Random Numbers

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1. What are random numbers?

- Not really random, just very unpredictable.
- Often based on integer sequences:

$$r_{n+1} = ar_n + b \mod N$$

- $\Rightarrow$ they repeat, but only with a long period.
- A good generator passes statistical tests.
- ... a bad generator gives bad science (Ising model)

2. Random workflow

Use header:

```
#include <random>
```

Steps:

1. First there is the random engine which contains the mathematical random number generator.
2. The random numbers used in your code then come from applying a distribution to this engine.
3. Optionally, you can use a random seed, so that each program run generates a different sequence.

3. Random generators and distributions

- Random device

```
// default seed
std::default_random_engine generator;
// random seed:
std::random_device r;
std::default_random_engine generator{ r() };
```

- Distributions:

```
std::uniform_real_distribution<float> distribution(0.,1.);
std::uniform_int_distribution<int> distribution(1,6);
```

- Sample from the distribution:

```
std::default_random_engine generator;
std::uniform_int_distribution<>
    distribution(0,nbuckets-1);
random_number = distribution(generator);
```

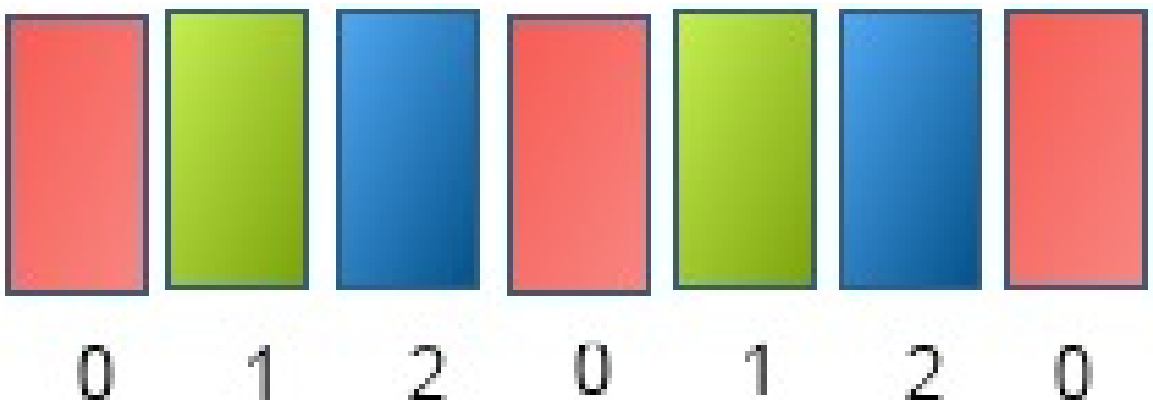
- Do not use the old C-style `random`!

4. Why so complicated?

- Large period wanted; C random has 2^{15} (implementation dependent)
- Multiple generators, guarantee on quality.
- Simple transforms have a bias:

```
int under100 = rand() % 100
```

Simple example: period 7, mod 3



5. Dice throw

```
// set the default generator
std::default_random_engine generator;

// distribution: ints 1..6
std::uniform_int_distribution<int> distribution(1,6);

// apply distribution to generator:
int dice_roll = distribution(generator);
  // generates number in the range 1..6
```

6. Poisson distribution

Poisson distributed integers:
chance of k occurrences, if m is the average number
(or $1/m$ the probability)

```
std::default_random_engine generator;
float mean = 3.5;
std::poisson_distribution<int> distribution(mean);
int number = distribution(generator);
```

7. Local engine

Wrong approach: random generator local in the function.

Code:

```
1 // rand/static.cpp
2 int nonrandom_int(int max) {
3   std::default_random_engine
       engine;
4   std::uniform_int_distribution<>
5     ints(1,max);
6   return ints(engine);
7 };
8     /* ... */
9   // call `nonrandom_int' three
       times
```

Output:

```
Three ints: 1, 1, 1.
```

Generator gets recreated in every function call.

Exercise 1

What is wrong with the following code:

```
int somewhat_random_int(int max) {
  random_device r;
  default_random_engine generator{ r() };
  std::uniform_int_distribution<> ints(1,max);
  return ints(generator);
};
```

8. Global engine

Good approach: random generator static in the function.

Code:

```
1 // rand/static.cpp
2 int realrandom_int(int max) {
3   static
       std::default_random_engine
       static_engine;
4   std::uniform_int_distribution<>
5     ints(1,max);
6   return ints(static_engine);
7 };
```

Output:

```
Three ints: 15, 98,
    ↪70.
```

A single instance is ever created.

9. What does ‘static’ do?

- Static variable in function:
  persistent, shared between function calls
- Static variable in class:
  shared between all objects of that class

10. Class with static member

Class that counts how many objects have been generated:

Code:

```
1 // object/static.cpp
2 class Thing {
3 private:
4   static inline int nthings{0};
5   int mynumber;
6 public:
7   Thing() {
8     mynumber = nthings++;
9     cout << "I am thing "
10         << mynumber << '\n';
11  };
12 };
```

Output:

```
I am thing 0
I am thing 1
I am thing 2
```

(the `inline` is needed for the initialization)

Optional exercise 2

In the previous Goldbach exercise you had a prime number generator in a loop, meaning that primes got recalculated a number of times.

Optimize your prime number generator so that it remembers numbers already requested.

Hint: have a `static` vector.

11. Generator in a class

Note the use of `static`:

```
1 // rand/randname.cpp
2 class generate {
3 private:
4   static inline std::default_random_engine engine;
5 public:
6   static int random_int(int max) {
7     std::uniform_int_distribution<> ints(1,max);
8     return ints(generate::engine);
9   };
10 };
```

Usage:

```
auto nonzero_percentage = generate::random_int(100)
```

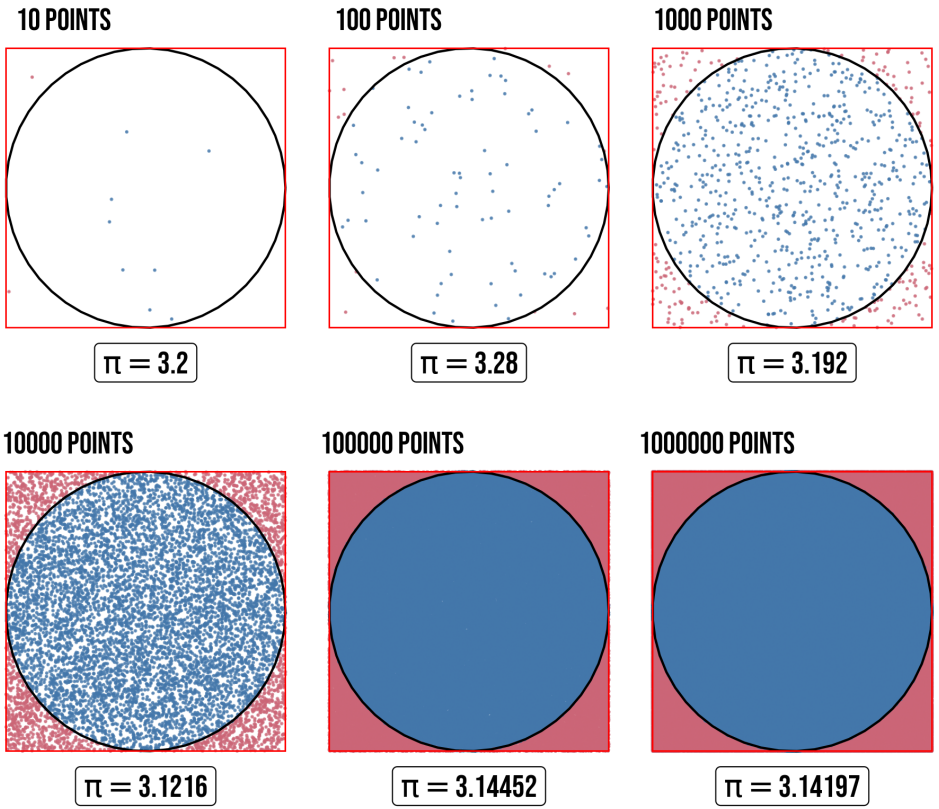
12. About seeding

- No seed: $\Rightarrow$ the same numbers every time
  ... but not between different compilers / computers
- Explicit seed: reproducible.
- Average result ('ensembles'): use many different seeds.
- Seeding in parallel is tricky.

Integration

13. Compute pi by Monte Carlo method

- Generate many random coordinates $(x, y) \in [0, 1]^2$.
- Count the ratio of inside-the-circle to total.
- Compute π from that.



Exercise 3

Code this.

How many samples does it take to get $2, 3, 4, \ldots$ digits accuracy?

14. Volume of ball

The surface and volume of an n-dimensional ball satisfy the recurrences:

$$V_n = S_{n-1}/n; \quad S_n = 2\pi V_{n-1} \qquad \text{where } V_0 = 1,\ V_1 = 2.$$

```
1 // rand/nball.cpp
2 realtype pi;
3 realtype surface( int d );
4 realtype volume( int d ) {
5   if (d==0) return 1;
6   else if (d==1) return 2;
7   else
8     return surface(d-1)/d;
9 };
10 realtype surface( int d ) {
11   if (d==0) return 2;
12   else
13     return 2 * pi * volume(d-1);
14 };
```

Exercise 4

Compute the volume V_n by generating random n-dimensional coordinates, and counting wether they are in the unit ball.