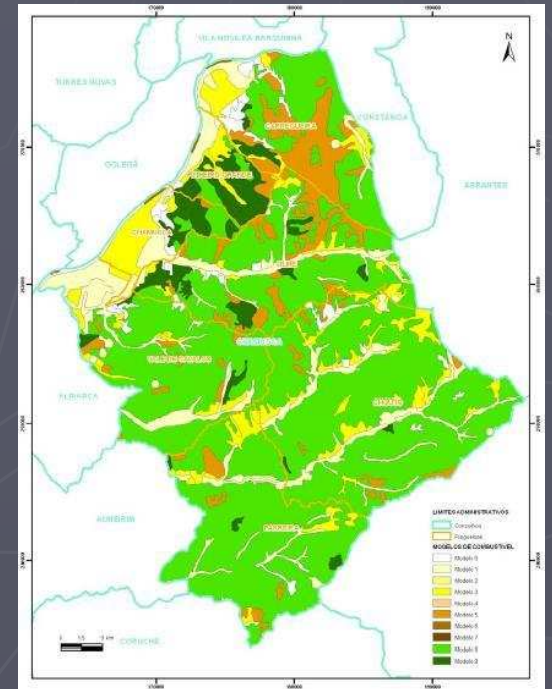
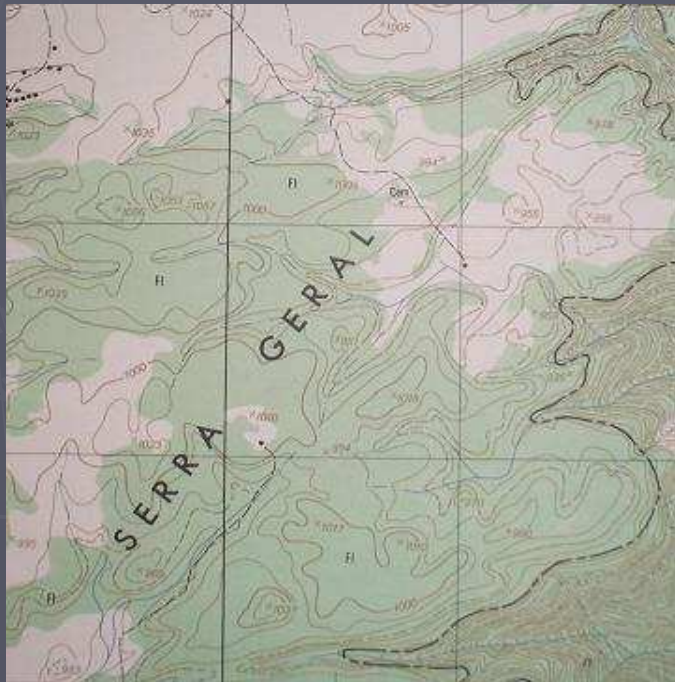


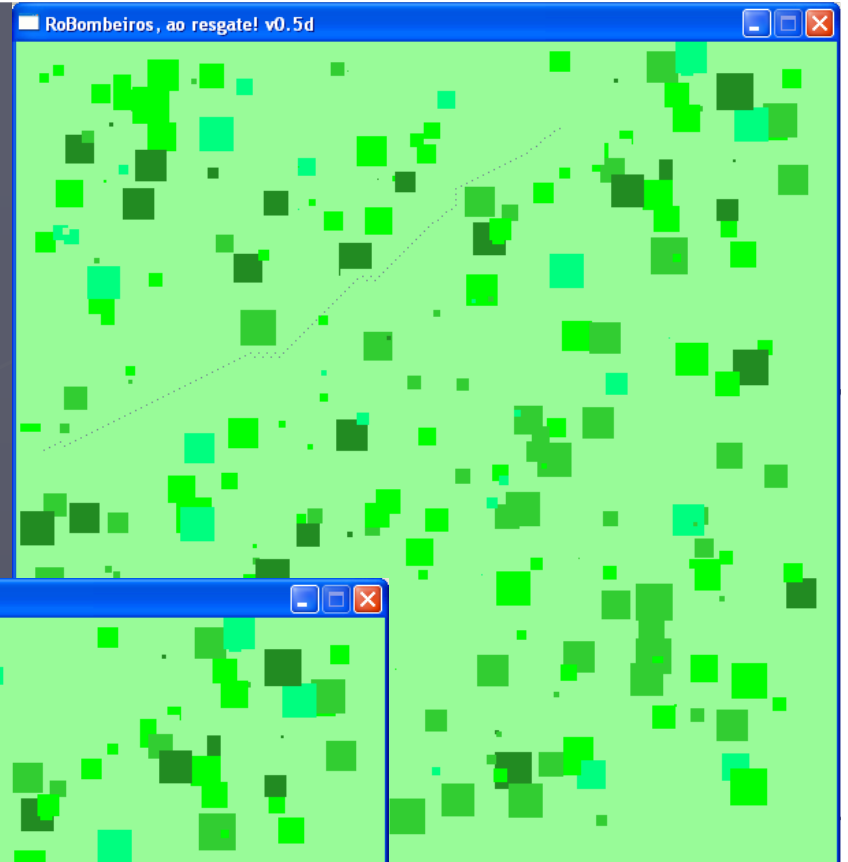
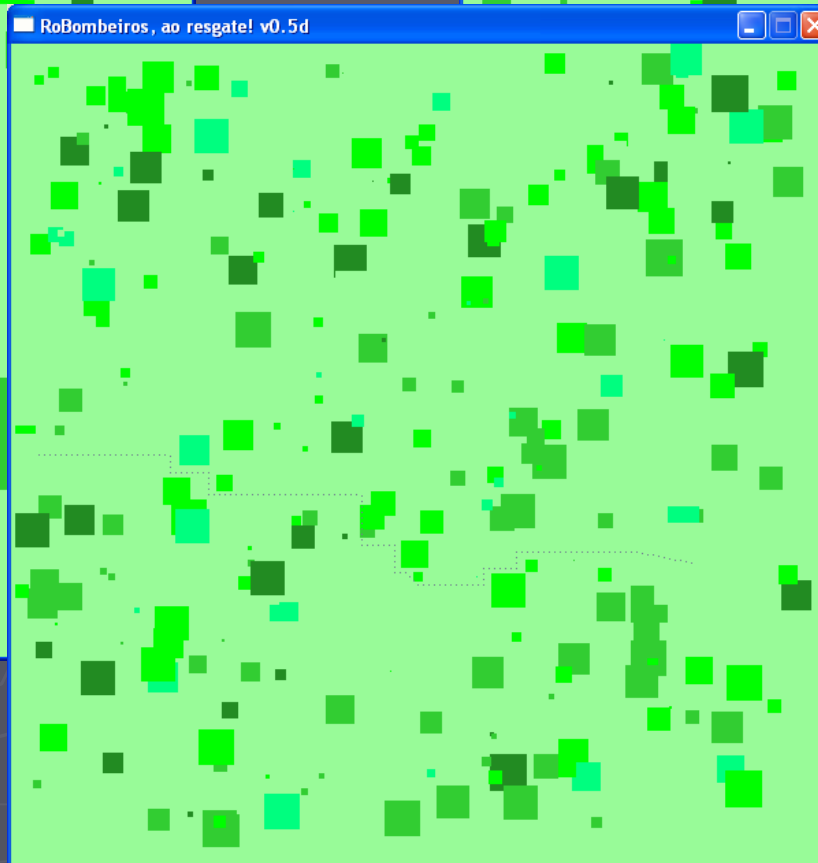
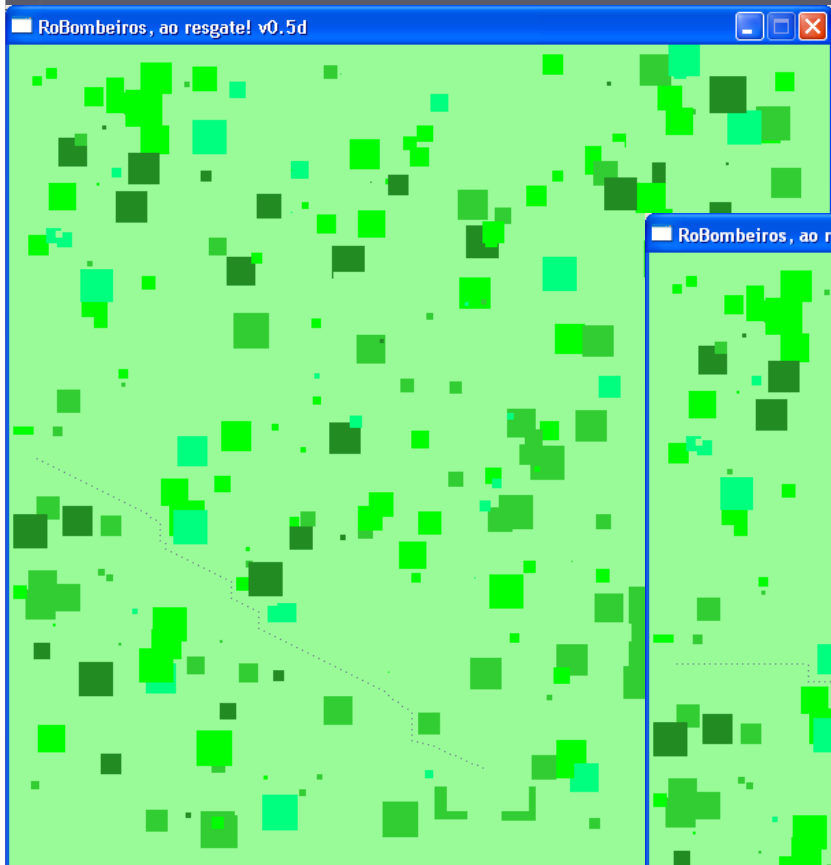
Usando RNA em desvios de trajetórias de veículos baseado em visão de densidade de vegetação



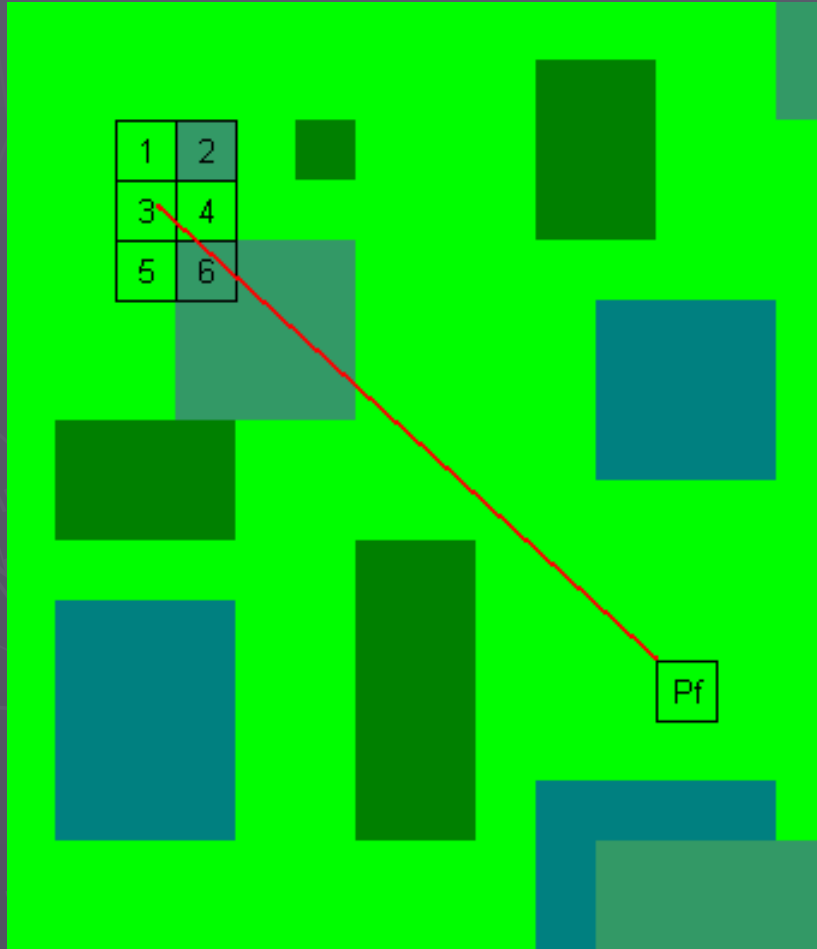
Gustavo Pessin

Programa Interdisciplinar de Pós-Graduação em Computação Aplicada - PIPCA
Universidade do Vale do Rio dos Sinos – Unisinos

Início :: Sistema desenvolvido com regras
Resultado :: Sistema com substituição
das regras por uma RNA



Regras



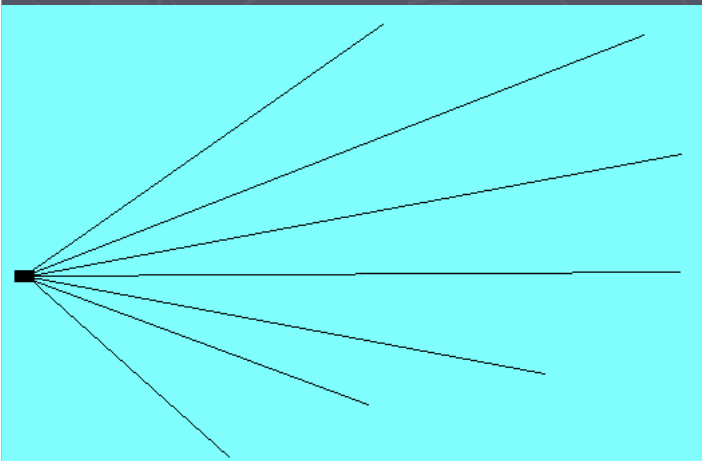
- ▶ Matriz terreno com valores de densidade de vegetação.
- ▶ Matriz de visão [1 2 3 4 5 6]
- ▶ Ponto 3 == Minha posição.
- ▶ A cada passo:
 - Calcula ângulo que “gostaria” de ir:
 - ▶ $\text{angulo} = \text{atan}((y_f - y_i) / (x_f - x_i));$
 - Calcula ponto ponto resultante da caminhada neste ângulo:
 - ▶ $x = x + \text{TAM_PASSO} * \cos(\text{angulo});$
 - ▶ $y = y + \text{TAM_PASSO} * \sin(\text{angulo});$
 - Calcula densidades das caixas de visão.
 - Decide trajetória:
 - ▶ Ex:
 - `if (area_de_menor_densidade==0)`
`novo_angulo_grau = -90.0;`

Extração de dados

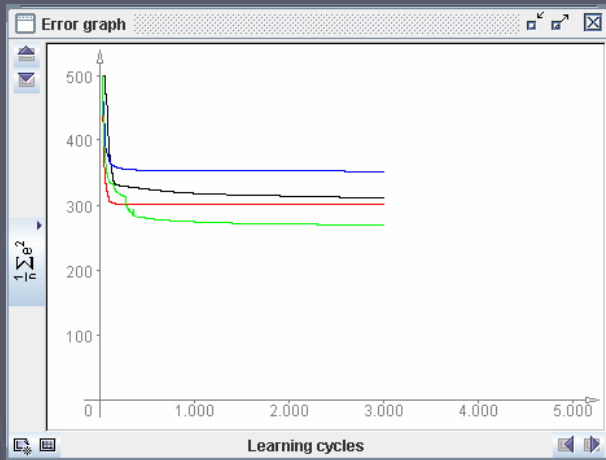
- ▶ Foram rodadas 7 simulações para extração de dados para treinamento da RNA.
 - Total de 870 dados
 - 7 entradas na RNA
 - ▶ 1: Ângulo que quer ir
 - ▶ 2-6: Densidades normalizadas de cada caixa
 - 1 saída
 - ▶ Ângulo que deve ir
 - Dados de treino-teste separados em 70-30
 - ▶ Programa em pascal...

Exemplo de arquivo .pat

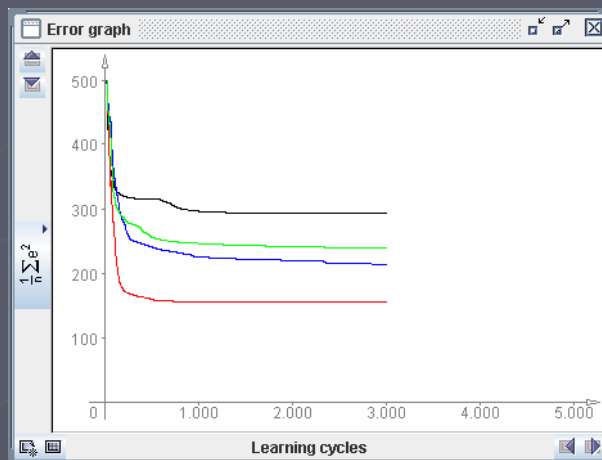
```
34.5 0 0 0 0 0 0
34.5
36.9 0 0 0 0 0 0
36.9
24.9 0 0 0 0 0.75 0.3
90
-32 0 0 0 0 0 0
-32
-38.2 0.36 0 0 0 0 0
45
0 0 0.02 0 0 0 0
0
0 0 0 0.6 0 0.36 0.6
-90
-9.4 0 0 0 0 0 0
-9.4
```



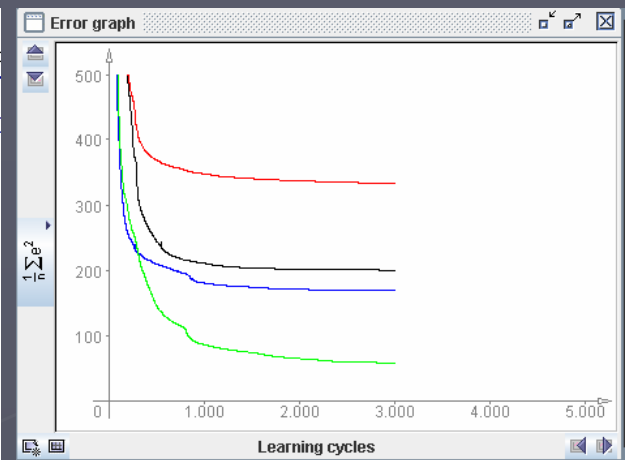
Redes iniciais



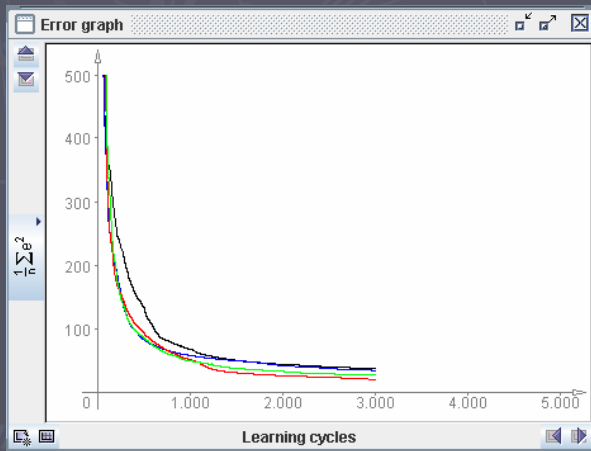
7x4x1



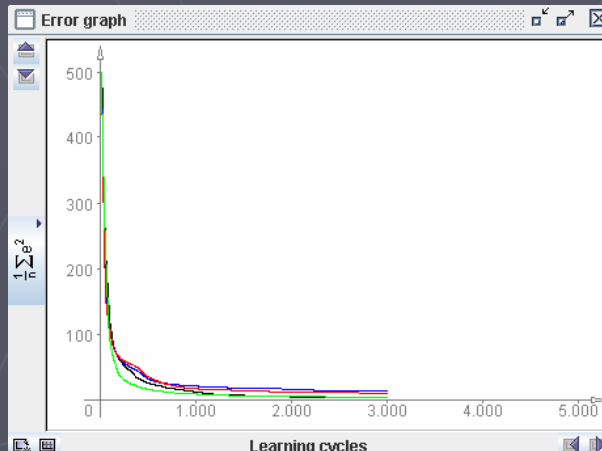
7x7x1



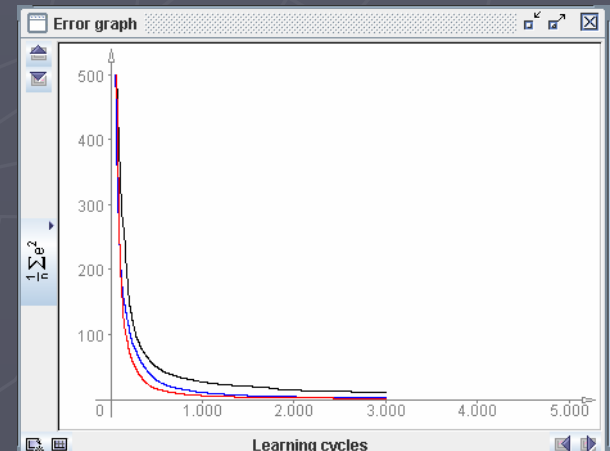
7x14x1



7x24x1



7x28x1



7x40x1

SNNS result file (aproximação, não classificação)

SNNS result file V1.4-3D
generated at Tue Dec 05 20:54:29 2006

```
No. of patterns      : 238
No. of input units  : 7
No. of output units : 1
startpattern        : 1
endpattern          : 238
teaching output included
#1.1
34.8
34.65694
#2.1
35.1
35.11522
#3.1
35.5
35.79424
#4.1
35.6
35.97858
```

▶ Análise estatística?

- ▶ Rodar diversos treinos e testes e verificar a média das diferenças entre os valores esperados e os valores obtidos.

- ▶ Desenvolvido programa para a análise do arquivo de saída do SNNS.
- ▶ Em pascal...

▶ batchman -f gprna.txt > log.txt

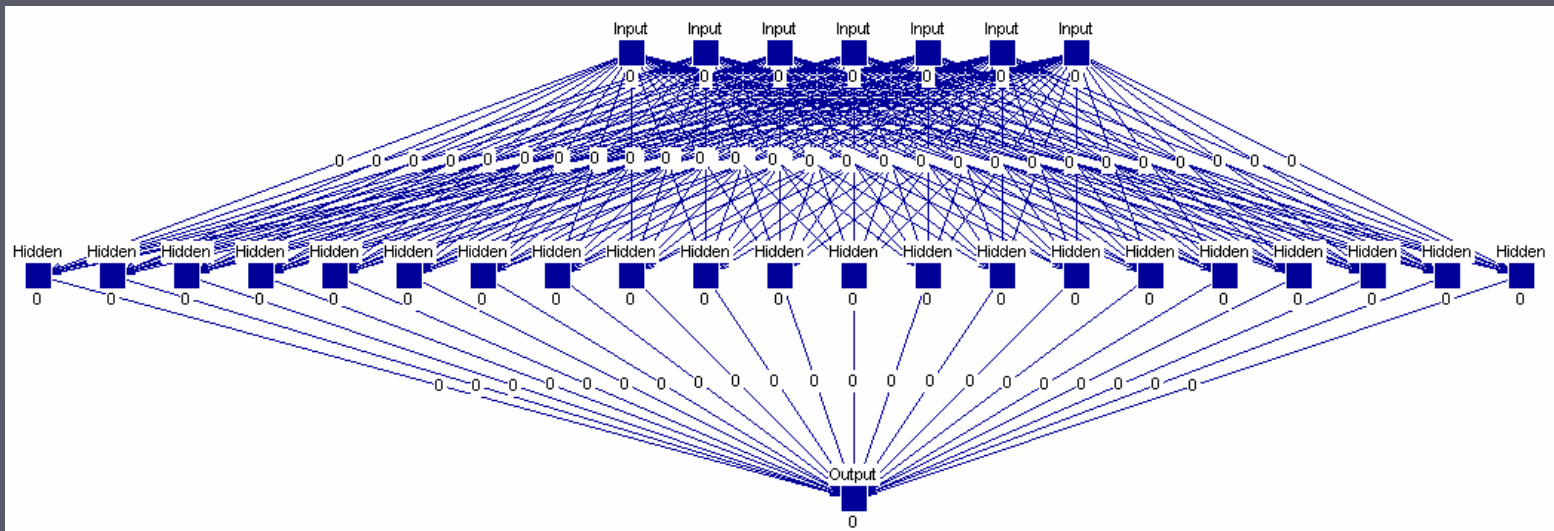
- ▶ Geradas 4 redes (14,21,24,28)
- ▶ 4 treinos de cada rede
- ▶ Análise de 3.000 e 4.000 ciclos de cada rede

▶ gprna.txt:

```
loadNet("gp7211.net") loadPattern("gp7030va.pat") loadPattern("gp7030tr.pat")
setSeed()
initNet()
setInitFunc("Randomize_Weights", 1.0, -1.0) setLearnFunc("Rprop",0.1,50.0,4.0)
Repeat
    for i := 1 to 100 do
        trainNet()
        print("MSE treino: ",MSE)
    endfor
saveNet("gp_rede7211." + CYCLES + "cycles.net")
saveResult("gp_resultado_treino." + CYCLES + "cycles.res", 1, PAT, FALSE, TRUE, "create")
setPattern("gp7030va.pat")
testNet()
print("MSE teste: ",MSE)
saveResult("gp_resultado_teste." + CYCLES + "cycles.res", 1, PAT, FALSE, TRUE, "create")
setPattern("gp7030tr.pat")
until CYCLES == 4000
```

Melhor Rede

		1		2		3		4	
Rede	Ciclos	Treino	Teste	Treino	Teste	Treino	Teste	Treino	Teste
7x14x1	3k	4,75	6,45	8,23	9,46	3,85	5,75	8,89	10,41
7x14x1	4k	5,00	7,60	8,28	9,56	3,44	5,93	8,83	10,55
7x21x1	3k	3,40	4,50	3,29	4,03	5,96	6,83	4,46	5,93
7x21x1	4k	3,10	4,01	3,71	4,17	5,20	6,20	4,33	5,48
7x24x1	3k	2,45	4,70	7,47	9,05	3,40	4,70	3,49	4,50
7x24x1	4k	2,27	5,10	7,34	8,86	3,25	4,51	3,44	4,32
7x28x1	3k	3,98	6,49	5,01	6,45	4,58	4,87	3,15	5,22
7x28x1	4k	3,81	6,52	3,73	5,50	2,92	4,15	2,54	5,77



Fechando o ciclo...

```

gp_rede7211.4000cycles.net - WordPad
Arquivo  Editar  Exibir  Inserir  Formatar  Ajuda

SNNs network definition file V1.4-3D
generated at Sat Dec 09 15:44:57 2006
network name : gps-7-21-1
...
learning function : Rprop
update function : Topological_Order
unit default section :
act      | bias      | st | subnet | layer | act func      | out func
-----|-----|---|-----|-----|-----|-----
0.00000 | 0.00000  | h  | 0      | 1     | Act_Logistic | Out_Identity
-----|-----|---|-----|-----|-----|-----
unit definition section :
no. | typeName | unitName | act      | bias      | st | position | act func      | out func | sites
-----|-----|-----|-----|-----|---|-----|-----|-----|-----
1   |          | Input    | -14.00000 | 0.99999  | i  | 9, 1, 1 | Act_Identity  |          |
...
8   |          | Hidden   | 0.00000  | -50.54447 | h  | 1, 3, 2 |||
...
28  |          | Hidden   | 0.00000  | -14.98355 | h  | 21, 3, 2 |||
29  |          | Output   | -14.04250 | -209.44351 | o  | 12, 5, 1 | Act_IdentityPlusBias |          |
-----|-----|-----|-----|-----|---|-----|-----|-----|-----
connection definition section :
target | site | source:weight
-----|-----|-----|-----|-----|---|-----|-----|-----|-----
8   | 1: 0.91200, 2:44.26724, 3:-26.57487, 4:-8.47824, 5: 4.04175, 6:-12.84162, 7:77.82683
9   | 1: 0.58233, 2:-518.62946, 3:18.55168, 4:-33.22934, 5:369.98685, 6:70.73188, 7:-46.51801
10  | 1: 0.25437, 2:-82.66879, 3:-1.76999, 4: 0.33515, 5:14.97332, 6:59.94917, 7: 2.69154
11  | 1: 0.91200, 2:44.26724, 3:-26.57486, 4:-8.47823, 5: 4.04175, 6:-12.84162, 7:77.82681
12  | 1: 0.91200, 2:44.26724, 3:-26.57487, 4:-8.47823, 5: 4.04176, 6:-12.84162, 7:77.82681
13  | 1:-0.34051, 2:74.46381, 3:-9.26054, 4:20.13098, 5:-132.71436, 6:-21.51511, 7:-60.09875
14  | 1: 0.35472, 2:-44.45144, 3:-26.13736, 4:-118.15172, 5:-64.99883, 6: 6.20691, 7:365.24725
15  | 1: 1.51596, 2:-227.13599, 3:30.31772, 4:-87.10497, 5:206.68037, 6:11.55048, 7:64.77970
16  | 1: 0.58233, 2:-518.62946, 3:18.55169, 4:-33.22934, 5:369.98685, 6:70.73188, 7:-46.51801
17  | 1: 0.40481, 2:-563.44135, 3: 8.44091, 4:-17.66710, 5:105.69875, 6:99.25653, 7:-102.64037
18  | 1: 0.99198, 2:48.43856, 3:-29.16729, 4:-8.94324, 5: 4.63867, 6:-13.92521, 7:84.42289

```



snn2c rede.net

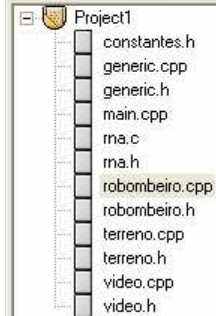


```

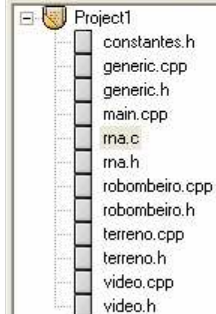
/*****
gprede.h
-----
generated at Wed Dec 06 20:32:25 2006
by snns2c ( Bernward Kett 1995 )
*****/

extern "C" int gprede(float *in, float *out, int init);

```

```
        (*chegou_no_fim)=1; }  
    else {  
        /* calcula angulo original */  
        float angulo_radi = atan(float(float(yf-yi)/float(xf-xi)));  
        float angulo_grau = (angulo_radi/PI)*180;  
  
        float a = angulo_grau*10; a = trunc(a); a = a/10;  
        /*RNA*/ std::cout << "\n" << a << " "; /* primeiro param :: angulo quero ir */  
  
        /* calcula densidades */  
        generic::varre_caixa(xi, yi, terreno, caixa);  
        generic::troca_caixa(caixa);  
  
        /* parametros de entrada na rede */  
        lista_in[0]=a;  
        lista_in[1]=float(caixa[0][0]-MIN_DENSIDADE)/float(MAX_DENSIDADE-MIN_DENSIDADE);  
        lista_in[2]=float(caixa[1][0]-MIN_DENSIDADE)/float(MAX_DENSIDADE-MIN_DENSIDADE);  
        lista_in[3]=float(caixa[2][0]-MIN_DENSIDADE)/float(MAX_DENSIDADE-MIN_DENSIDADE);  
        lista_in[4]=float(caixa[3][0]-MIN_DENSIDADE)/float(MAX_DENSIDADE-MIN_DENSIDADE);  
        lista_in[5]=float(caixa[4][0]-MIN_DENSIDADE)/float(MAX_DENSIDADE-MIN_DENSIDADE);  
        lista_in[6]=float(caixa[5][0]-MIN_DENSIDADE)/float(MAX_DENSIDADE-MIN_DENSIDADE);  
  
        /* chama rede */  
        gprede(lista_in, lista_out, 1);  
  
        /* */  
        float novo_angulo_radi = (lista_out[0]*PI)/180;  
  
        xi = xi+int(TAM_PASSO * cos(novo_angulo_radi));  
        yi = yi+int(TAM_PASSO * sin(novo_angulo_radi));  
  
        terreno[xi][yi][2] = -3;  
    }
```



```

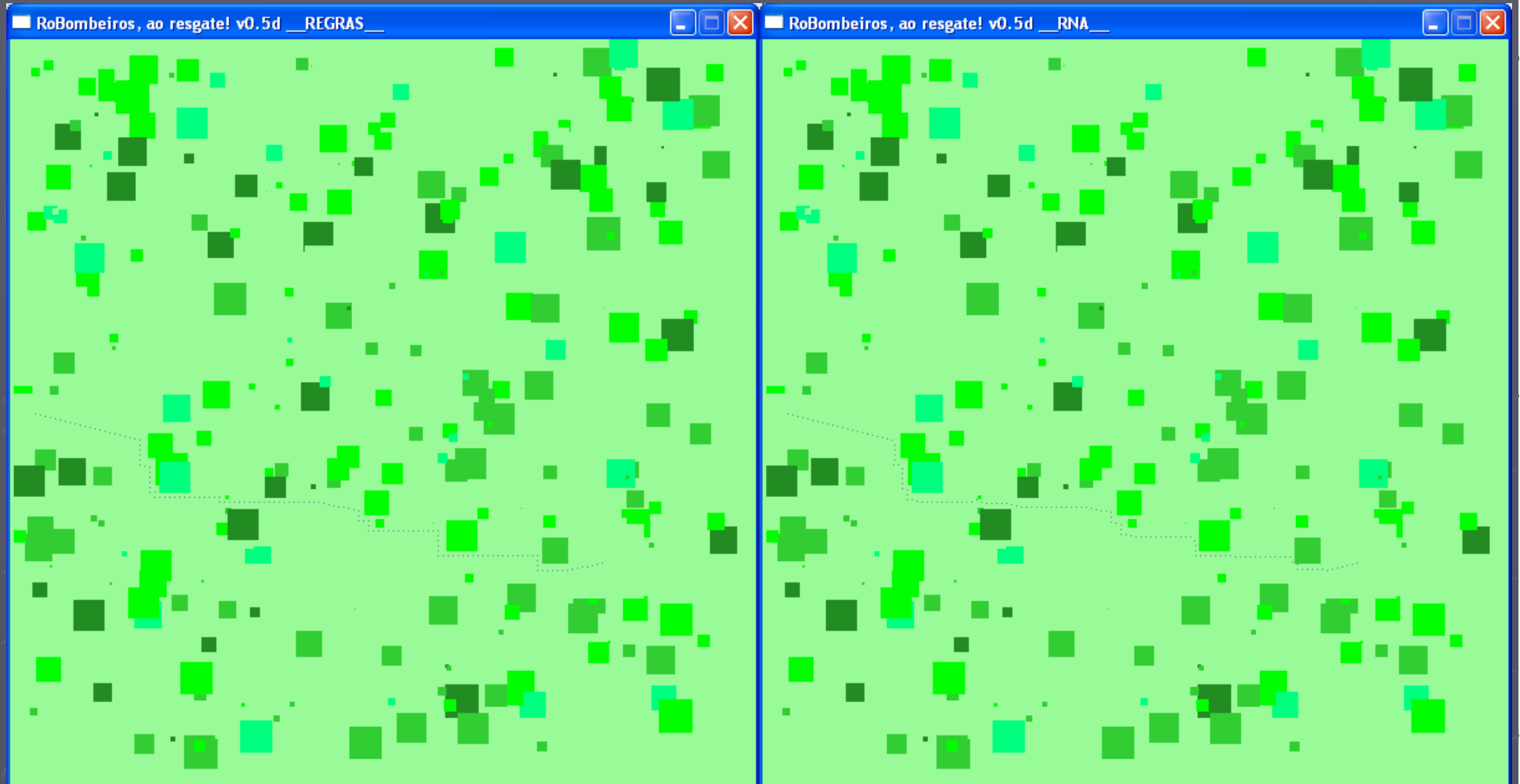
Units + 1, Units + 2, Units + 3, Units + 4, Units + 5, Units + 6, Units + 7, Units + 1, Units + 2, Units + 3, Units + 4, Units + 5, U
Units + 1, Units + 2, Units + 3, Units + 4, Units + 5, Units + 6, Units + 7, Units + 1, Units + 2, Units + 3, Units + 4, Units + 5, U
Units + 1, Units + 2, Units + 3, Units + 4, Units + 5, Units + 6, Units + 7, Units + 1, Units + 2, Units + 3, Units + 4, Units + 5, U
Units + 1, Units + 2, Units + 3, Units + 4, Units + 5, Units + 6, Units + 7, Units + 1, Units + 2, Units + 3, Units + 4, Units + 5, U
Units + 1, Units + 2, Units + 3, Units + 4, Units + 5, Units + 6, Units + 7, Units + 1, Units + 2, Units + 3, Units + 4, Units + 5, U
Units + 1, Units + 2, Units + 3, Units + 4, Units + 5, Units + 6, Units + 7, Units + 1, Units + 2, Units + 3, Units + 4, Units + 5, U
Units + 1, Units + 2, Units + 3, Units + 4, Units + 5, Units + 6, Units + 7, Units + 8, Units + 9, Units + 10, Units + 11, Units + 12
Units + 18, Units + 19, Units + 20, Units + 21, Units + 22, Units + 23, Units + 24, Units + 25, Units + 26, Units + 27, };

/* Weights definition section */
static float Weights[] = {
0.734650, -76.323708, -72.607239, -220.307465, -57.235611, 8.478030, 700.324219, 0.432370, -554.056702, 19.116711, -164.551239, 115.3
3.167070, -1731.302246, 105.665543, -206.740234, 61.937531, 165.028030, 6.108500, 0.565790, -2004.423706, 5.513050, -24.158819, 91.83
0.668840, 67.140717, -97.041077, 4.418470, 0.000000, 8.395120, 147.355530, 0.668840, 67.140732, -97.041069, 4.418470, 0.000000, 8.395
0.457790, -1679.651001, 3.612410, -15.359390, 47.149521, -5.581750, -10.798900, -0.040020, 236.716080, -0.683000, 2.321300, -66.19716
0.454080, -1472.813599, 11.504050, -18.952681, 55.574478, 33.232319, -23.254070, 3.288090, -68.280167, 6.181310, 7.614360, 287.880737
0.547950, -1520.451172, 3.645970, -23.006689, 81.425323, 17.565010, -7.325430, 1.376100, -606.016113, 5.715040, -30.257910, 486.87918
2.542180, 40.093121, 44.240898, -20.318790, 0.067270, 51.565399, 179.828812, 0.734650, -76.323708, -72.607239, -220.307449, -57.23561
3.065860, 48.774090, 26.938780, -26.067120, 149.896027, -5.034500, 187.527252, 7.188620, -1163.521729, -2.757220, -10.939720, 0.00000
0.822270, -97.773216, -94.927254, -264.692719, -61.221489, 9.102860, 827.629639, 1.840120, -617.950134, 4.724560, -6.810940, 494.0972
0.734650, -76.323700, -72.607246, -220.307465, -57.235592, 8.478020, 700.324219, 1.484690, -556.332825, 14.287260, -26.979660, 427.55
0.393600, -439.778564, -12.381440, -137.351639, 134.455078, 57.582062, 119.265961, 13.075470, 18.979300, 15.415610, 18.706890, -9.637
20.497351, 9.004350, 6.363870, 13.075500, 3.729440, 11.465980, 37.425091, 6.374740, 13.075480, 6.841770, 3.471860, };

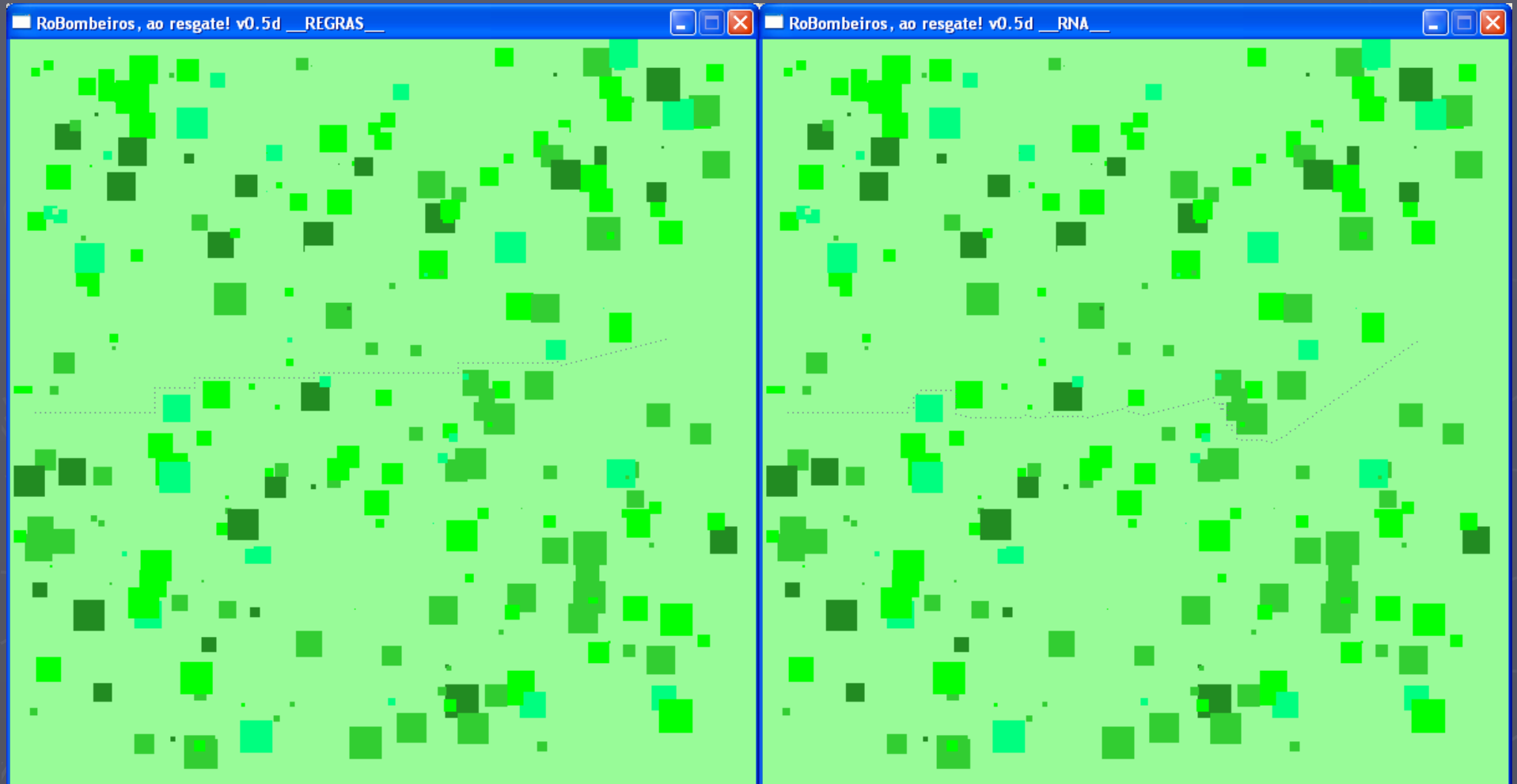
/* unit definition section (see also UnitType) */
static UnitType Units[30] =
{
{ 0.0, 1.000000, 0, &Sources[0], &Weights[0], },
{ 0.0, 0.999980, 0, &Sources[0], &Weights[0], },
{ 0.0, 0.999990, 0, &Sources[0], &Weights[0], },
{ 0.0, 0.999980, 0, &Sources[0], &Weights[0], },
{ 0.0, 0.999980, 0, &Sources[0], &Weights[0], }
}

```

Resultados



Resultados



That's all folks!

