Systemy Sztucznej Inteligencji dokumentacja projektu Kulki XDXDXD

Chłąd Paweł Grupa 2D Meller Bartłomiej Grupa 2D

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Część I

Opis programu

Instrukcja obsługi

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Argumenty wejściowe

Dodatkowe informacje

Projekt został skompilowany za pomocą . NET Core
 $3.1\,$

Część II

Opis działania sieci neuronowej

```
Zbiór danych
```

Implementacja

Ogólna struktura

Spis metod

```
public class MovementScoreRule : MonoBehaviour, IScoringRule
   • public float GetScore()
   public class Run public class AgentResult
   • public string runName = "Run #N";
   • public event EventHandler<List<AgentResult>> RunComplete;
   • public List<GameObject> agents = new List<GameObject>();
   • public List<AgentResult> results = new List<AgentResult>();
   • public static GameObject agentPrefab;
   • public Run(int num_agents)
   • public Run(List<NetworkModel> models)
   • public void BeginRun()
   • public double score;
   • public NetworkModel model;
   • public AgentResult(double score, NetworkModel model)
   public interface IScoringRule
   public class RunManager : MonoBehaviour
   public class CameraController : MonoBehaviour
   • public Transform target;
   • public Vector3 offset;
   public class ModelManager
```

```
• public List<NetworkModel> Models = new List<NetworkModel>();
• public int NumModels { get; }
• public double LearningRate { get; }
• public ModelManager(List<NetworkModel> models, double learningRate = 0.1f)
• public void SaveTop(int n)
• public void Expand()
public class Agent : MonoBehaviour
• public NetworkModel network;
• public static Transform cookieJar;
• public Action<Agent> deathCallback;
• public List<double> lastInputs = new List<double>();
• public List<double> lastOutputs = new List<double>();
• public float ViewArc
• public void OnCollisionEnter(Collision c)
public class InputMonitor : MonoBehaviour
• public Agent Target;
• public Text text;
public static class ScoreCalculator
• public static float CalculateScore(GameObject obj)
public class LifetimeScoreRule : MonoBehaviour, IScoringRule
• public float GetScore()
public class Pulse
• public double Value { get; set; }
public class NeuralLayer
• public List<Neuron> Neurons { get; set; }
• public string Name { get; set; }
• public double Weight { get; set; }
```

```
• public NeuralLayer(int count, double initialWeight, Func<double, double> activation,
  string name = "")
• public void Randomize(double lr)
• public void Forward()
• public override string ToString()
public class Dendrite
• public Pulse InputPulse { get; set; }
• public double SynapticWeight { get; set; }
• public bool Learnable { get; set; }
• public Dendrite()
• public void Randomize(double lr)
• public override string ToString()
public class Neuron
• public List<Dendrite> Dendrites { get; set; }
• public Pulse OutputPulse { get; set; }
• public Func<double, double> Activation;
• public Neuron(Func<double, double> activation)
• public void Randomize(double lr)
• public void Fire()
• public override string ToString()
public static class ActivationFunc
• public static double Tanh(double x)
• public static double Linear(double x)
• public static double BinaryStep(double x)
public class NetworkModel
• public List<NeuralLayer> Layers { get; set; }
• public NetworkModel()
• public NetworkModel DeepCopy()
```

- public void AddLayer(NeuralLayer layer)
- public void Build()
- public void Randomize(double lr)
- public List<double> Decide(List<double> X)
- public void Print()
- public override string ToString()

public static class JsonService

- public static void SaveModelsList(List<NetworkModel> models)
- public static List<NetworkModel> LoadModelsList(TextAsset jsonFile)

Testy

Eksperymenty

Pełen kod aplikacji

Kod znajduje się w repozytorium pod adresem: reee jak i również pod spodem.

MovementScoreRule.cs

```
using UnityEngine;
4 //Calculates score based on total moved distance
5 public class MovementScoreRule : MonoBehaviour, IScoringRule
      float score = 0;
      Vector3 lastPos;
10
      void Start()
11
12
          lastPos = this.transform.position;
13
      }
15
16
      void FixedUpdate()
17
18
          score += Vector3.Distance(this.transform.position, lastPos);
19
20
21
22
23
      public float GetScore()
24
25
26
          return score;
27
28 }
```

Run.cs

```
1 using System;
2 using System.Collections;
3 using System.Collections.Generic;
4 using NeuralNetwork;
5 using UnityEngine;
6 using System.Linq;
9 //Class that represents data gathered from one simulation run
10 public class Run
11 {
      public string runName = "Run #N";
12
13
      public event EventHandler <List < AgentResult >> RunComplete;
      public List < GameObject > agents = new List < GameObject > ();
14
      public List<AgentResult> results = new List<AgentResult>();
15
      public static GameObject agentPrefab;
17
18
      //Creates a new run with num_agents number of randomly initialized
19
          agents
      public Run(int num_agents)
20
21
           for (int i = 0; i < num_agents; i++)</pre>
22
           {
23
               agents.Add(CreateNewAgent());
24
           }
25
      }
26
      //Creates a new run with agents initialized with given models
28
      public Run(List<NetworkModel> models)
29
30
31
           foreach (NetworkModel m in models)
32
               GameObject a = CreateNewAgent();
33
               a.GetComponent < Agent > () .network = m;
               agents.Add(a);
35
           }
36
      }
37
      //Begins run by activating all agents
39
      public void BeginRun()
40
41
           foreach (GameObject a in agents)
42
43
               a.gameObject.SetActive(true);
44
           }
45
      }
46
47
      //Called when all agents died
48
      private void EndRun()
49
      {
50
           Debug.Log(runName + " ended");
51
           string resultString = "";
52
```

```
for (int i = 0; i < results.Count; i++)</pre>
53
54
               resultString += "Agent #" + i + " | Score: " + results[i].
55
                   score;
56
           Debug.Log(resultString);
57
           agents.Clear();
58
           RunComplete(this, results);
59
      }
61
      private void AgentDied(Agent a)
62
      {
63
           Debug.Log("Agent Died");
64
           results.Insert(0, new AgentResult(ScoreCalculator.CalculateScore
65
               (a.gameObject), a.network));
           agents.Remove(a.gameObject);
66
           if (agents.Count == 0)
67
68
               EndRun();
69
           }
70
      }
71
72
73
      //Creates new empty agent, that is inactive
      private GameObject CreateNewAgent()
75
76
           GameObject agent = GameObject.Instantiate(agentPrefab);
77
           agent.SetActive(false);
           agent.GetComponent < Agent > () . deathCallback = AgentDied;
79
           return agent;
80
      }
81
83
      public class AgentResult
84
85
           public double score;
86
           public NetworkModel model;
87
88
           public AgentResult(double score, NetworkModel model)
89
           {
90
               this.score = score;
91
               this.model = model.DeepCopy();
92
           }
93
      }
95 }
```

IScoringRule.cs

```
public interface IScoringRule
{
    //get current score from component
    float GetScore();
}
```

RunManager.cs

```
1 using System;
2 using System.Collections;
3 using System.Collections.Generic;
4 using System.Linq;
5 using UnityEngine;
6 using NeuralNetwork;
9 ///<summary>
10 /// Class that is responsible for run managment
11 ///</summary>
12 public class RunManager : MonoBehaviour
13 {
14
      //List of all results generated by any agent manager
      List < Run > runs = new List < Run > ();
15
      int run_num = 0;
      [SerializeField]
17
      GameObject agentPrefab;
18
19
      ModelManager modelManager = null;
      // Start is called before the first frame update
21
      void Start()
22
23
      {
           Run.agentPrefab = agentPrefab;
24
           //For now the behaviour is to indefinetely repeat randomized
25
              runs:
           StartNewRun();
26
      }
27
28
      // Update is called once per frame
29
      void Update()
30
31
      {
32
      }
33
34
      void StartNewRun()
35
36
       // modelManager = new ModelManager(JsonService.LoadModelsList((
37
           TextAsset)Resources.Load("20-01-14_20-23-44")));
38
           Run r = null;
39
40
           if (modelManager == null)
41
42
               r = new Run(25);
43
               modelManager = new ModelManager(r.agents.Select(x => x.
44
                  GetComponent < Agent > () . network) . ToList(), 0.05f);
           }
45
           else
46
47
               modelManager.SaveTop(5);//kill all models and save top 5
48
               modelManager.Expand(); //expand models list to original size
49
               r = new Run(modelManager.Models);
50
```

```
}
51
           r.runName = "Run #" + run_num;
52
           r.RunComplete += OnRunEnded;
53
           r.BeginRun();
54
      }
55
56
      void OnRunEnded(object sender, List<Run.AgentResult> results)
57
           //Accept only Run senders
           if (!(sender is Run r))
60
               throw new ArgumentException("Sender is not of the type Run")
61
62
63
           //{\tt Unsubscribe} from sender to avoid memory leak
64
           r.RunComplete -= OnRunEnded;
65
66
           //store run
67
           runs.Add(r);
68
           List < Network Model > models = r.results.OrderBy(x => x.score).
              Select(x => x.model).ToList();
           Debug.Log(models[0].ToString());
70
           StartNewRun();
71
      }
72
73 }
```

CameraController.cs

```
1 using System;
2 using System.Collections;
3 using System.Collections.Generic;
4 using UnityEngine;
6 public class CameraController : MonoBehaviour
7 {
      public Transform target;
      public Vector3 offset;
10
      private Vector3 previousMousePos;
11
      private Vector3 currRot = new Vector3(0, 0, 0);
12
13
      private float rotSpeed = 100f;
14
      // Start is called before the first frame update
15
      void Start()
17
      {
          previousMousePos = Input.mousePosition;
18
           Cursor.lockState = CursorLockMode.Locked;
19
      }
20
21
      // Update is called once per frame
22
      void Update()
23
24
25
           if (Input.GetButtonDown("ToggleCursor"))
26
27
               if (Cursor.lockState != CursorLockMode.Locked)
28
               {
29
                   Cursor.lockState = CursorLockMode.Locked;
30
               }
31
32
               else
               {
33
                   Cursor.lockState = CursorLockMode.None;
34
               }
          }
36
37
38
           if (Input.GetButtonDown("BreakTarget"))
               target = null;
40
41
           if (Input.GetButtonDown("BestTarget"))
42
               target = ChooseBestTarget();
43
44
45
          if (target == null)
46
           {
47
               transform.Translate(Vector3.forward * Input.GetAxis("Forward
48
                  "));
               transform.Translate(Vector3.up * Input.GetAxis("Up"));
49
               transform.Translate(Vector3.right * Input.GetAxis("Right"));
50
51
               Quaternion rot = Quaternion.identity;
52
```

```
currRot += new Vector3(-Input.GetAxis("Mouse Y"), Input.
53
                  GetAxis("Mouse X"), Of) * Time.deltaTime * rotSpeed;
               rot.eulerAngles = currRot;
54
               transform.rotation = rot;
55
           }
56
57
           previousMousePos = Input.mousePosition;
58
59
           if (target != null)
               transform.position = target.position - offset;
61
           //Check for input
62
63
      }
64
65
66
67
68
      Transform ChooseBestTarget()
69
      {
70
           throw new NotImplementedException();
71
      }
72
73
74 }
```

ModelManager.cs

```
1 using System;
2 using System.Collections.Generic;
3 using System.Data;
4 using System.Linq;
5 using UnityEngine;
6 using NeuralNetwork;
8 public class ModelManager
      public List < Network Model > Models = new List < Network Model > ();
10
      public int NumModels { get; }
11
      public double LearningRate { get; }
12
13
14
      public ModelManager(List<NetworkModel> models, double learningRate =
15
           0.1f)
      {
16
           LearningRate = learningRate;
17
           Models = models;
18
           NumModels = models.Count;
      }
20
21
22
      public void SaveTop(int n)
23
24
           if (n > Models.Count)
25
26
               Debug.Log("Provided number is lower than count of models!");
           }
28
           else
29
           {
30
31
               Models.RemoveRange(0, n);
               JsonService.SaveModelsList(Models);
32
           }
33
      }
34
35
      public void Expand()
36
37
           int n = Models.Count;
39
           int clonesNeeded = NumModels - n;
40
41
           List < NetworkModel > clones = new List < NetworkModel > ();
43
           if (n >= NumModels)
44
45
               Debug.Log("Models collection is full!");
46
           }
47
           else
48
49
               for (int i = 0; i < clonesNeeded; i++)</pre>
50
               {
51
                    clones.Add(Models[i % n].DeepCopy()); // add
52
```

```
randomization

clones[clones.Count() - 1].Randomize(LearningRate);

}

Models = new List < NetworkModel > (Models.Concat(clones));

Models = new List < NetworkModel > (Models.Concat(clones));
```

Agent.cs

```
1 using System;
2 using NeuralNetwork;
3 using UnityEngine;
4 using System.Collections.Generic;
5 using System.Collections;
7 public class Agent : MonoBehaviour
8 {
      public NetworkModel network;
10
      //Target cookie jar for every agent that exists (?TODO?: handle null
11
           case?)
12
      public static Transform cookieJar;
13
14
      //function to call when this agent dies
      public Action < Agent > deathCallback;
16
      public List<double > lastInputs = new List<double >(); //inputs that
17
          were fed in previous frame (for UI and debugging)
      public List<double> lastOutputs = new List<double>(); //outputs that
18
           were outputted in previous frame (for UI and debugging)
      private float ForceMultiplier = 10.0f;
19
20
      //View arc in radians
21
      [SerializeField]
22
      private float viewArc = 2.0f;
23
24
      public float ViewArc
26
          get { return viewArc; }
27
28
          set
29
          {
               viewArc = value;
30
               arcStep = viewArc / (float)rayCount; // recalculate arcStep
31
          }
32
      }
33
34
      [SerializeField]
35
      //Number of rays that will be cast
      private int rayCount = 8;
37
38
39
      private float arcStep = Of;
40
41
42
      void Awake()
43
      {
44
          arcStep = viewArc / (float)rayCount;
45
46
          cookieJar = GameObject.Find("cookieJar").transform;
47
          network = new NetworkModel();
48
          network.Layers.Add(new NeuralLayer(1 + rayCount, 0.0,
49
              ActivationFunc.Linear, "INPUT")); //rayCount + one for
```

```
CookieJar position
           network.Layers.Add(new NeuralLayer(11, 0.0, ActivationFunc.
50
              Linear, "HIDDEN"));
           network.Layers.Add(new NeuralLayer(2, 0.0, ActivationFunc.Tanh,
51
              "OUTPUT"));
           network.Build();
52
           network.Randomize(0.5);
53
54
      }
      void Start()
56
      ₹
57
58
59
      }
60
61
62
63
      void FixedUpdate()
64
           lastOutputs = network.Decide(GatherInputs());
65
           ParseOutput(lastOutputs);
66
      }
67
68
69
      ///<summary>Parses output of a neural network</summary>
70
      ///Activations go as follows:
71
      ///[0] - force on X axis
72
      ///[1] - force on Z axis
73
      private void ParseOutput(List<double> activations)
74
      {
75
           this.GetComponent < Rigidbody > ().AddForce (new Vector3 ((float)
76
              activations[0] * ForceMultiplier, 0.0f, (float)activations[1]
               * ForceMultiplier));
      }
77
78
      //Gathers inputs from enviroment
79
      private List < double > GatherInputs()
80
81
           List < double > results = new List < double > ();
82
           //1. raycast
           for (int i = 0; i < rayCount; i++)</pre>
84
           {
85
               float curr_arc = i * arcStep * Mathf.PI;
86
               Vector3 dir = new Vector3(Mathf.Cos(curr_arc), 0, Mathf.Sin(
87
                   curr_arc));
               dir.Normalize(); //OPTM: Not needed as Cos and Sin are in
88
                   [-1,1]?
               RaycastHit hit;
               if (Physics.Raycast(this.transform.position, dir, out hit,
90
                   100.0f, 1 << 10)
               {
91
                   results.Add((double)hit.distance / 100.0f);
92
                   Debug.DrawRay(transform.position, hit.point - transform.
93
                       position, Color.black, 0.01f, true);
               }
94
               else
```

```
{
96
                    results.Add(1.0f); // if nothing was hit, add max
97
                }
98
           }
99
100
           //2. get distance from the cookie jar
101
           results.Add(Vector3.Distance(this.transform.position, cookieJar.
102
               position) / 100.0f);
           lastInputs = results;
103
           return results;
104
       }
105
106
       public void OnCollisionEnter(Collision c)
107
108
           //if layer is wall layer
109
           if (c.collider.gameObject.layer == 10)
110
111
                //die...
112
                this?.deathCallback(this);
113
                Destroy(this.gameObject);
114
           }
115
       }
116
117
       //EDITOR
118
       void OnValidate()
119
120
           //Because Unity does not support property exposing to the
121
               Inspector, we use OnValidate (called whenever, whatever
               changed by the Inspecotr)
           //And force property to fire.
122
           ViewArc = viewArc;
123
       }
125
126
127 }
```

InputMonitor.cs

```
using System.Collections;
2 using System.Collections.Generic;
3 using UnityEngine;
4 using UnityEngine.UI;
6
7 public class InputMonitor : MonoBehaviour
10
      public Agent Target;
11
      public Text text;
12
      // Start is called before the first frame update
13
      void Start()
14
15
           if (Target == null)
               Debug.LogWarning("Target is null, no data will be shown.");
17
18
19
      // Update is called once per frame
      void FixedUpdate()
21
22
           if (Target != null)
23
           {
24
               string input_data = "";
25
               string output_data = "";
26
               for (int i = 0; i < Target.lastInputs.Count; i++)</pre>
27
28
                    input_data += "Input " + i + " --- " + Target.lastInputs
29
                       [i] + "\n";
               }
30
31
               for (int i = 0; i < Target.lastOutputs.Count; i++)</pre>
32
               {
33
                    output_data += "Output " + i + " --- " + Target.
34
                       lastOutputs[i] + "\n";
35
36
37
               text.text = input_data + output_data;
           }
38
39
      }
40
41 }
```

ScoreCalculator.cs

```
using UnityEngine;
2 using System.Collections.Generic;
4 public static class ScoreCalculator
5 {
6
7
      public static float CalculateScore(GameObject obj)
          //Get all components with given interfaces and map them to
10
              theirs type names
          IScoringRule[] rules = obj.GetComponents<IScoringRule>();
11
          Dictionary < string, IScoringRule > ruleDictionary = new Dictionary
12
              <string, IScoringRule >();
13
          foreach(IScoringRule r in rules)
15
               ruleDictionary.Add(r.GetType().ToString(), r);
16
          }
^{17}
18
19
          return ruleDictionary["MovementScoreRule"].GetScore() + 0.1f*
20
              ruleDictionary["LifetimeScoreRule"].GetScore();
      }
21
22
23
24
26 }
```

${\bf Lifetime Score Rule.cs}$

```
using UnityEngine;
_{\rm 3} //Scoring rule: Add point depending on lifetime
4 public class LifetimeScoreRule : MonoBehaviour, IScoringRule
      float score = 0;
6
      void FixedUpdate()
          score++;
10
      }
11
12
      public float GetScore()
13
14
         return score;
15
      }
16
17 }
```

Pulse.cs

```
1 using System;
2 using System.Collections.Generic;
3 using System.Data;
4 using System.Linq;
{\tt 5} using System.Runtime.Serialization.Formatters.Binary;
6 using System.Runtime.Serialization;
7 using System.IO;
8 using UnityEngine;
9 using Newtonsoft.Json;
{\tt 11} namespace NeuralNetwork
12 {
      [Serializable]
14
      public class Pulse
      {
15
           [JsonProperty]
           public double Value { get; set; }
17
18
19 }
```

NeuralLayer.cs

```
1 using System;
2 using System.Collections.Generic;
3 using System.Data;
4 using System.Linq;
5 using System.Runtime.Serialization.Formatters.Binary;
6 using System.Runtime.Serialization;
7 using System.IO;
8 using UnityEngine;
9 using Newtonsoft. Json;
11 namespace NeuralNetwork
12 {
13
      [Serializable]
      public class NeuralLayer{
14
           public List<Neuron> Neurons { get; set; }
15
           public string Name { get; set; }
17
18
           public double Weight { get; set; }
19
           Func < double , double > Activation;
21
           public NeuralLayer(int count, double initialWeight, Func<double,</pre>
22
               double> activation, string name = "")
23
               Activation = activation;
24
               Neurons = new List < Neuron > ();
25
               for (int i = 0; i < count; i++)</pre>
26
                    Neurons.Add(new Neuron(Activation));
28
               }
29
30
31
               Name = name;
           }
32
33
           public void Randomize (double 1r)
35
36
               foreach (var neuron in Neurons)
37
               {
                    neuron.Randomize(lr);
39
40
           }
41
           public void Forward()
43
44
               foreach (var neuron in Neurons)
45
               {
                    neuron.Fire();
47
               }
48
49
           }
51
           public override string ToString()
52
```

```
{
53
                string tmp = "{\n";
54
                for (int i = 0; i < Neurons.Count; i++)</pre>
55
56
                     tmp += Neurons[i].ToString();
                     if (i != Neurons.Count - 1)
58
                         tmp += "\n";
59
60
                tmp += " \setminus n \} ";
                return tmp;
62
            }
63
64
       }
65
66 }
```

Dendrite.cs

```
1 using System;
2 using System.Collections.Generic;
3 using System.Data;
4 using System.Linq;
5 using System.Runtime.Serialization.Formatters.Binary;
6 using System.Runtime.Serialization;
7 using System.IO;
8 using UnityEngine;
9 using Newtonsoft. Json;
11 namespace NeuralNetwork
12 {
13
      [Serializable]
14
      public class Dendrite
15
      {
           public Pulse InputPulse { get; set; }
17
18
           public double SynapticWeight { get; set; }
19
           public bool Learnable { get; set; }
21
22
           public Dendrite()
23
           {
24
               SynapticWeight = 0;
25
26
27
           public void Randomize(double lr)
28
29
               float t = (float)lr;
30
               SynapticWeight += (double)UnityEngine.Random.Range(-t, t);
31
           }
32
33
34
           public override string ToString()
36
               return SynapticWeight.ToString();
37
38
39
40
      }
41
42 }
```

Neuron.cs

```
1 using System;
2 using System.Collections.Generic;
3 using System.Data;
4 using System.Linq;
5 using System.Runtime.Serialization.Formatters.Binary;
6 using System.Runtime.Serialization;
7 using System.IO;
8 using UnityEngine;
9 using Newtonsoft. Json;
11 namespace NeuralNetwork
12 {
13
      [Serializable]
      public class Neuron
14
15
           public List<Dendrite> Dendrites { get; set; }
17
           public Pulse OutputPulse { get; set; }
18
19
           public Func < double , double > Activation;
21
           public Neuron(Func < double > double > activation)
22
23
           {
               Dendrites = new List < Dendrite > ();
24
               OutputPulse = new Pulse();
25
               Activation = activation;
26
           }
27
28
           public void Randomize(double lr)
29
30
               foreach (var dendrite in Dendrites)
31
32
               {
                    dendrite.Randomize(lr);
33
               }
34
           }
36
           public void Fire()
37
           {
38
               OutputPulse.Value = Sum();
40
               OutputPulse.Value = Activation(OutputPulse.Value);
41
           }
42
43
           private double Sum()
44
45
               double computeValue = 0.0f;
46
               foreach (var d in Dendrites)
47
               {
48
                    computeValue += d.InputPulse.Value * d.SynapticWeight;
49
               return computeValue;
52
           }
53
```

```
54
           public override string ToString()
55
56
               string tmp = "[";
57
               for (int i = 0; i < Dendrites.Count; i++)</pre>
59
                    tmp += Dendrites[i].ToString();
60
                    if (i != Dendrites.Count - 1)
61
                        tmp += ", ";
               }
63
               tmp += "]";
64
               return tmp;
65
           }
66
67
68
      }
69
70 }
```

Activation.cs

```
using UnityEngine;
2 using System;
4 namespace NeuralNetwork
5 {
      public static class ActivationFunc
6
           public static double Tanh(double x)
               return 1 - (2.0) / (Math.Exp(2 * x) + 1);
10
11
12
           public static double Linear(double x)
13
14
               return x;
15
           }
17
           public static double BinaryStep(double x)
18
19
               if (x > 0)
20
                {
21
                   return 1;
22
                }
23
               if (x == 0)
24
                {
25
                   return 0;
26
               }
27
               if (x < 0)
28
29
               {
                   return -1;
30
               }
31
               return 0;
32
           }
33
34
      }
35
36
37 }
```

NetworkModel.cs

```
1 using System;
2 using System.Collections.Generic;
3 using System.Data;
4 using System.Linq;
5 using System.Runtime.Serialization.Formatters.Binary;
6 using System.Runtime.Serialization;
7 using System.IO;
8 using UnityEngine;
9 using Newtonsoft. Json;
11 namespace NeuralNetwork
12 {
13
      [Serializable]
14
      public class NetworkModel
15
      {
           public List<NeuralLayer> Layers { get; set; }
17
18
           public NetworkModel()
19
               Layers = new List < NeuralLayer > ();
21
22
23
           public NetworkModel DeepCopy()
24
25
               using (MemoryStream ms = new MemoryStream())
26
27
                    BinaryFormatter formatter = new BinaryFormatter();
28
                    formatter.Context = new StreamingContext(
29
                       StreamingContextStates.Clone);
                    formatter.Serialize(ms, this);
30
31
                   ms.Position = 0;
                    return (NetworkModel)formatter.Deserialize(ms);
32
               }
33
           }
35
           public void AddLayer(NeuralLayer layer)
36
37
               int dendriteCount = 1;
               if (Layers.Count > 0)
39
               {
40
                    dendriteCount = Layers[Layers.Count - 1].Neurons.Count;
41
               }
43
               foreach (var element in layer. Neurons)
44
45
                   for (int i = 0; i < dendriteCount; i++)</pre>
46
47
                        element.Dendrites.Add(new Dendrite());
48
                   }
49
               }
           }
51
52
```

```
public void Build()
54
                int i = 0;
55
                foreach (var layer in Layers)
56
57
                     if (i >= Layers.Count - 1)
58
                     {
59
                         break;
60
                     }
                     var nextLayer = Layers[i + 1];
62
                     CreateNetwork(layer, nextLayer);
63
                     i++;
64
                }
65
            }
66
67
68
            public void Randomize(double lr)
69
70
                foreach (var layer in Layers)
71
                {
72
                     layer.Randomize(lr);
73
74
            }
75
            public List<double> Decide(List<double> X)
77
78
                var inputLayer = Layers[0];
79
                List < double > outputs = new List < double > ();
81
                for (int i = 0; i < X.Count; i++)</pre>
82
                {
83
                     inputLayer.Neurons[i].OutputPulse.Value = X[i];
                }
85
                ComputeOutput();
86
                foreach (var neuron in Layers.Last().Neurons)
87
                {
88
                     outputs.Add(neuron.OutputPulse.Value);
89
                }
90
                return outputs;
            }
92
93
            public void Print()
94
95
96
                Debug.Log("Name | Neurons");
97
98
                foreach (var layer in Layers)
100
                     Debug.Log(layer.Name + " | " + layer.Neurons.Count);
101
                }
102
            }
103
104
            private void CreateNetwork(NeuralLayer connectingFrom,
105
               NeuralLayer connectingTo)
            {
106
```

```
foreach (var to in connectingTo.Neurons)
107
108
                      foreach (var from in connectingFrom.Neurons)
109
                      {
110
                           to.Dendrites.Add(new Dendrite() { InputPulse = from.
111
                               OutputPulse });
                      }
112
                 }
113
            }
115
            private void ComputeOutput()
116
            {
117
                 bool first = true;
118
                 foreach (var layer in Layers)
119
120
                      if (first)
121
                      {
122
                           first = false;
123
                      }
124
                      else
125
                      {
126
                           layer.Forward();
127
                      }
128
                 }
129
            }
130
131
            public override string ToString()
132
                 string tmp = "";
134
                 for (int i = 1; i < Layers.Count; i++)</pre>
135
136
                      tmp += Layers[i].ToString();
137
                      if (i != Layers.Count - 1)
138
                           tmp += "\n";
139
140
                 tmp += " \ n ";
141
                 return tmp;
142
            }
143
144
145
        }
146
147 }
```

JsonService.cs

```
1 using System;
2 using System.IO;
3 using System.Text;
4 using System.Collections.Generic;
5 using System.Data;
6 using System.Linq;
7 using UnityEngine;
8 using NeuralNetwork;
9 using Newtonsoft. Json;
10 public static class JsonService
11 {
      public static void SaveModelsList(List<NetworkModel> models)
12
13
          string timeString = DateTime.Now.ToString("yy-MM-dd_HH-mm-ss");
14
          timeString = timeString.Replace(' ', '_');
15
        JsonSerializerSettings settings = new JsonSerializerSettings();
17
        settings.NullValueHandling = NullValueHandling.Include;
18
        settings.ReferenceLoopHandling = ReferenceLoopHandling.Serialize;
19
          string jsonString = JsonConvert.SerializeObject(models);
21
          string path = Application.dataPath + "/jsonModels/" + timeString
22
               + ".json";
          File.WriteAllText(path, jsonString);
23
      }
24
25
      public static List < Network Model > Load Models List (Text Asset json File)
26
          List < Network Model > models = JsonConvert.DeserializeObject < List <
28
              NetworkModel >> (jsonFile.ToString());
        return models;
29
      }
30
31
32 }
```