

Pseudo-Random Number Generators

Functional Programming and Intelligent Algorithms

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Outline

- 1 Review
- 2 Randomness
- 3 Random initial weights
- 4 Closure

Review of yesterday

- + What did you learn yesterday?
- △ What is your greatest challenge?

The implementation of the perceptron

- 1 How does your neural network perform?
- 2 What needs improvement

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Randomness

What is randomness?

Probabilistic programs

*How do we create probabilistic computer programs?
I.e. how do we make the computer act at random?*

Two options

True randomness uses physical sources of entropy

- 1 `/dev/random` on many systems
- 2 `random-fu` in Haskell

Pseudo-random number generators (PRNG) are **deterministic** but *random-looking*

- `random`, standard package in Haskell
- `random-tf`, more recent Haskell package

Linear Congruential Generators

A classic PRNG

- Recurrence $x_j = a + cx_{j-1} \pmod m$
- Seed (initial state) x_0
- Pseudo-random sequence $[x_0, x_1, x_2, \dots]$
- Known as *Lehmer's algorithm*

Will this pseudo-random sequence look random?

Ciphers in counter mode

PRNG through cryptography

- Cipher $e_k(x) = y$
- Pseudo-random sequence $[x_0, x_1, x_2, \dots]$ where
 - $x_i = e_k(i)$

Why does this give good randomness?

The PRNG is a state machine

- 1 The **state** decides what the PRNG will output
 - *Lehmer's algorithm* x_{i-1} is the state
 - *Counter mode* i is the state
- 2 State transition
 - *Lehmer's algorithm* $x \mapsto a + cx \pmod m$
 - *Counter mode* $i \mapsto i + 1$
- 3 Output function
 - *Lehmer's algorithm* $x \mapsto a + cx \pmod m$
 - *Counter mode* $i \mapsto e_k(i + 1)$

State machines in functional programming

How do we handle state machines in functional programming?

- 1 What is special about functional programming?
- 2 What is difficult?
- 3 How can we do it?

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Random sequence

1 next :: TFGen -> (TFGen, Word32)

Exercise

Given a TFGen object, how do you generate an random, infinite list of Word32 objects?

Splitting a PRNG

Problem. After you have generated the infinite list, how do you get the updated state?

- 1 `split :: TFGen -> (TFGen, TFGen)`
- 2 `(g', newstate) = split g`
- 3 Use `g'` to generate the list
- 4 `newstate` is your new state

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Given a TFGen object, how do you generate an random, infinite list of Word32 objects?

Question

Where do you get the initial state?

Different options

- 1 Hardcode an arbitrary seed
- 2 Use initialisation functions in the library
 - 1 `initTFGen`
- 3 Use a library which provides true random values
 - `random-fu`

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Tuning parameters

- 1 Distribution of random initial weights?
- 2 β in the sigmoid function?
- 3 Number of iterations?

Artificial intelligence is not an exact science.

- Trial and error.
- Test different choices.

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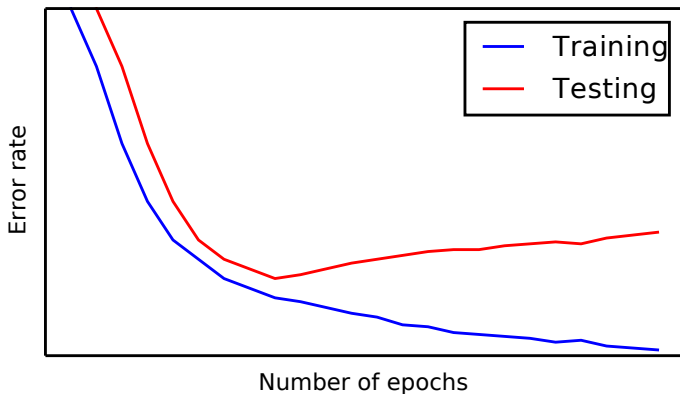
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Some guidelines

- Weights: $-1/\sqrt{n} \leq w \leq 1/\sqrt{n}$
 - where n is the number of inputs to the layer
- The weights should have similar magnitude
- Small β — $\beta \leq 3$
 - ① $\beta = 1$ is a good starting point

Number of epochs



Exercise

- Update the `initNeuron` and `initNetwork` functions with randomised weights
- You need to import a library, either
 - `System.Random`; or
 - `System.Random.TF`
- Initialise the PRNG
- Generate and use the weights for the network