ \rightarrow 5986825348569542 \end{array} \right\} \rightarrow \{4 \rightarrow 0.0000562114, 3 \rightarrow 0.999944\},$

$\left\{ \begin{array}{c} \text{A 128x128 grid of 7 colors (blue, green, red, yellow, cyan, magenta, black)} \\ \rightarrow 5160779372988604 \end{array} \right\} \rightarrow \{3 \rightarrow 1.30743 \times 10^{-8}, 4 \rightarrow 1.\},$

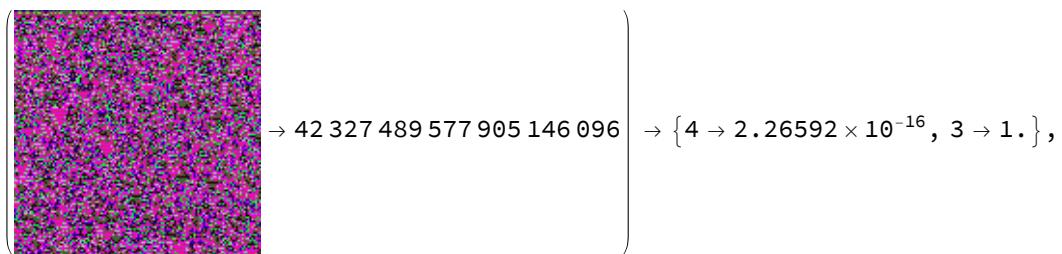
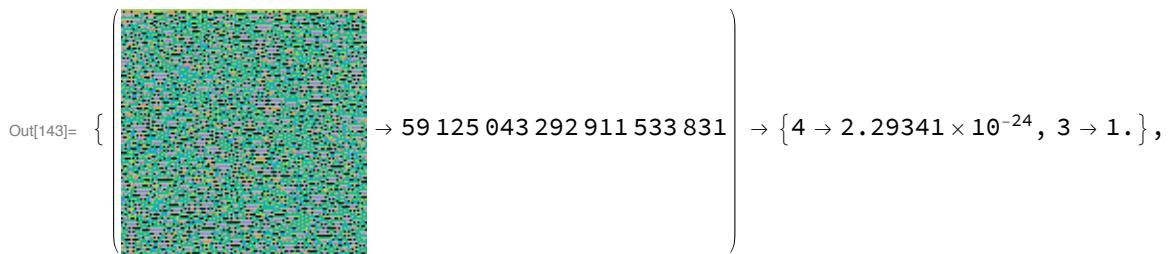
$\left\{ \begin{array}{c} \text{A 128x128 grid of 7 colors (blue, green, red, yellow, cyan, magenta, black)} \\ \rightarrow 2668104076298035 \end{array} \right\} \rightarrow \{4 \rightarrow 3.94844 \times 10^{-18}, 3 \rightarrow 1.\},$

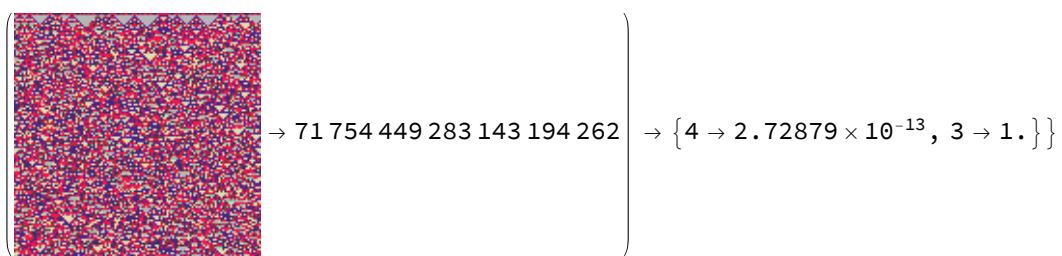
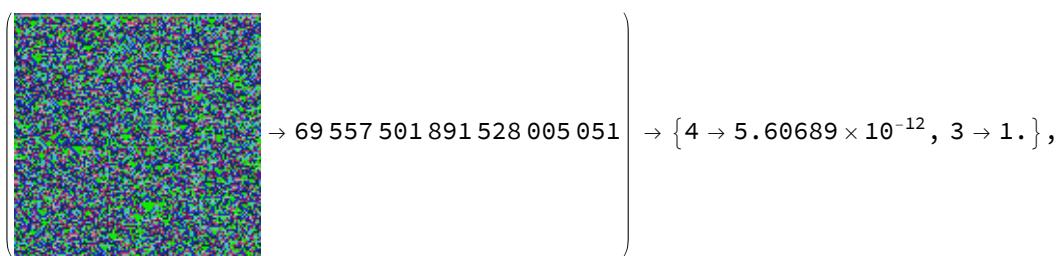
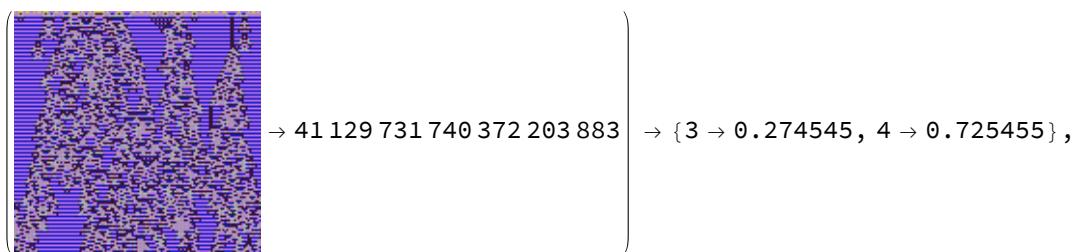
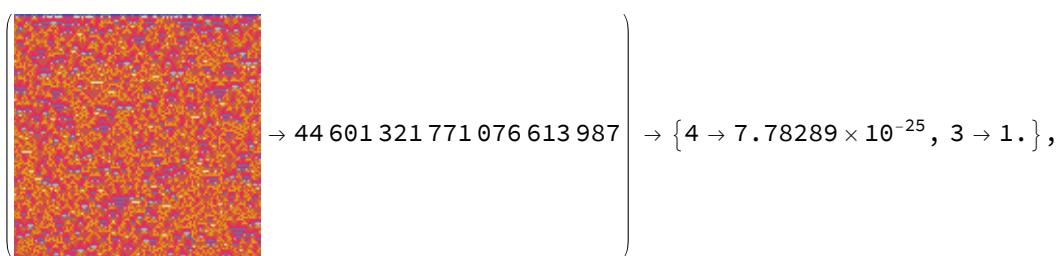
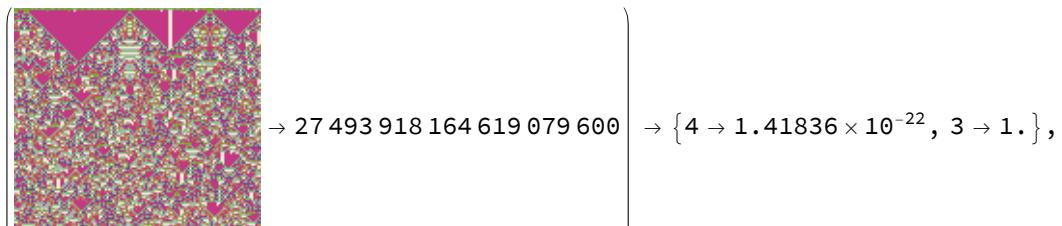
$\left\{ \begin{array}{c} \text{A 128x128 grid of 7 colors (blue, green, red, yellow, cyan, magenta, black)} \\ \rightarrow 3691759700407743 \end{array} \right\} \rightarrow \{4 \rightarrow 4.45377 \times 10^{-16}, 3 \rightarrow 1.\},$



8-colour totalistic, range 1

```
In[142]:= test4Data8kr1C19 = data8TC[8, 128, 128];
Thread[
  test4Data8kr1C19 → netECA19[Keys@test4Data8kr1C19, {"TopProbabilities", 2}]]
```





```
In[146]:= test4Data8kr1C19 = data8TC[8, 128, 128];
Thread[
  test4Data8kr1C19 → netECA19[Keys@test4Data8kr1C19, {"TopProbabilities", 2}]]
```

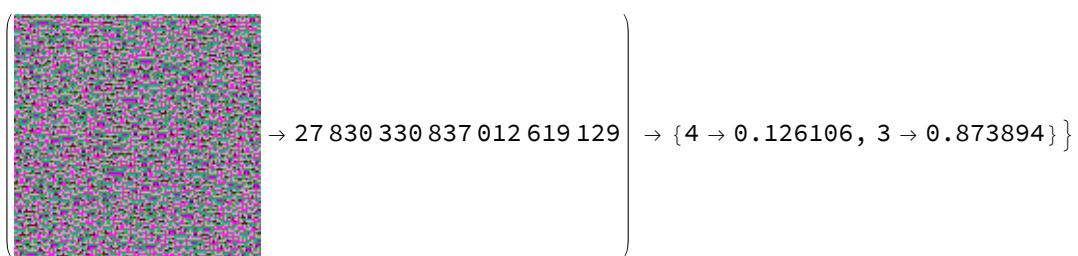
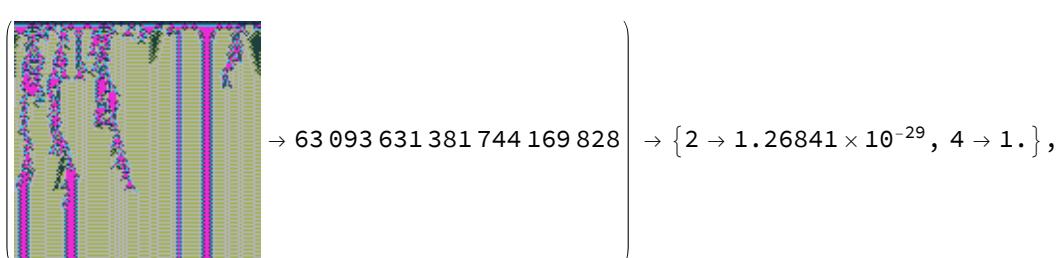
Out[147]= $\left\{ \begin{array}{c} \text{[A 128x128 pixel grayscale image showing a noisy pattern]} \\ \rightarrow 30\ 958\ 781\ 818\ 328\ 214\ 442 \end{array} \right\} \rightarrow \left\{ 4 \rightarrow 4.62524 \times 10^{-15}, 3 \rightarrow 1. \right\},$

$\left\{ \begin{array}{c} \text{[A 128x128 pixel grayscale image showing a noisy pattern]} \\ \rightarrow 61\ 018\ 914\ 870\ 782\ 867\ 384 \end{array} \right\} \rightarrow \left\{ 4 \rightarrow 1.13687 \times 10^{-12}, 3 \rightarrow 1. \right\},$

$\left\{ \begin{array}{c} \text{[A 128x128 pixel grayscale image showing a noisy pattern]} \\ \rightarrow 20\ 705\ 257\ 985\ 378\ 094\ 677 \end{array} \right\} \rightarrow \left\{ 4 \rightarrow 1.82975 \times 10^{-19}, 3 \rightarrow 1. \right\},$

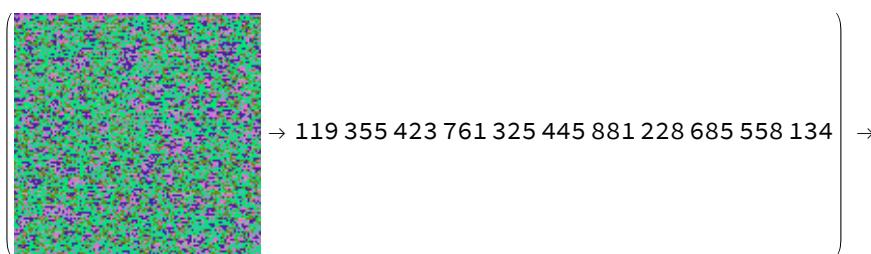
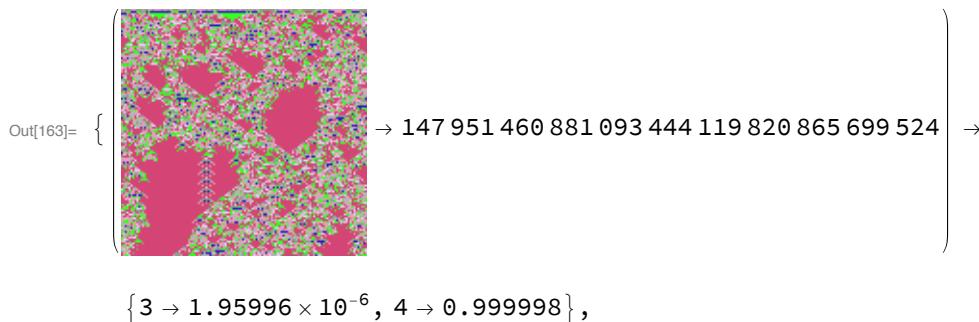
$\left\{ \begin{array}{c} \text{[A 128x128 pixel grayscale image showing a noisy pattern]} \\ \rightarrow 43\ 941\ 374\ 463\ 684\ 638\ 030 \end{array} \right\} \rightarrow \left\{ 4 \rightarrow 1.04552 \times 10^{-6}, 3 \rightarrow 0.999999 \right\},$

$\left\{ \begin{array}{c} \text{[A 128x128 pixel grayscale image showing a noisy pattern]} \\ \rightarrow 3\ 024\ 227\ 929\ 898\ 264\ 848 \end{array} \right\} \rightarrow \left\{ 4 \rightarrow 1.85219 \times 10^{-8}, 3 \rightarrow 1. \right\},$



8-colour totalistic, range 2

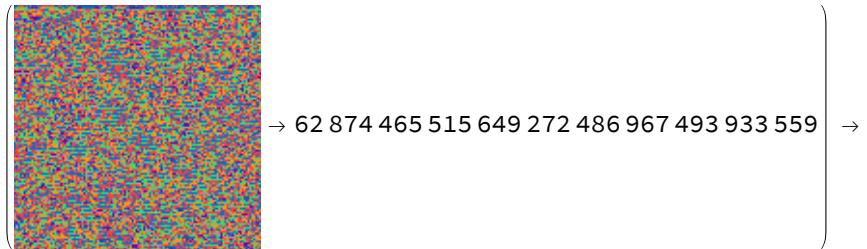
```
In[162]:= test4Data8kr2C19 = data8T2C[8, 128, 128];
Thread[
  test4Data8kr2C19 \[Function] netECA19[Keys@test4Data8kr2C19, {"TopProbabilities", 2}]]
```



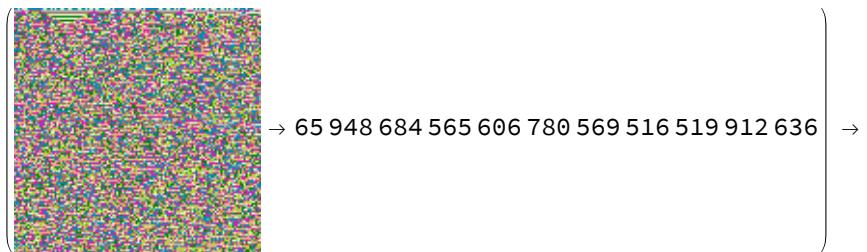
{4 → 0.060776, 3 → 0.939224},



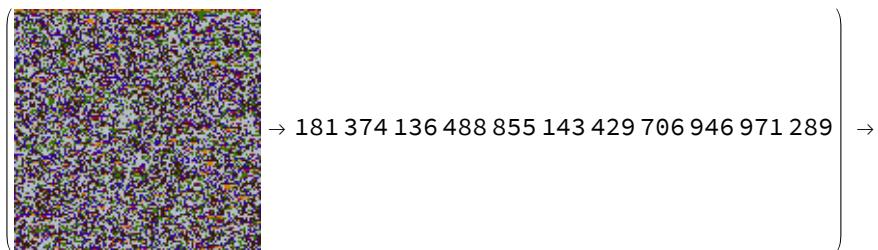
$\{4 \rightarrow 2.91468 \times 10^{-9}, 3 \rightarrow 1.\},$



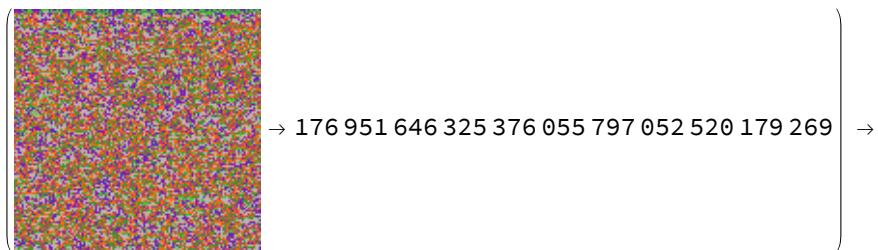
$\{4 \rightarrow 5.81908 \times 10^{-7}, 3 \rightarrow 0.999999\},$



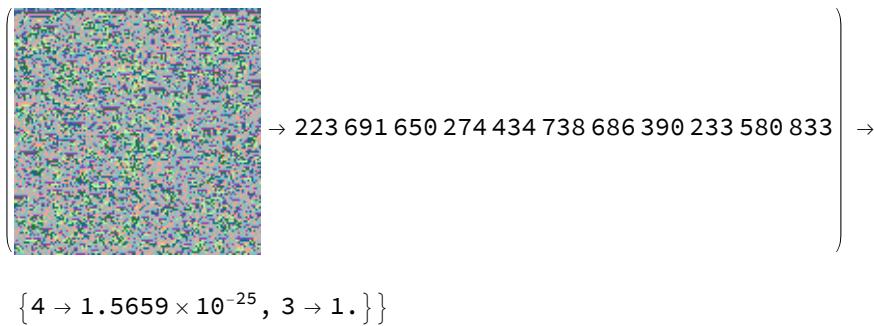
$\{4 \rightarrow 0.0000545016, 3 \rightarrow 0.999946\},$



$\{4 \rightarrow 2.66552 \times 10^{-19}, 3 \rightarrow 1.\},$

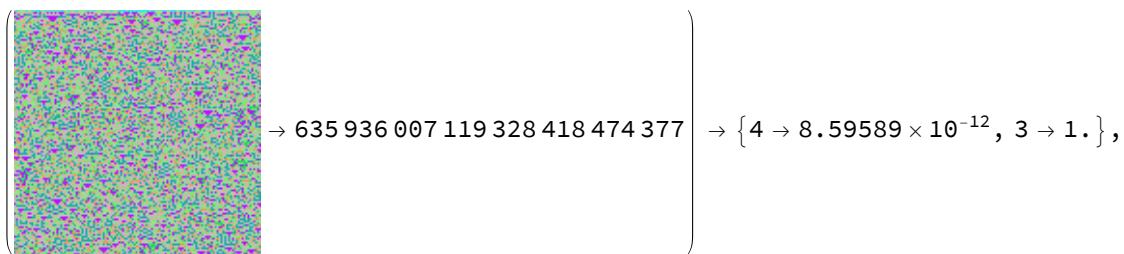
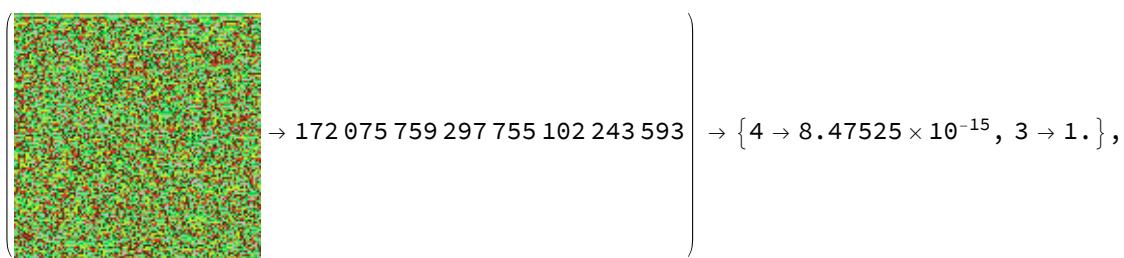
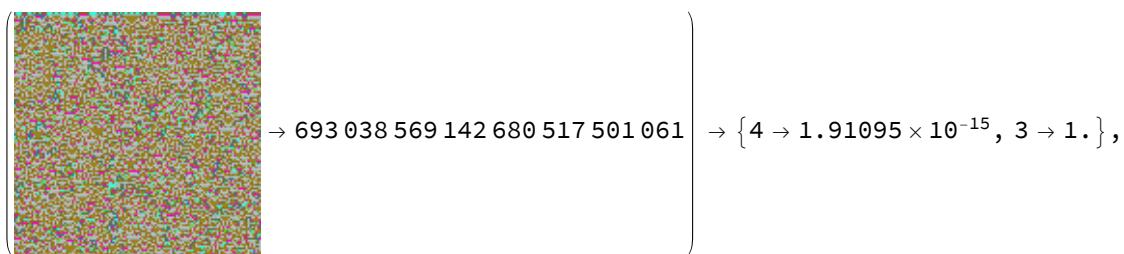
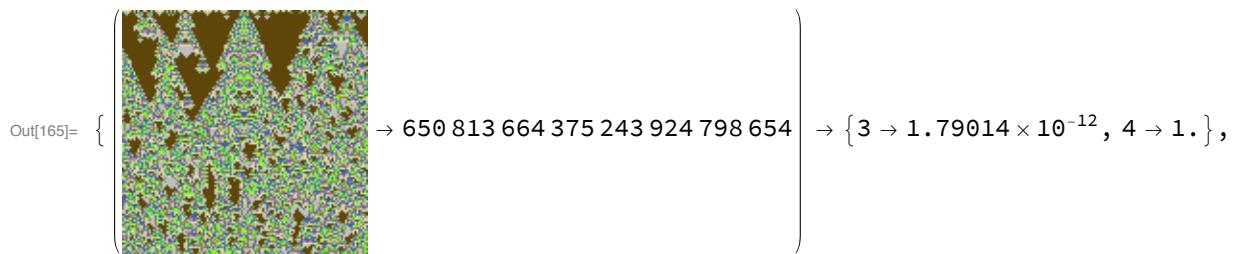


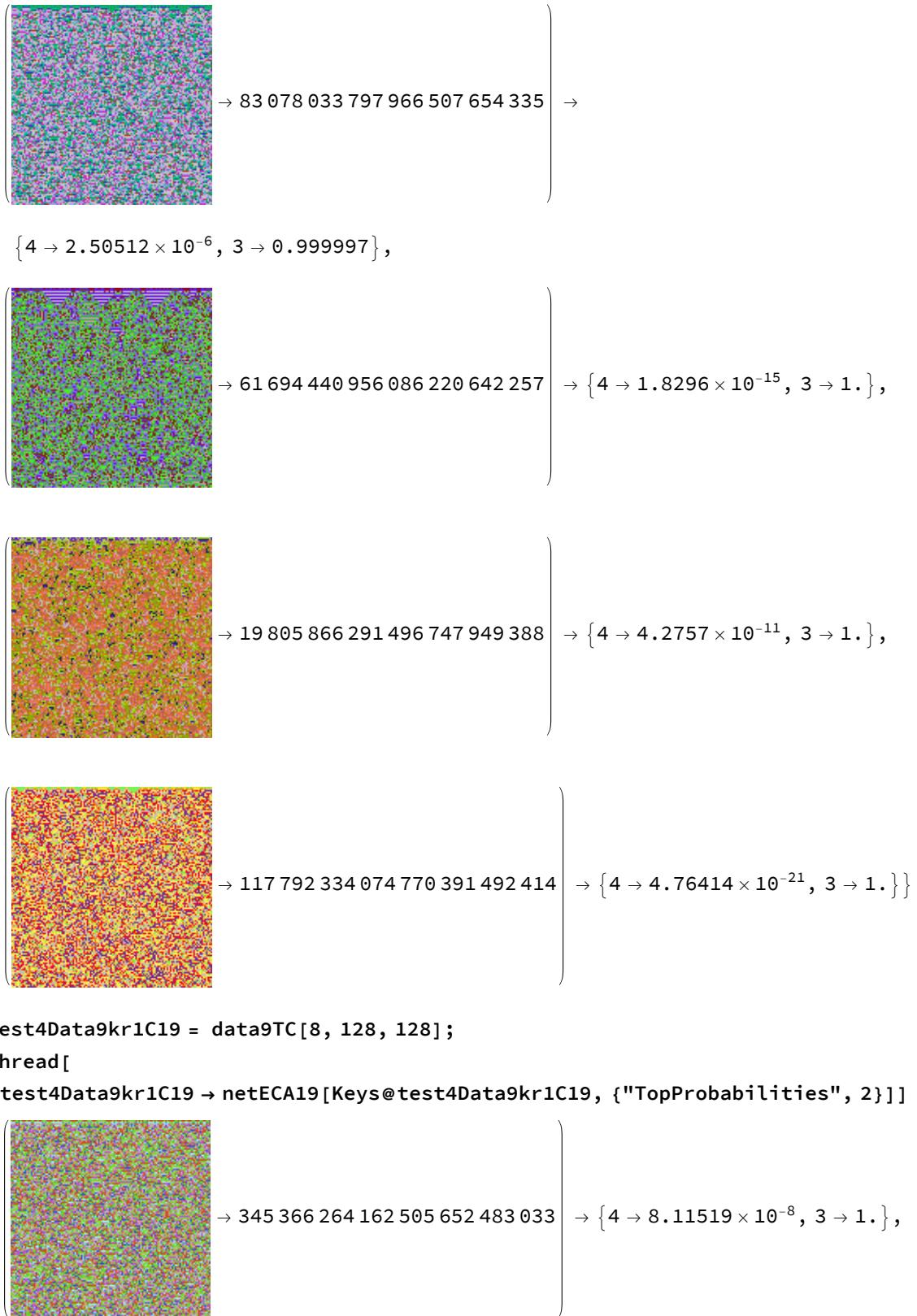
$\{4 \rightarrow 1.80483 \times 10^{-11}, 3 \rightarrow 1.\},$

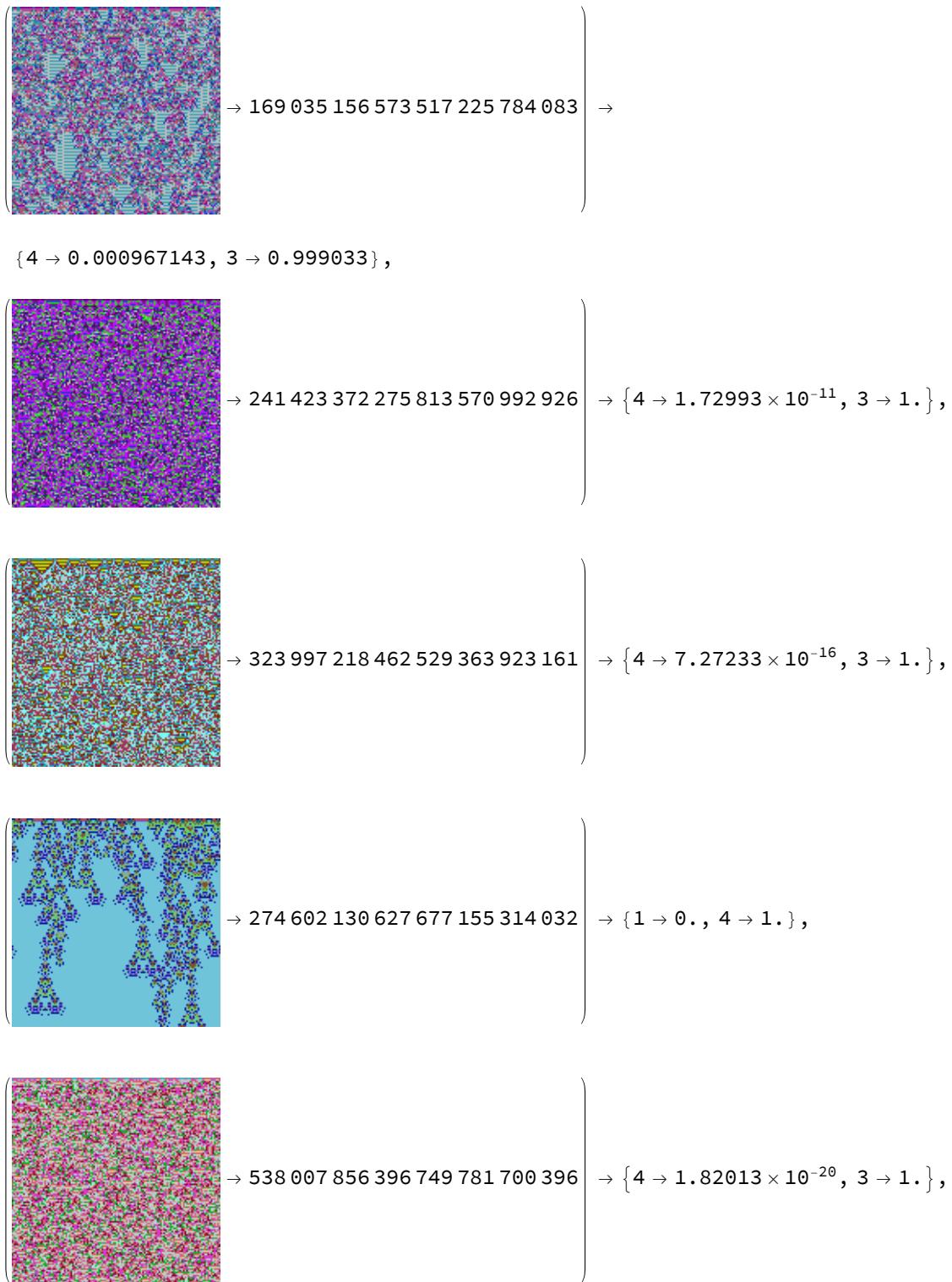


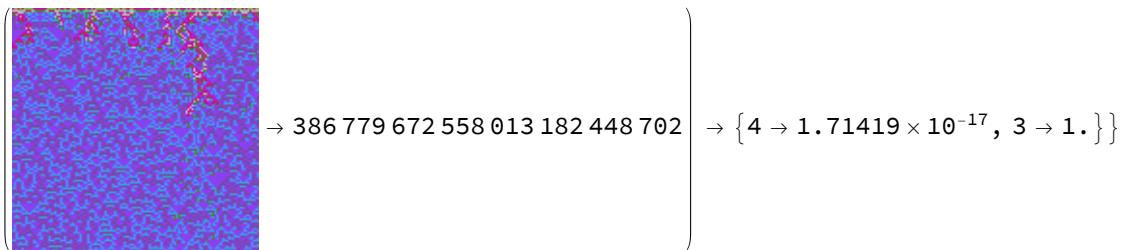
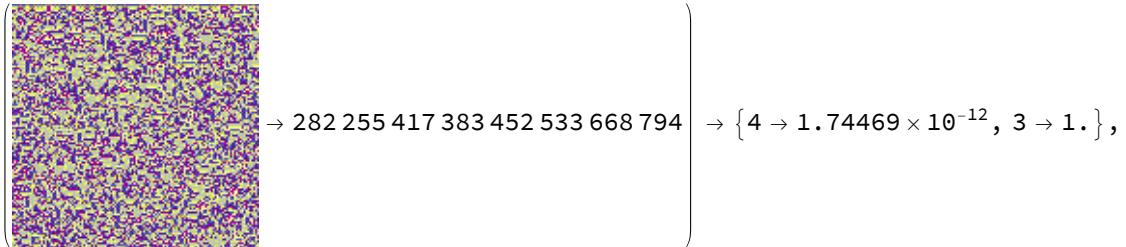
9-colour totalistic, range 1

```
In[164]:= test4Data9kr1C19 = data9TC[8, 128, 128];
Thread[
  test4Data9kr1C19 &gt; netECA19[Keys@test4Data9kr1C19, {"TopProbabilities", 2}]]
```

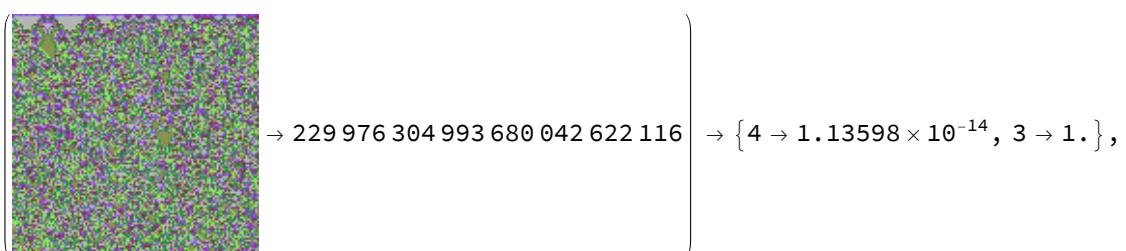
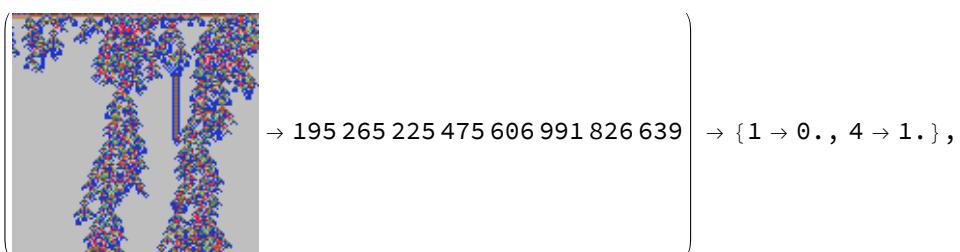
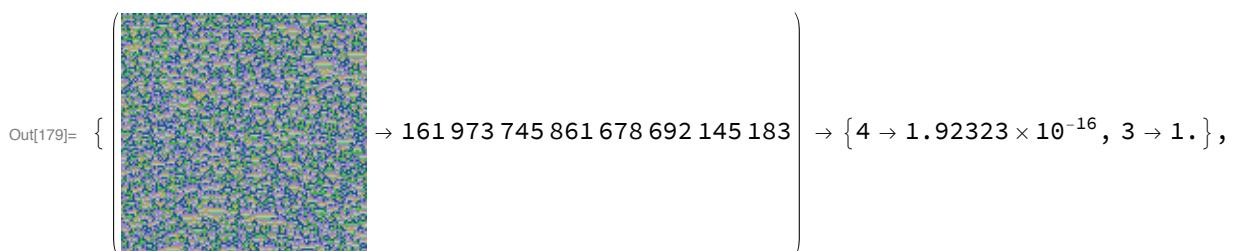








```
In[178]:= test4Data9kr1C19 = data9TC[8, 128, 128];
Thread[
test4Data9kr1C19 → netECA19[Keys@test4Data9kr1C19, {"TopProbabilities", 2}]]
```



$$\left(\begin{array}{c} \text{A 4x4 grid of green and yellow dots} \\ \rightarrow 45\ 546\ 192\ 831\ 416\ 331\ 168\ 463 \end{array} \right) \rightarrow \{ 4 \rightarrow 1.78072 \times 10^{-8}, 3 \rightarrow 1. \},$$

$$\left(\begin{array}{c} \text{A 4x4 grid of blue and purple dots} \\ \rightarrow 271\ 317\ 841\ 721\ 163\ 552\ 341\ 788 \end{array} \right) \rightarrow \{ 4 \rightarrow 5.28559 \times 10^{-9}, 3 \rightarrow 1. \},$$

$$\left(\begin{array}{c} \text{A 4x4 grid of green, yellow, and orange dots} \\ \rightarrow 386\ 796\ 588\ 960\ 959\ 381\ 307\ 104 \end{array} \right) \rightarrow \{ 4 \rightarrow 0.00324702, 3 \rightarrow 0.996753 \},$$

$$\left(\begin{array}{c} \text{A 4x4 grid of blue and purple dots} \\ \rightarrow 13\ 757\ 000\ 133\ 048\ 760\ 792\ 605 \end{array} \right) \rightarrow \{ 4 \rightarrow 0.00048392, 3 \rightarrow 0.999516 \},$$

$$\left(\begin{array}{c} \text{A 4x4 grid of red, green, blue, and yellow dots} \\ \rightarrow 148\ 054\ 017\ 088\ 260\ 077\ 744\ 039 \end{array} \right) \rightarrow \{ 4 \rightarrow 9.52466 \times 10^{-14}, 3 \rightarrow 1. \}$$