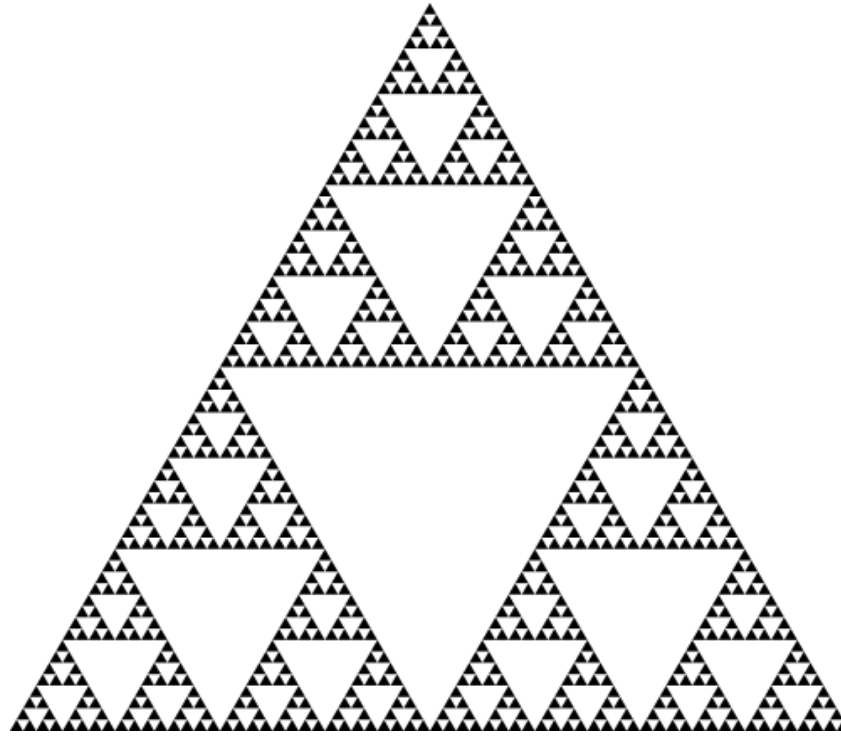


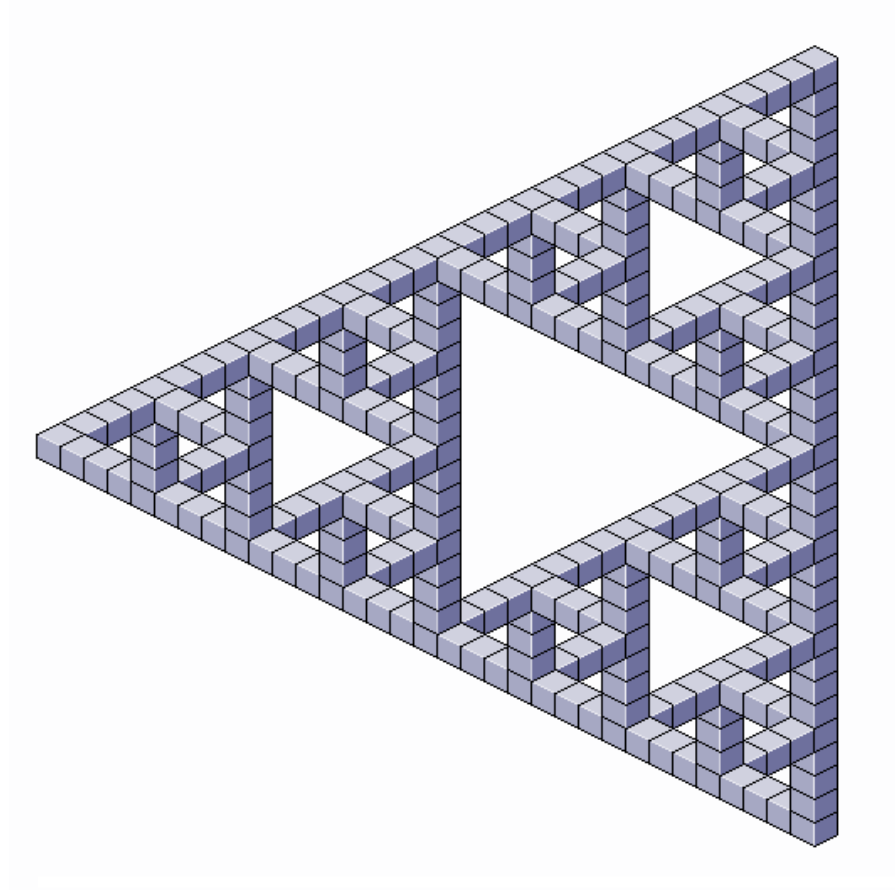
# Computer Graphics

## *Procedural Methods - Noise & Terrain*

Mark Pauly

Geometric Computing Laboratory





*source*

# Procedural Techniques

- Algorithms, functions, code segments that generate computer graphics objects
  - textures
  - geometry
  - reflection models
  - motion
  - etc.
- Program code vs. data

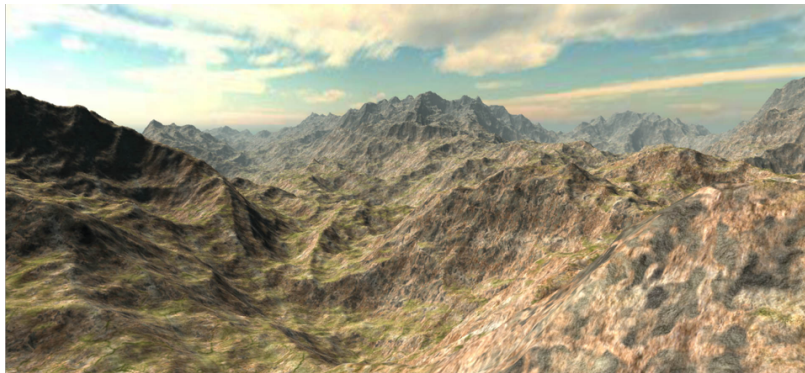
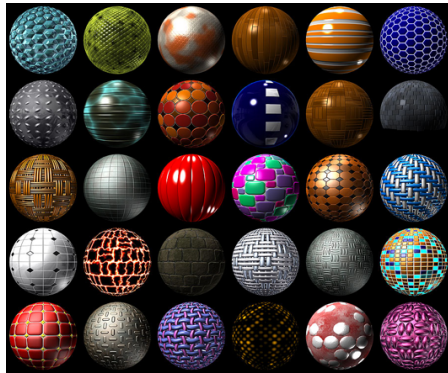


# Procedural Techniques

- Why?
  - abstraction
  - automatic generation
  - compact representations
  - infinite detail
  - parametric control
  - flexibility
- Particularly suitable for models resulting from processes that are repeating, self-similar, or random

# Procedural Techniques

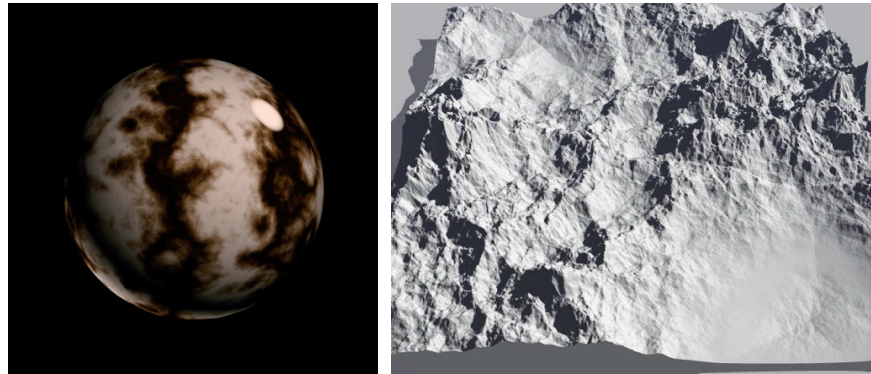
- Ubiquitous in graphics
  - texturing, modeling, animation, etc.



# Overview

- Today:

- noise functions
- texture & terrain synthesis

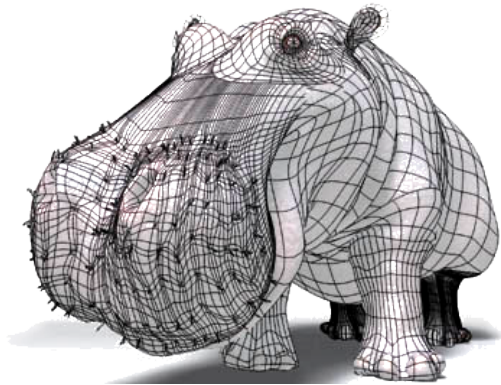


- Later:

- procedural modeling with L-Systems
- basic plant modeling

# Materials & Texture

- Recall: textures add visual detail without raising geometric complexity



*Geometry*



*+Lighting*



*+Texture*

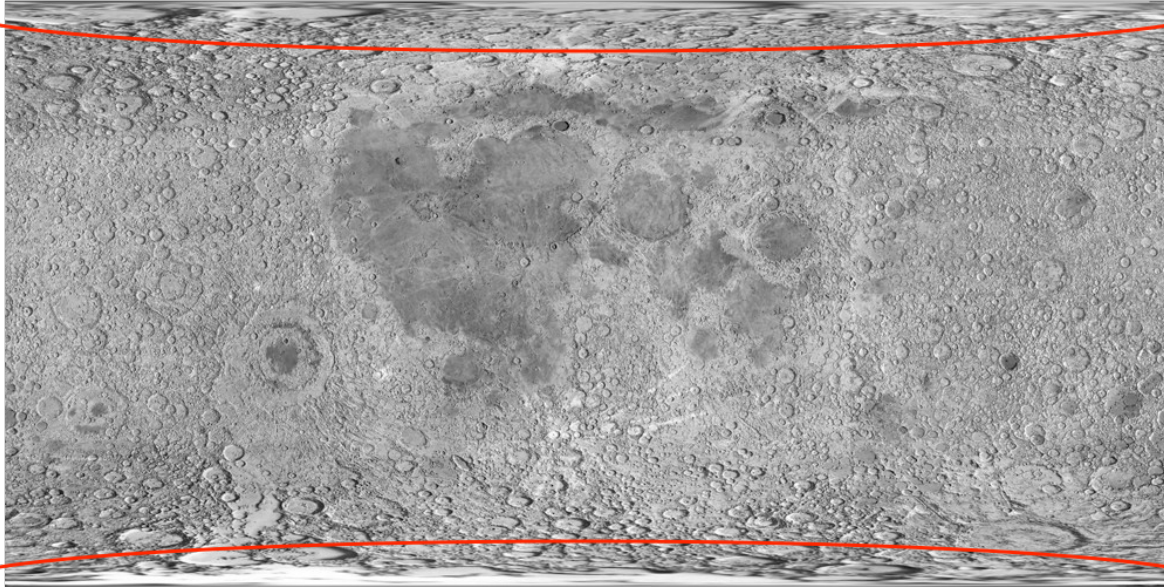
Images from <http://www.3drender.com/jbirm/productions.html>

# Materials & Texture

- Control much more than just colors:
  - reflectance (diffuse + specular colors/coefficients)
  - normal vector (normal mapping, bump mapping)
  - geometry (displacement mapping)
  - opacity (alpha mapping)
  - reflection/illumination (environment mapping)
  - ...

# Solid Textures

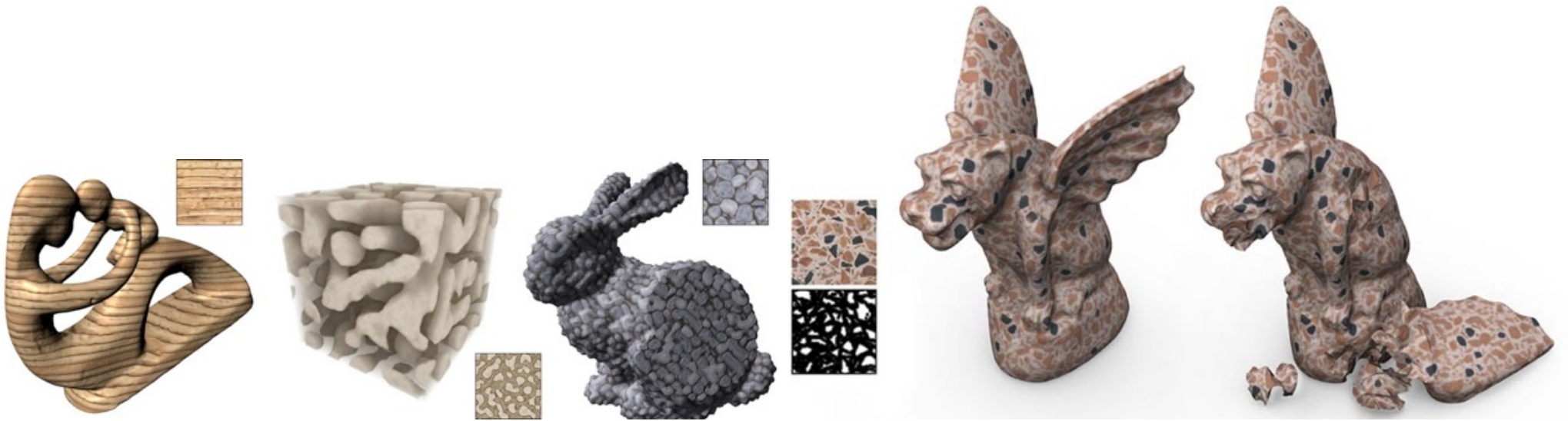
- Often it's better to attach 3D, volumetric textures
  - Avoid surface texture distortion due to parametrization



- Assign consistent material inside the object too (e.g., for fracture)



# Solid Textures



# How Do We Acquire Textures?

- Photograph/scan materials
- Manually paint
- Download online
- ...



# Material Acquisition via Scanning

- More difficult than just taking a picture
  - Must factor out lighting effects
  - Post-process to extract normal maps, ensure tiling, etc.
- Limited by scanner size



# More Problems with Acquired Textures

- Physical extent limited by storage size
  - Particularly problematic for solid textures...
- Repeating to fill more space causes visible artifacts:

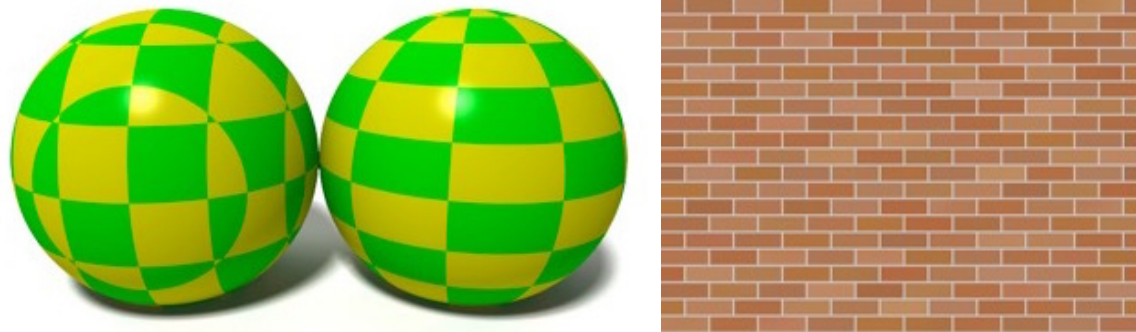


# Procedural Approach

- Instead of using image data, define the texture with code.
  - Simple example:

$$\text{color} = \text{vec3}(0.5 * \sin(x) + 0.5)$$

- Trivial extension to solid textures...
- Easily create repetitive patterns:



# Procedural Approach

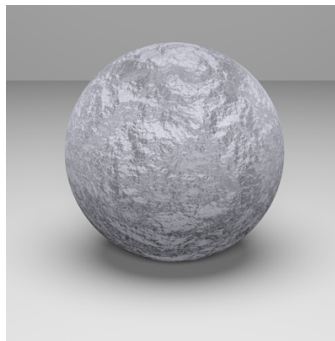
- Instead of using image data, define the texture with code.

- Simple example:

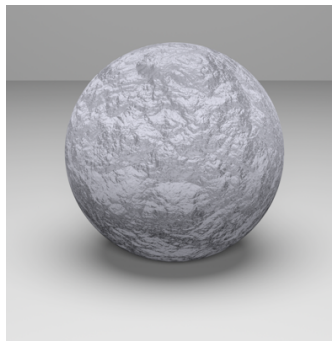
$$\text{color} = \text{vec3}(0.5 * \sin(x) + 0.5)$$

- Trivial extension to solid textures...

- Easily create repetitive patterns
- We'll see how to create patterns with structured randomness:



*fBm*



*turbulence*

# Procedural Approach

- Why?
  - automatic generation on the fly
  - compact representations
  - infinite detail
  - unlimited extent
  - parametric control
- Particularly suitable for models resulting from processes that are repeating, self-similar, or random
- Challenges: artistic control, debugging, efficiency



# Procedural Synthesis Examples



*Created using Terragen*



# Procedural Synthesis Examples



*Created using Terragen*

# Procedural Synthesis Examples



*Created using MojoWorld Generator*





# Procedural Synthesis Examples



*Created using Vue Infinite*

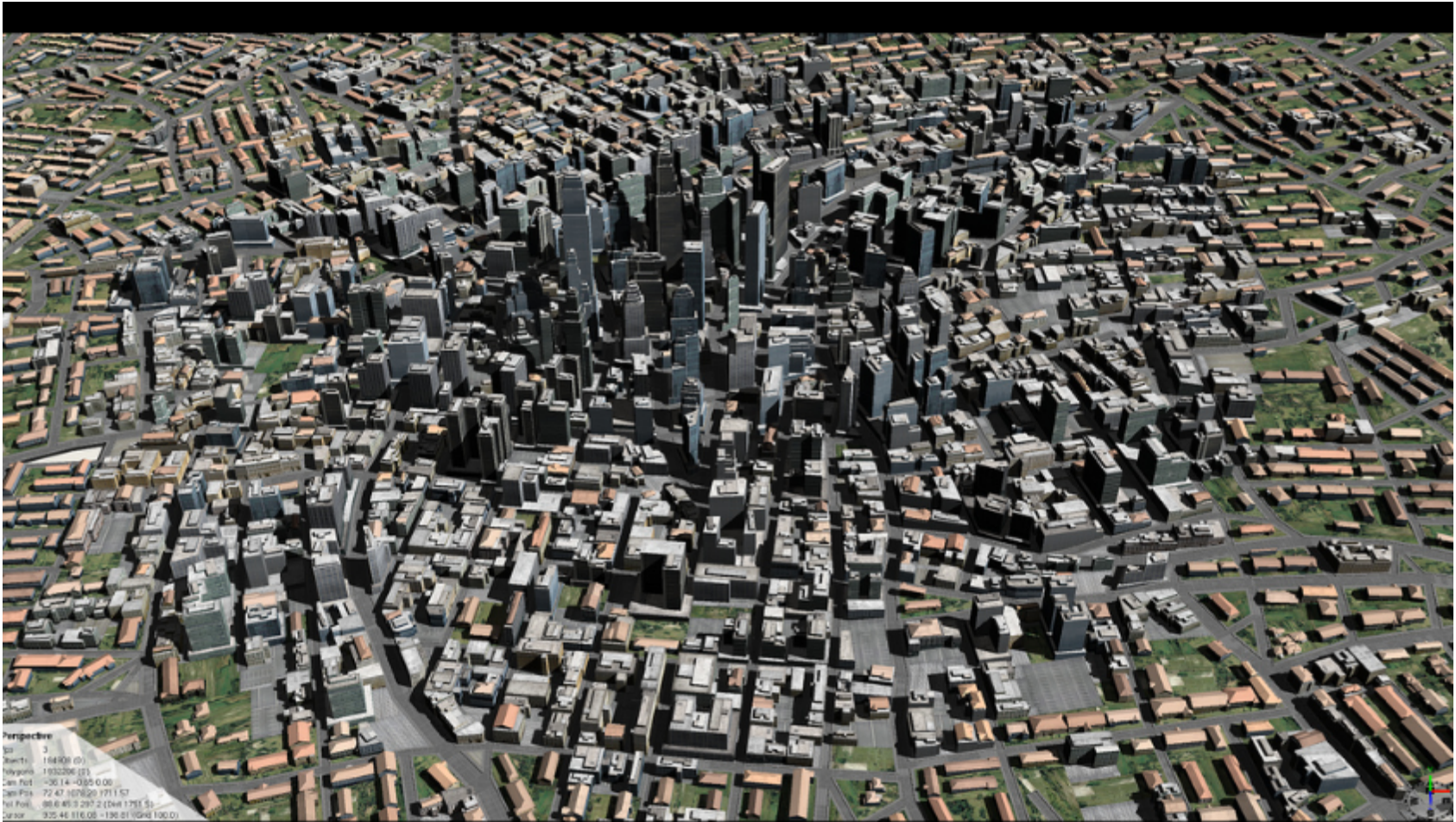
# Procedural Synthesis Examples



*Created using Vue Infinite*



# Procedural Synthesis Examples



*Created using Esri CityEngine*

# How to Model a Mountain Terrain?

- Simulate the complex physical process that created it?
- Mimic its qualitative features?

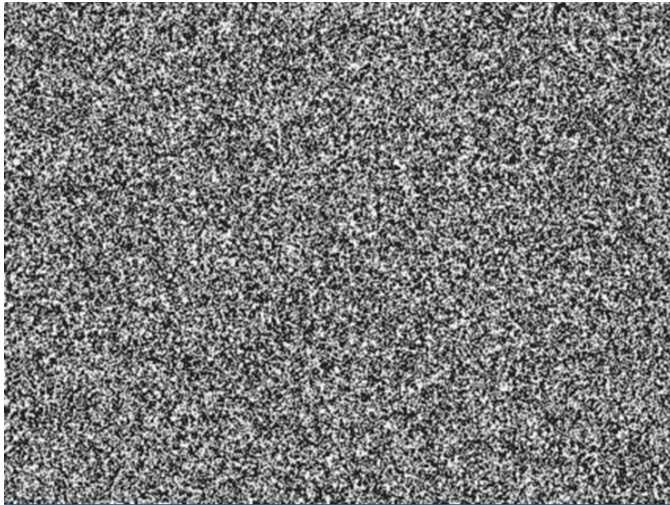


*wikipedia*

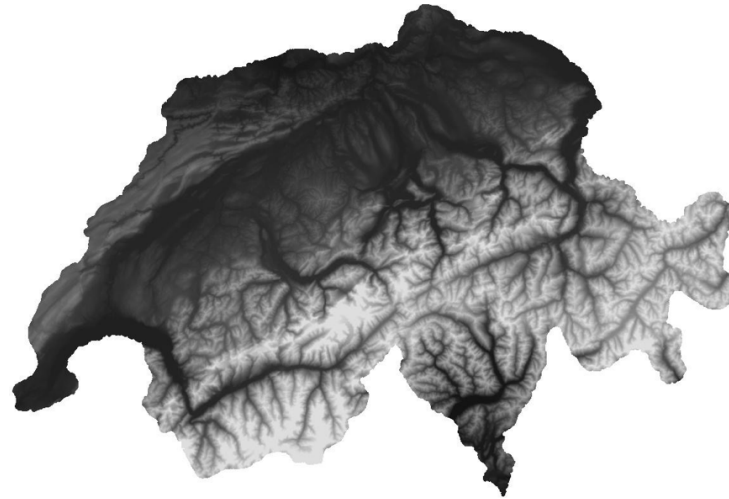


# Randomness

- Computers are good at faking randomness
- But randomness alone isn't what we want



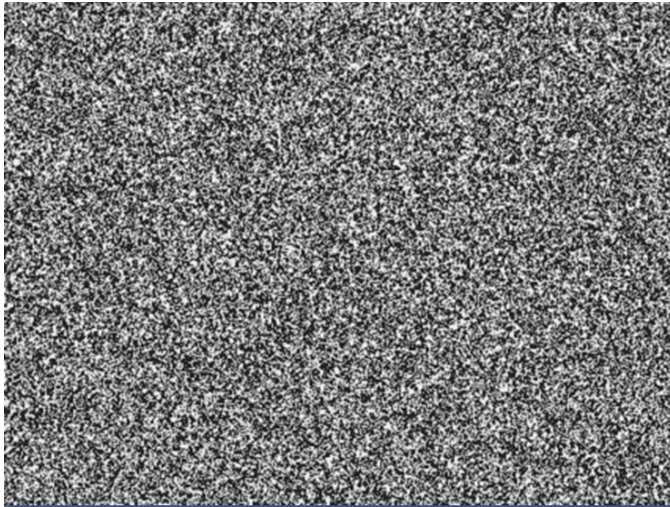
*white noise*



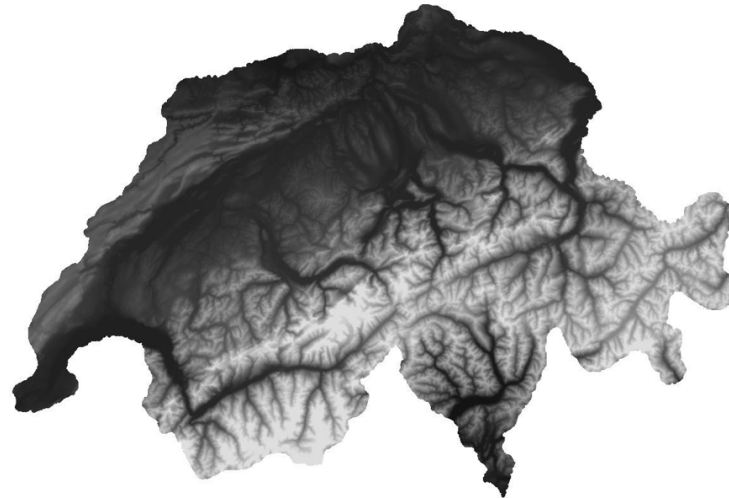
*more natural pattern*

# Problems with Pure Randomness

- Neighboring samples are uncorrelated
  - Natural phenomena lead to more structure
- Get a different result every time
  - When an artist finishes setting up a scene, they don't want it to change.



*white noise*



*more natural pattern*

# Noise Functions

- Function  $\mathbb{R}^n \rightarrow [-1, 1]$ , where  $n = 1, 2, 3 \dots$
- Desirable properties
  - No obvious repetition
  - Rotation invariance
  - band-limited
    - frequencies stay finite
    - more structure than white noise
  - efficient to compute
  - reproducible
- Fundamental “primitive” or building block of most procedural synthesis approaches



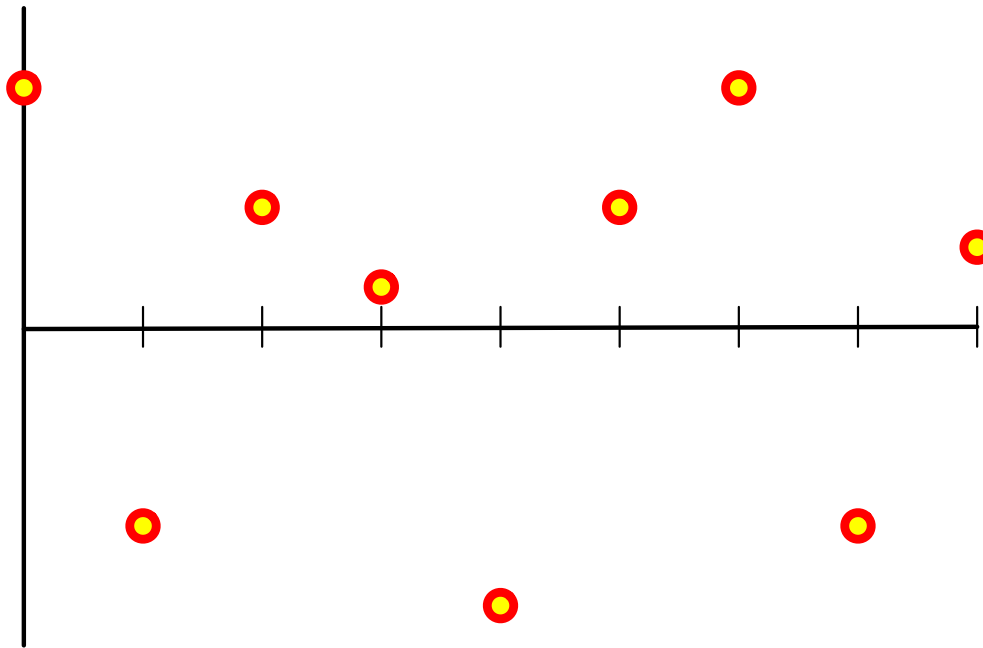
# Noise Functions

- Simple example: value noise
  - Generate random value on the grid points of an integer lattice
  - Interpolate these values throughout the grid



# Noise Functions

- Simple example: value noise
  - Generate random value on the grid points of an integer lattice
  - Interpolate these values throughout the grid

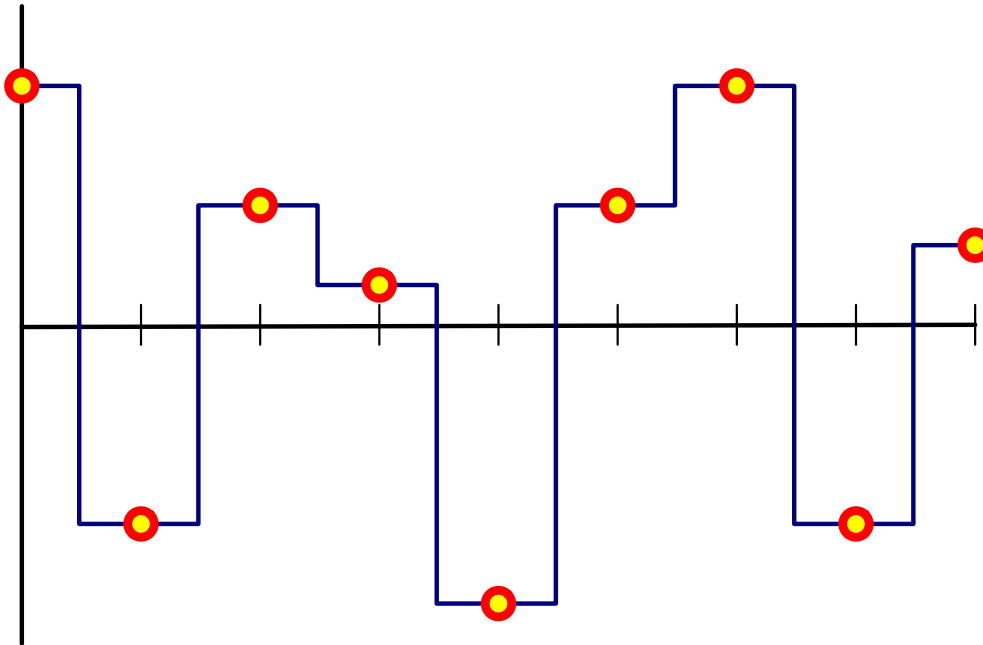


*random values on the grid*

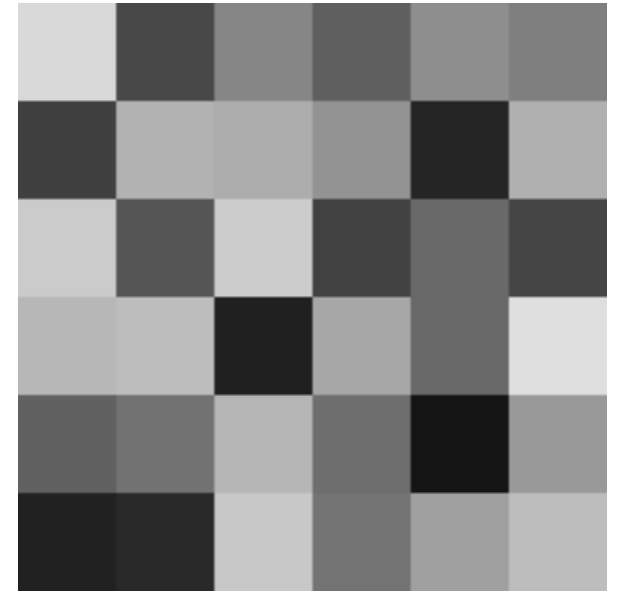
# Noise Functions

- Simple example: value noise

- Generate random value on the grid points of an integer lattice
- Interpolate these values throughout the grid

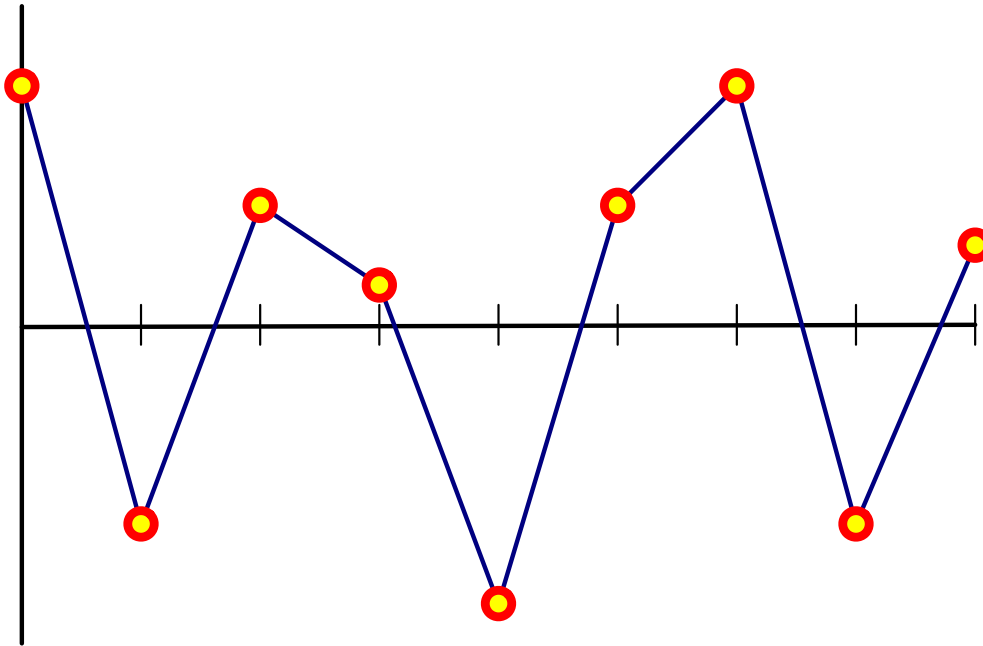


*piecewise constant interpolation (nearest)*

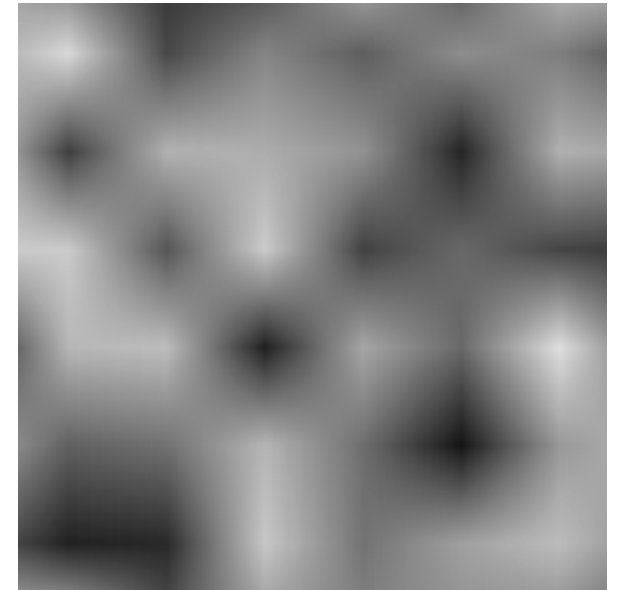


# Noise Functions

- Simple example: value noise
  - Generate random value on the grid points of an integer lattice
  - Interpolate these values throughout the grid



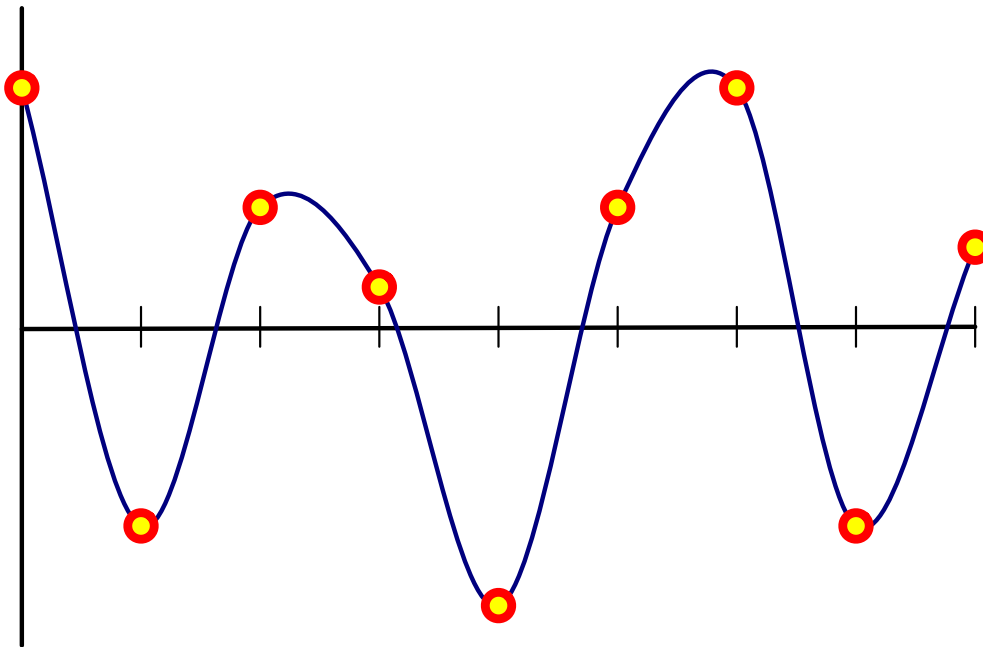
*piecewise (bi-, tri-)linear interpolation*



# Noise Functions

- Simple example: value noise

- Generate random value on the grid points of an integer lattice
- Interpolate these values throughout the grid



*piecewise cubic interpolation*

highest frequency is limited by the lattice resolution!



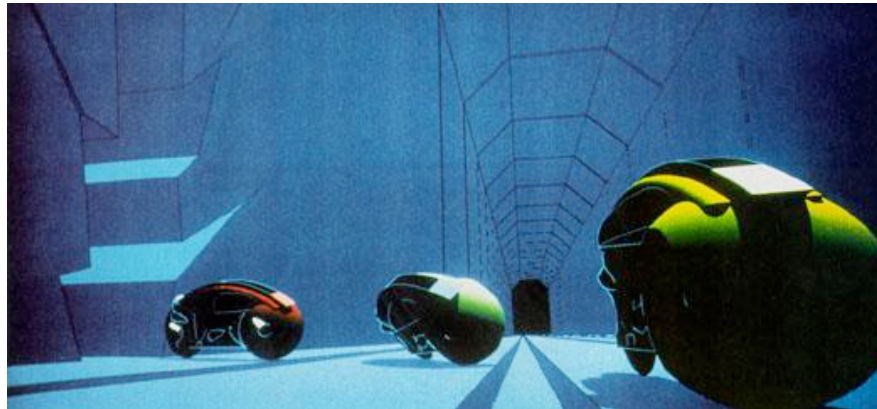


# Value Noise Issues

1. Cubic looks best (most organic), but it is expensive
  - Linear interpolation combines the  $2^n$  nearest lattice values
  - Cubic interpolation combines the  $4^n$  nearest lattice values...
2. Repeatability
  - New random numbers every time you regenerate the values!
3. Memory use
  - Cannot store an infinite number of random grid values
- Solution to 2 & 3:
  - Pre-compute a table of ~512 random values
  - Use a hash function to map lattice locations to table indices

# Perlin Noise

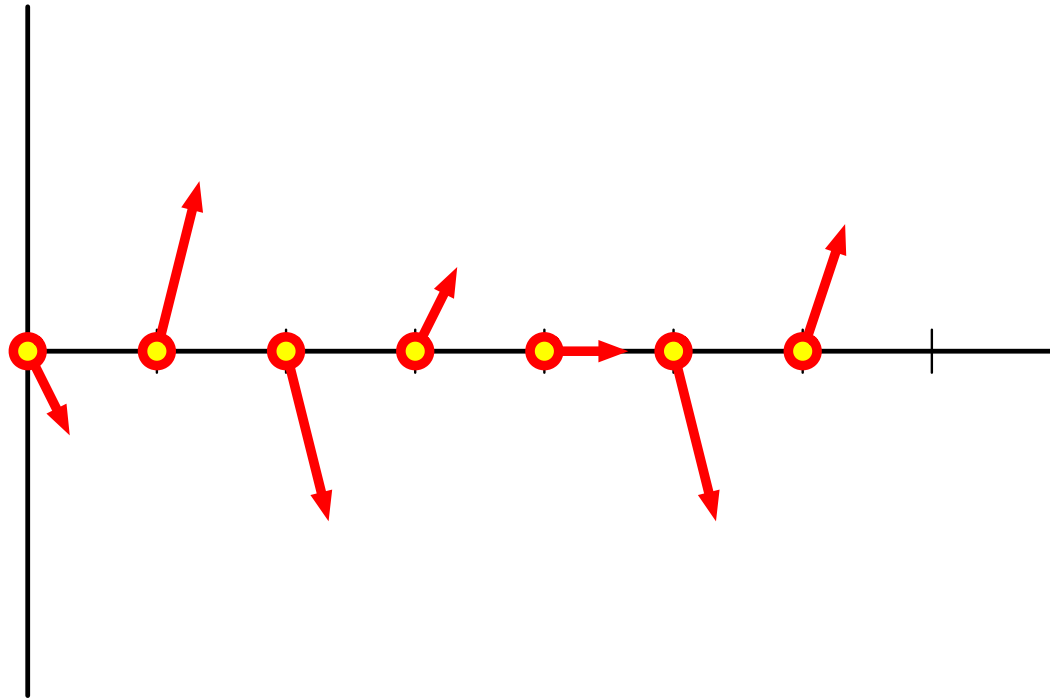
- Invented by Ken Perlin in 1982
  - First used in the movie Tron
- Also called gradient noise





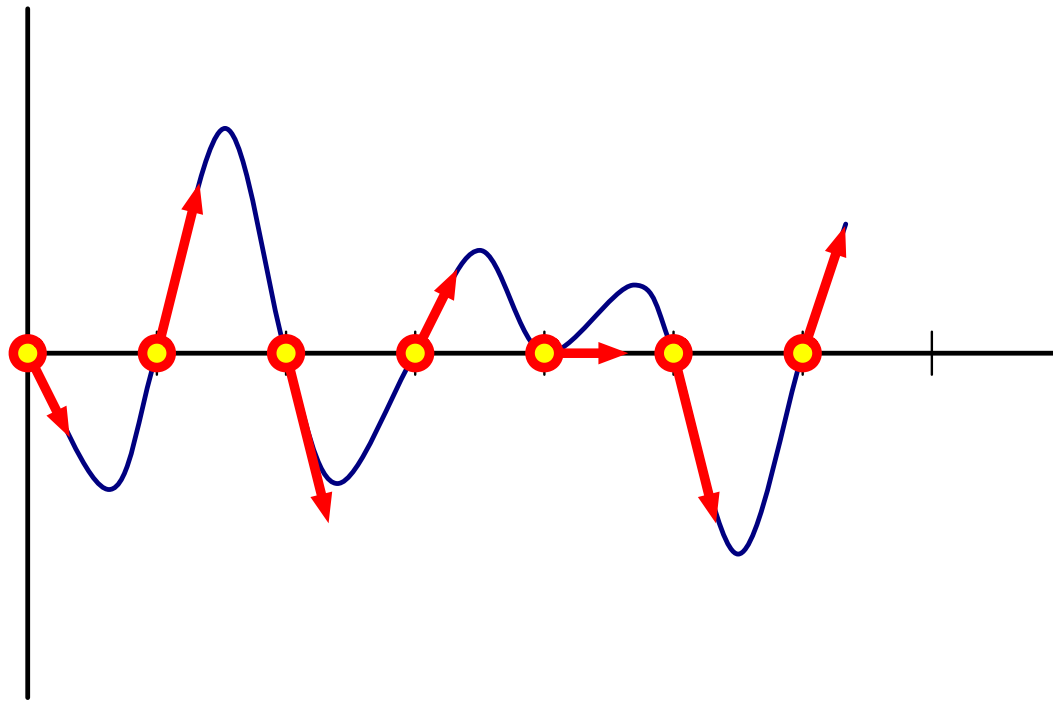
# Classic Perlin Noise (1980s)

- Generate random *gradients* on the grid:

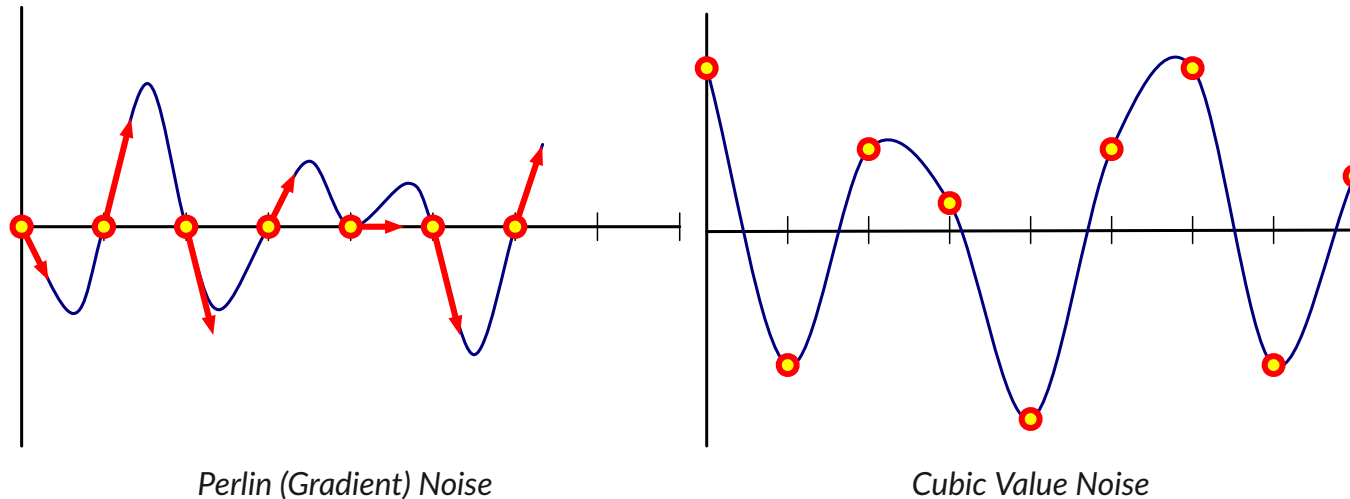


# Classic Perlin Noise (1980s)

- Interpolate these gradients with Hermite interpolation



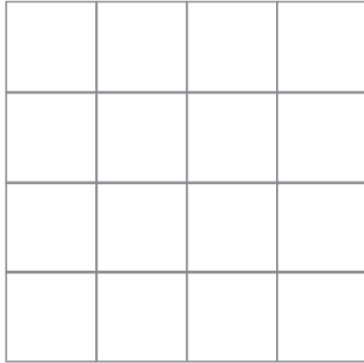
# Perlin Noise vs Cubic Value Noise



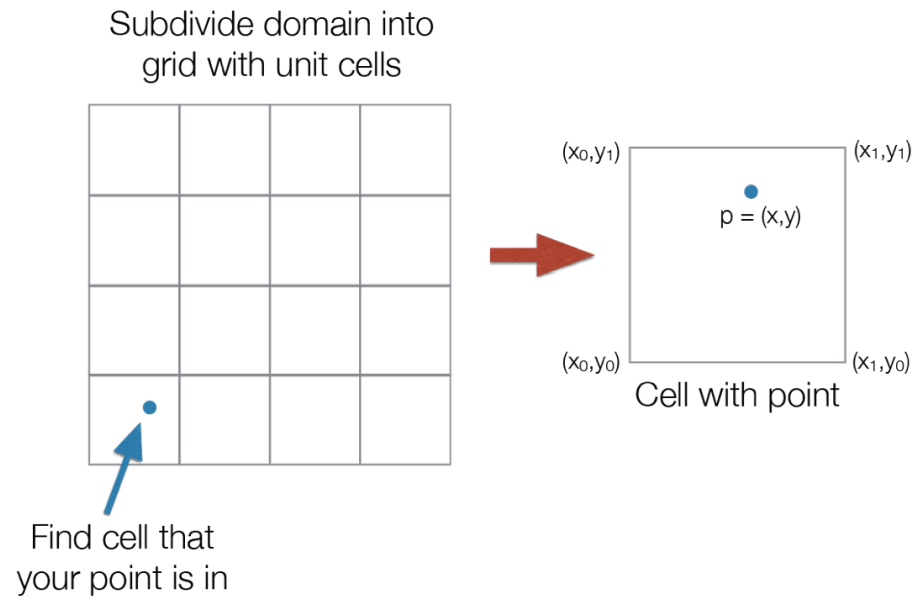
- Advantage of Perlin Noise: efficiency
  - Get cubic interpolation with only  $2^n$  nearest gradients, not  $4^n$  values
- Potential downside
  - Value at grid location are always zero
  - To overcome this, can combine gradient and value noise: generate gradient and value sample for each lattice point and use Hermite interpolation.

# 2D Perlin Noise Example

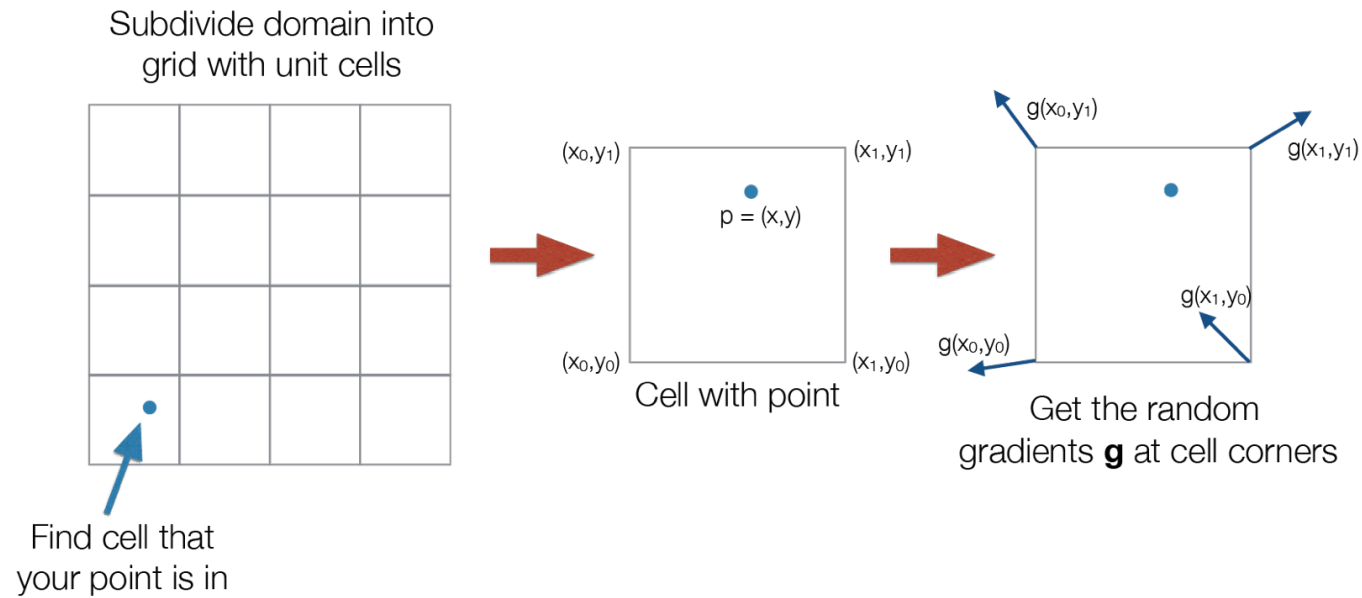
Subdivide domain into  
grid with unit cells



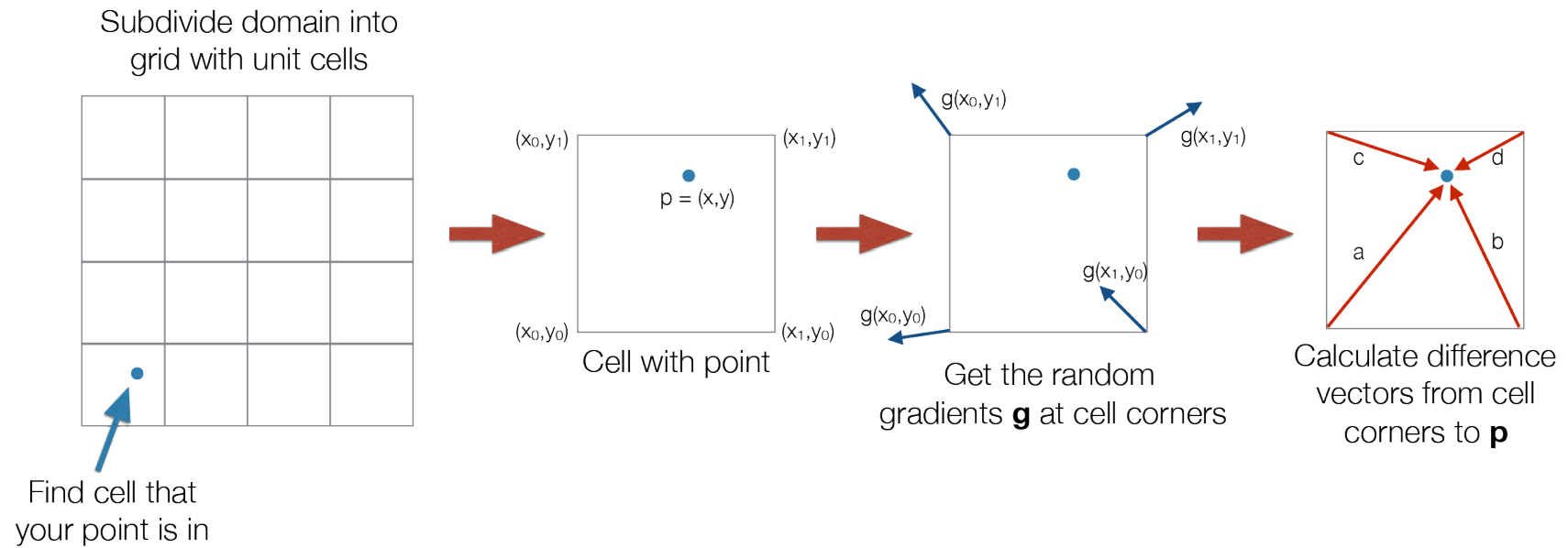
# 2D Perlin Noise Example



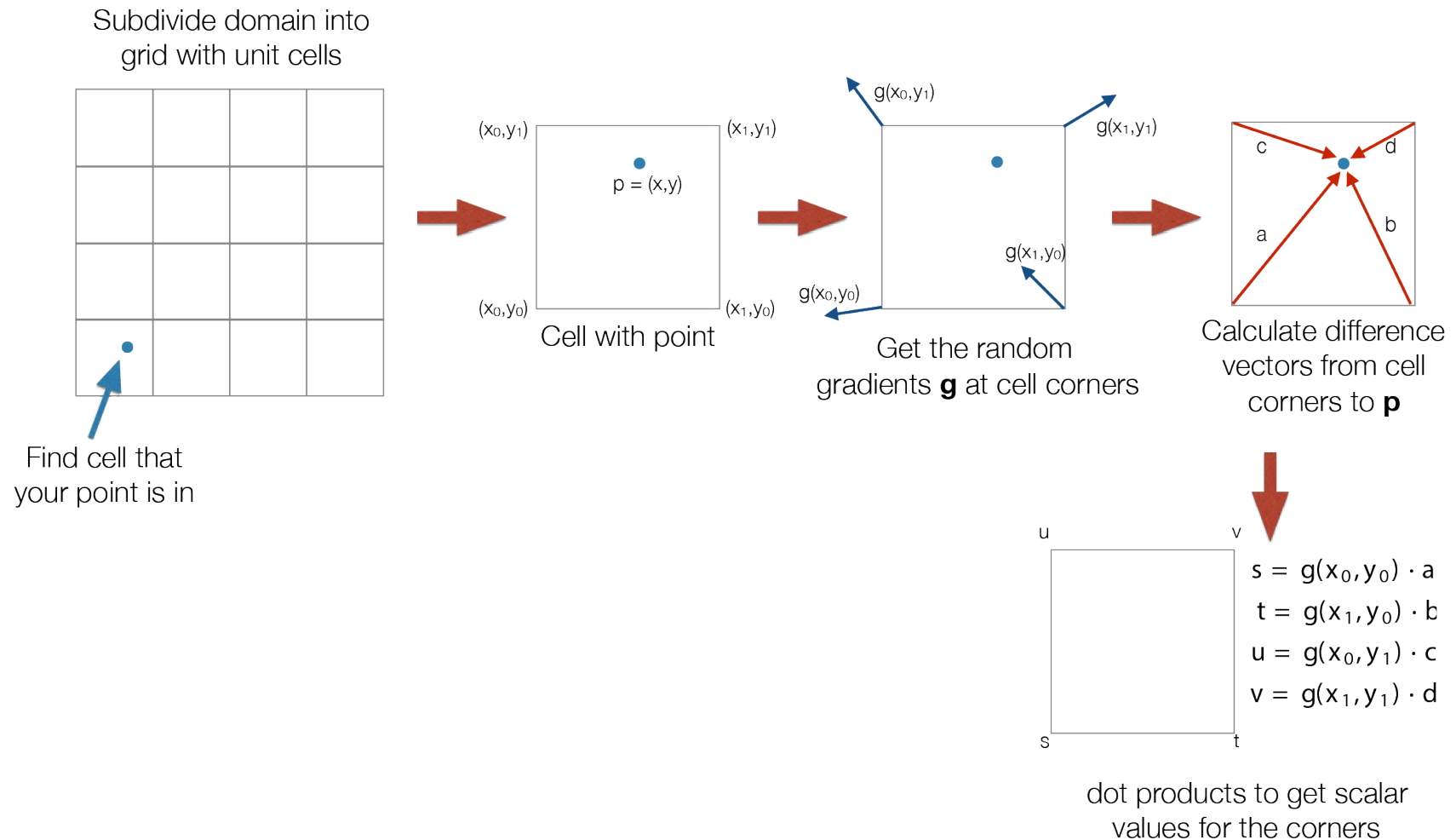
# 2D Perlin Noise Example



# 2D Perlin Noise Example

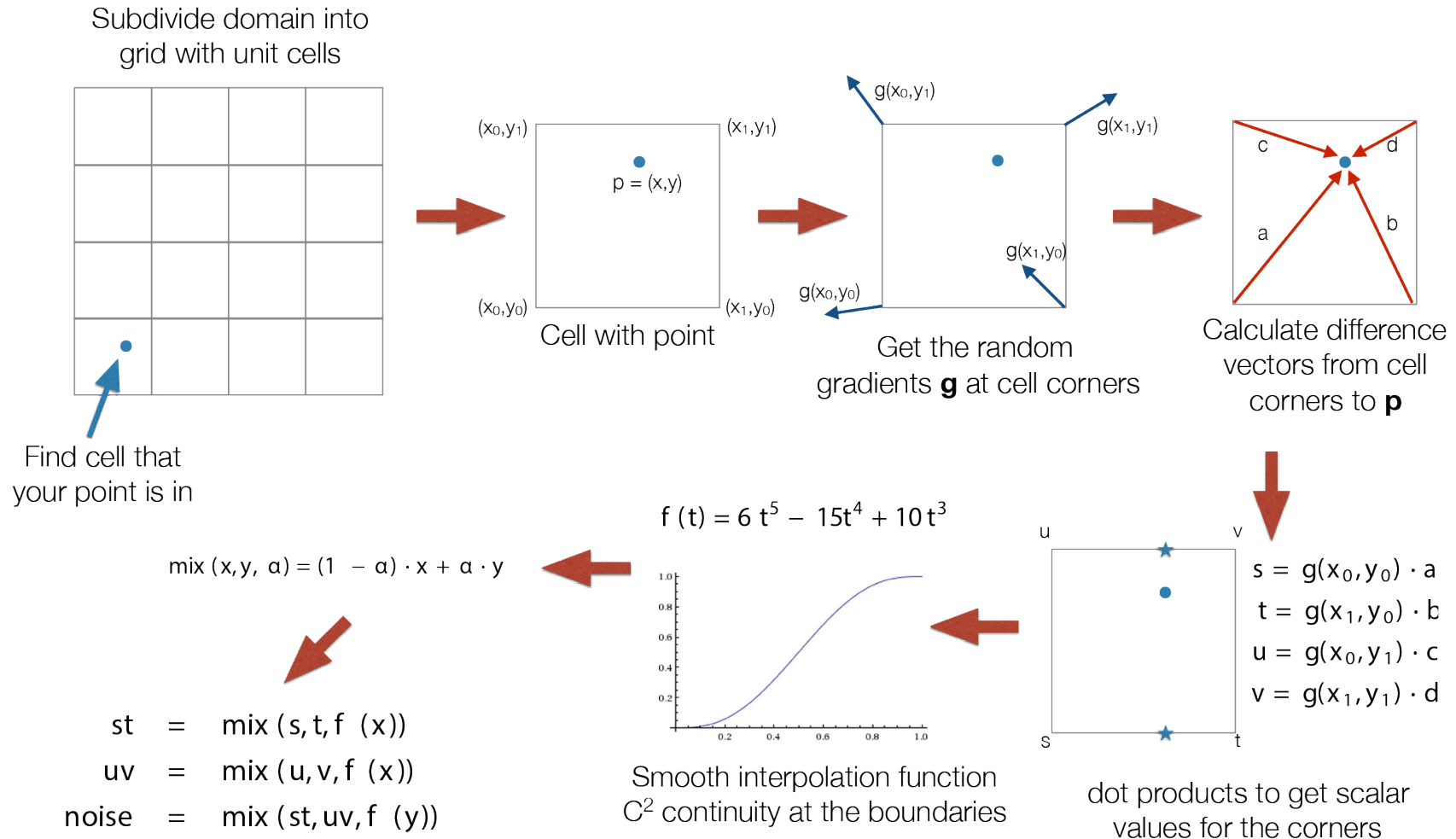


# 2D Perlin Noise Example





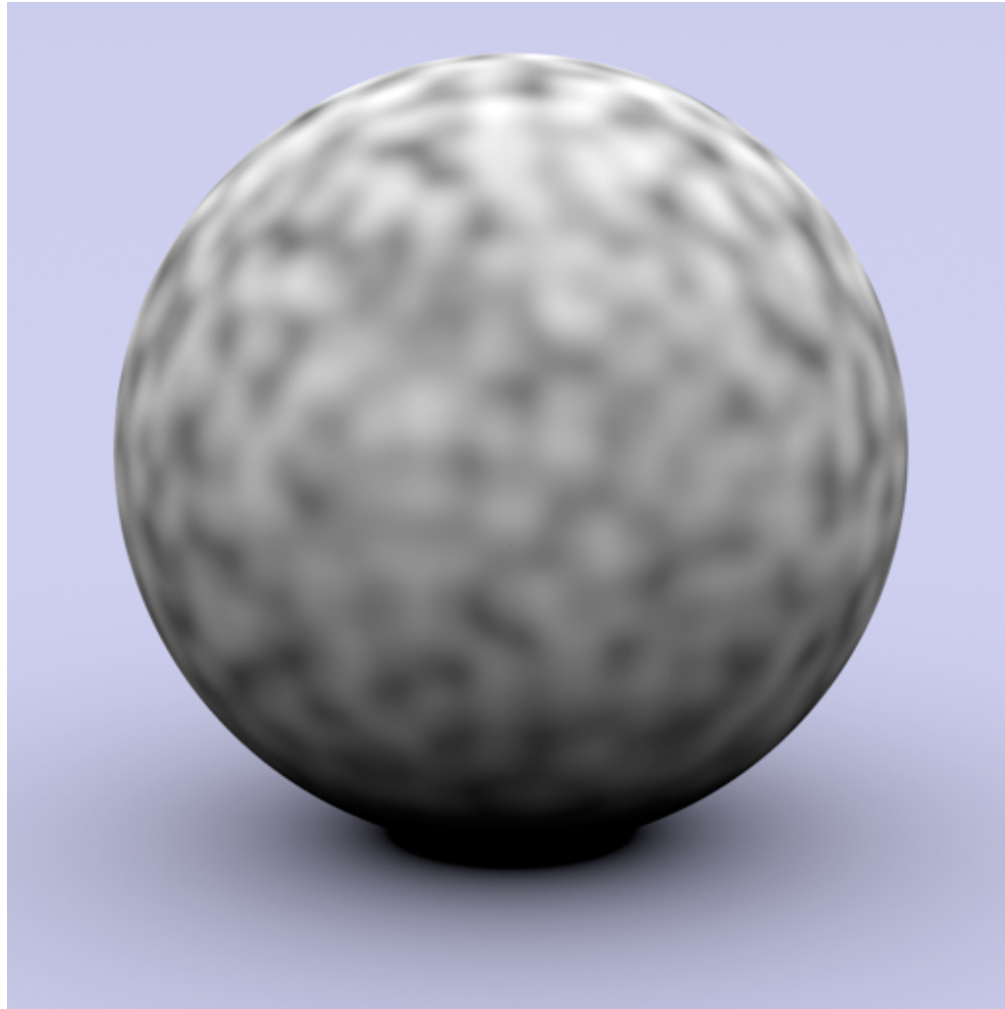
# 2D Perlin Noise Example



# 2D Perlin Noise

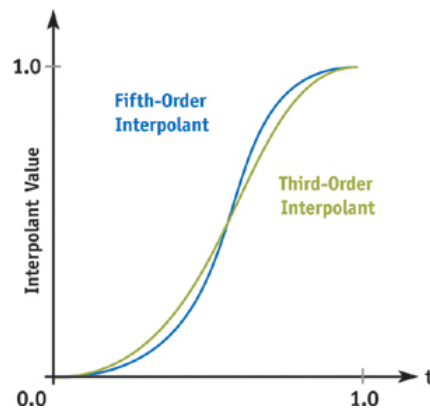


# 3D Perlin Noise



# Classic vs. Improved Perlin Noise

- Short 2002 paper improving efficiency/visual quality
- New version:
  - Randomly chose from only 12 pre-defined gradient vectors, (Human vision is sensitive to statistical orientation anomalies, but not the orientation granularity)
  - Interpolate the corners' linear functions with  $6t^5 - 15t^4 + 10t^3$  instead of  $3t^2 - 2t^3$  (avoid discontinuities in second derivative)



# Improved Perlin Noise Implementation

```
// JAVA REFERENCE IMPLEMENTATION OF IMPROVED NOISE - COPYRIGHT 2002 KEN PERLIN.
```

```
public final class ImprovedNoise {
    static public double noise(double x, double y, double z) {
        int X = (int)Math.floor(x) & 255,          // FIND UNIT CUBE THAT
        Y = (int)Math.floor(y) & 255,              // CONTAINS POINT.
        Z = (int)Math.floor(z) & 255;
        x -= Math.floor(x);                          // FIND RELATIVE X,Y,Z
        y -= Math.floor(y);                          // OF POINT IN CUBE.
        z -= Math.floor(z);
        double u = fade(x),                          // COMPUTE FADE CURVES
        v = fade(y),                                  // FOR EACH OF X,Y,Z.
        w = fade(z);
        int A = p[X ]+Y, AA_ = p[A]+Z, AB_ = p[A+1]+Z,      // HASH COORDINATES OF
        B = p[X+1]+Y, BA_ = p[B]+Z, BB_ = p[B+1]+Z;          // THE 8 CUBE CORNERS,

        return lerp(w, lerp(v, lerp(u, grad(p[AA_ ], x , y , z ), // AND ADD
            grad(p[BA_ ], x-1, y , z )), // BLENDED
            lerp(u, grad(p[AB_ ], x , y-1, z ), // RESULTS
            grad(p[BB_ ], x-1, y-1, z )), // FROM 8
            lerp(v, lerp(u, grad(p[AA_+1], x , y , z-1 ), // CORNERS
            grad(p[BA_+1], x-1, y , z-1 )), // OF CUBE
            lerp(u, grad(p[AB_+1], x , y-1, z-1 ),
            grad(p[BB_+1], x-1, y-1, z-1 ))));
    }
    static double fade(double t) { return t * t * t * (t * (t * 6 - 15) + 10); }
    static double lerp(double t, double a, double b) { return a + t * (b - a); }
    static double grad(int hash, double x, double y, double z) {
        int h = hash & 15;                      // CONVERT LO 4 BITS OF HASH CODE_
        double u = h<8 ? x : y,                  // INTO 12 GRADIENT DIRECTIONS.
        v = h<4 ? y : h==12 || h==14 ? x : z;
        return ((h&1) == 0 ? u : -u) + ((h&2) == 0 ? v : -v);
    }
    static final int p[] = new int[512], permutation[] = { 151,160,137,91,90,15,131,13,201,95,96,53,194,233,7,225,140,36,103,30,69,142,8,99,37,240,21,10,23,
190, 6,148,247,120,234,75,0,26,197,62,94,252,219,203,117,35,11,32,57,177,33,88,237,149,56,87,174,20,125,136,171,168, 68,175,74,165,71,134,139,48,27,166,77,146,158,231,83,111,229,122,60,211,133,230,220,105,9
102,143,54, 65,25,63,161, 1,216,80,73,209,76,132,187,208, 89,18,169,200,196,135,130,116,188,159,86,164,100,109,198,173,186, 3,64,52,217,226,250,124,123,
5,202,38,147,118,126,255,82,85,212,207,206,59,227,47,16,58,17,182,189,28,42,223,183,170,213,119,248,152, 2,44,154,163, 70,221,153,101,155,167, 43,172,9,
```

# Perlin Noise

- Parameters
  - Change amplitude: e.g.  $10 * \text{noise}(x)$
  - Change frequency: e.g.  $\text{noise}(10 * x)$
- Many other possible ways to implement a basic noise function
  - Simplex noise (use triangles/tetrahedra instead of voxel grid)
  - Sparse Gabor convolution
  - etc.

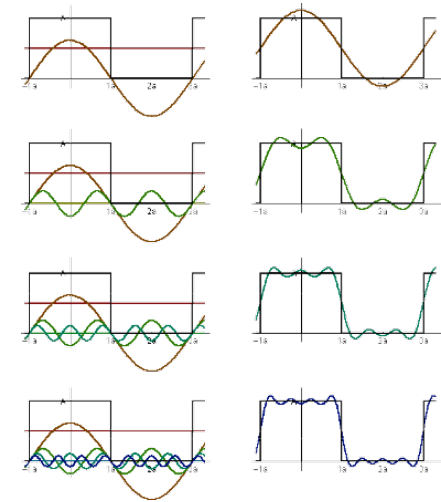
# Spectral Synthesis

- Building a complex function  $f_s(x)$  by summing weighted contributions from a scaled primitive function  $f(x)$

$$f_s(x) = \sum_i w_i f(s_i x)$$

- Weight (amplitude)  $w_i$ , frequency scaling  $s_i$
- Example: Fourier basis

$$f_s(x) = w_0 + w_1 \cos(x) + w_2 \cos(3x) + w_3 \cos(5x) + w_4 \cos(7x) + \dots$$



# Fractal Brownian Motion (fBm)

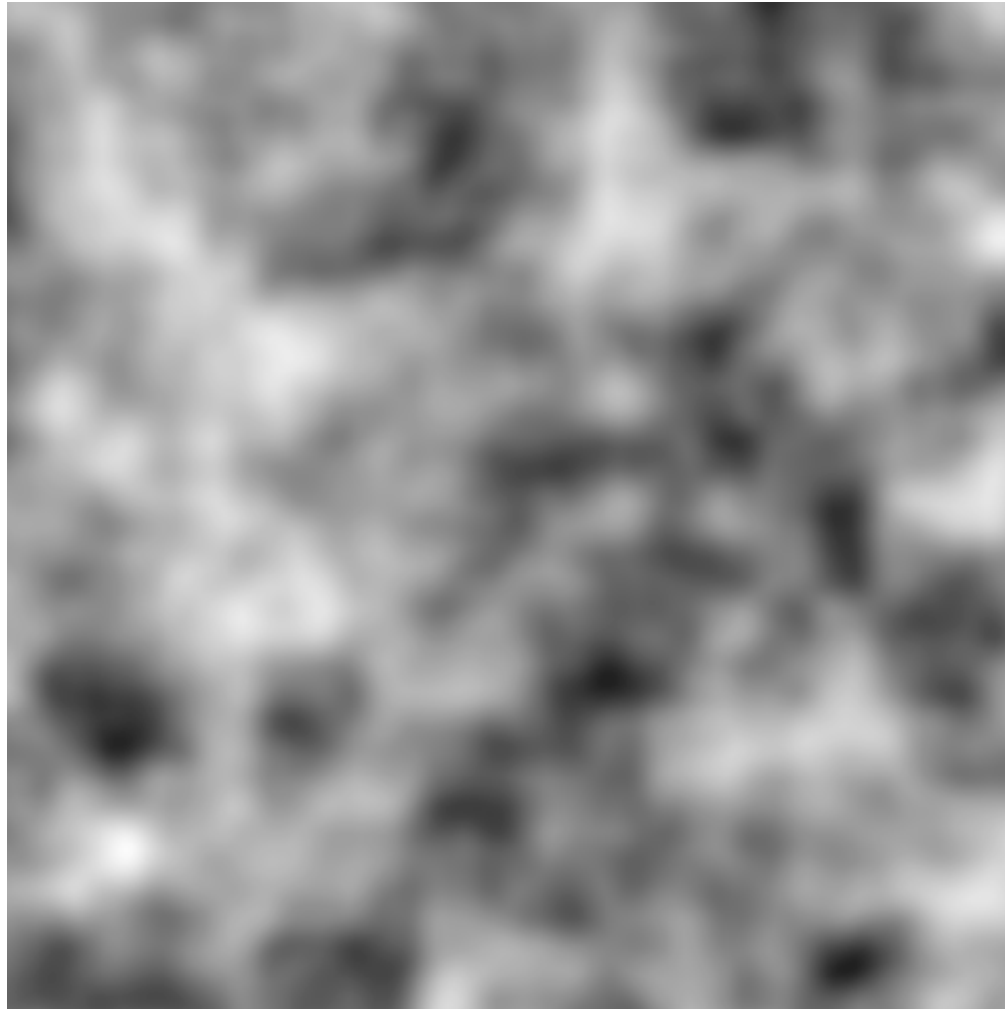
- Spectral synthesis of noise function
  - Progressively higher frequency
  - Progressively smaller amplitude
- Typically Perlin noise is used
- Each term in the summation is called an *octave*



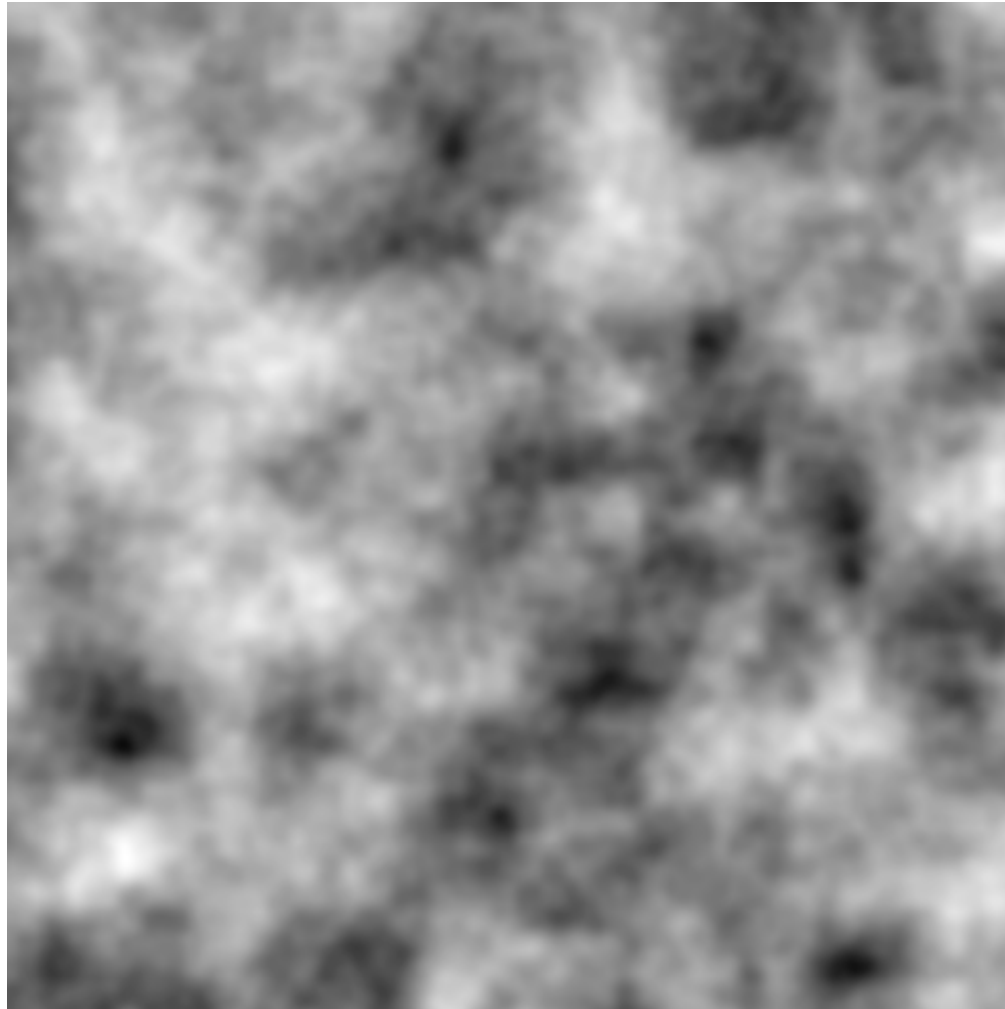
# fBm - 1 Octave



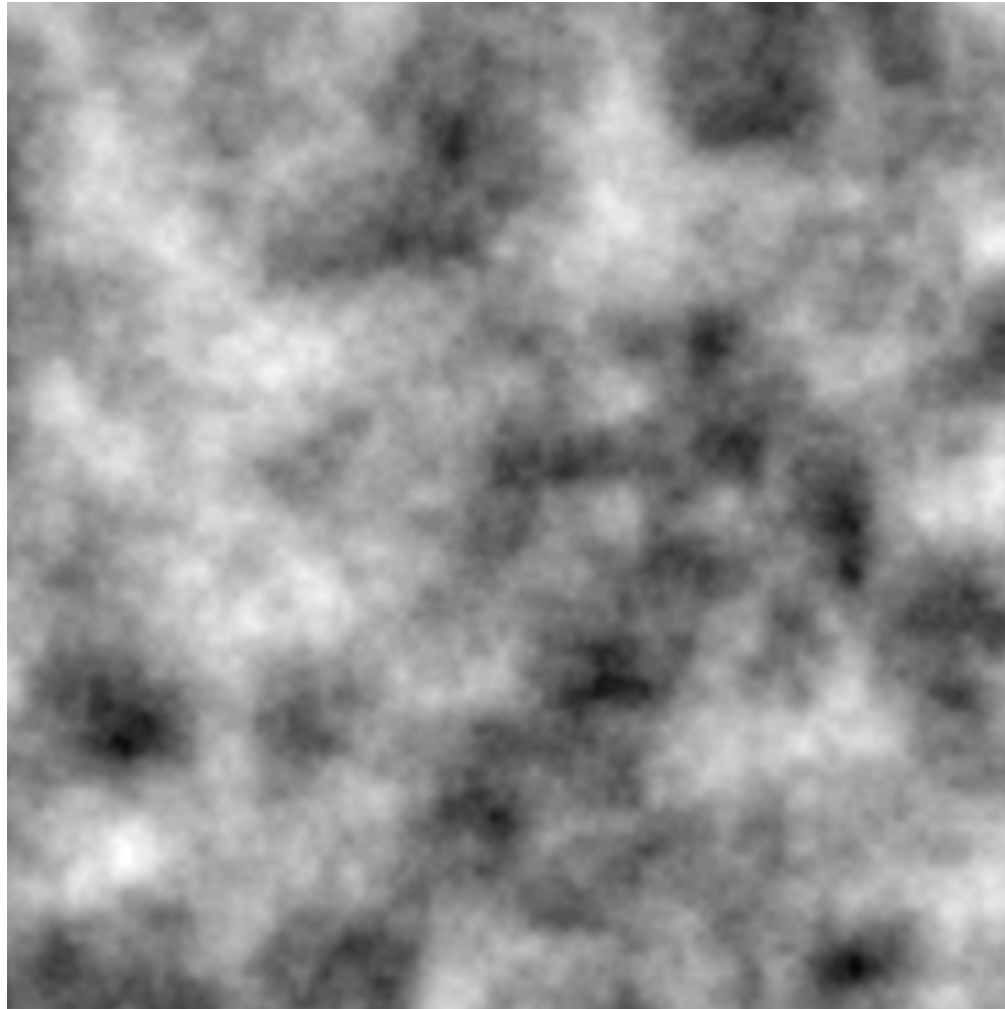
# fBm - 2 Octave



# fBm - 3 Octave

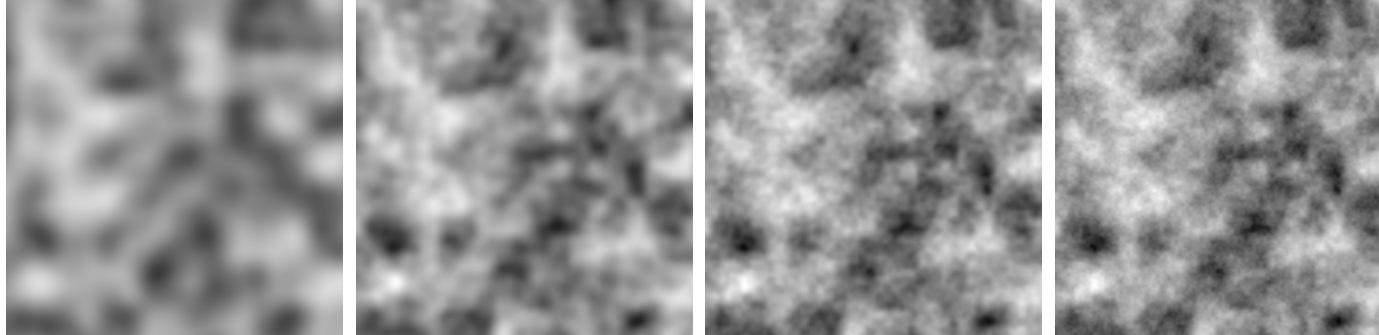


# fBm - 4 Octave



# Fractal Brownian Motion (fBm)

- Spectral synthesis of noise function
  - Progressively smaller frequency
  - Progressively smaller amplitude
- Typically Perlin noise is used
- Each term in the summation is called an *octave*
- Each octave typically doubles frequency and halves amplitude

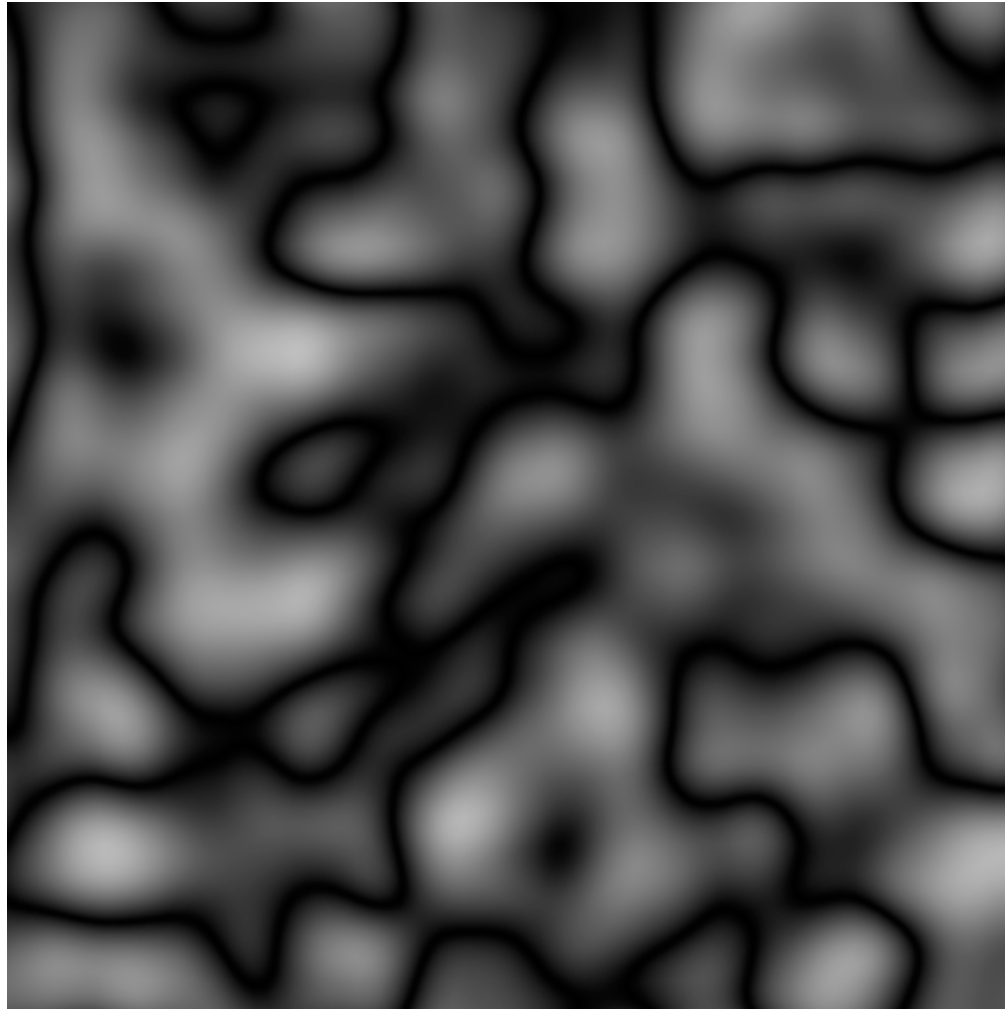


# “Turbulence”

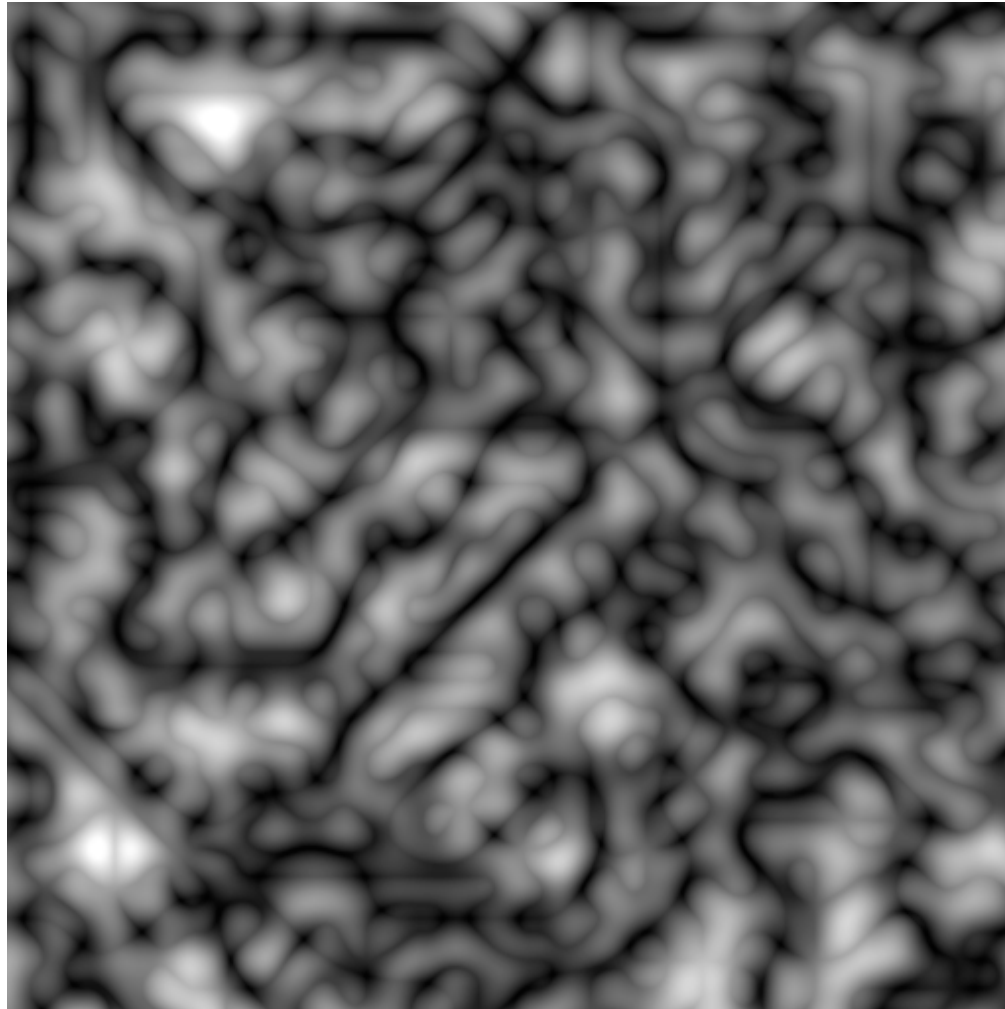
- Another common compound noise function
- Same as fBm, but sum the *absolute value* of the noise function



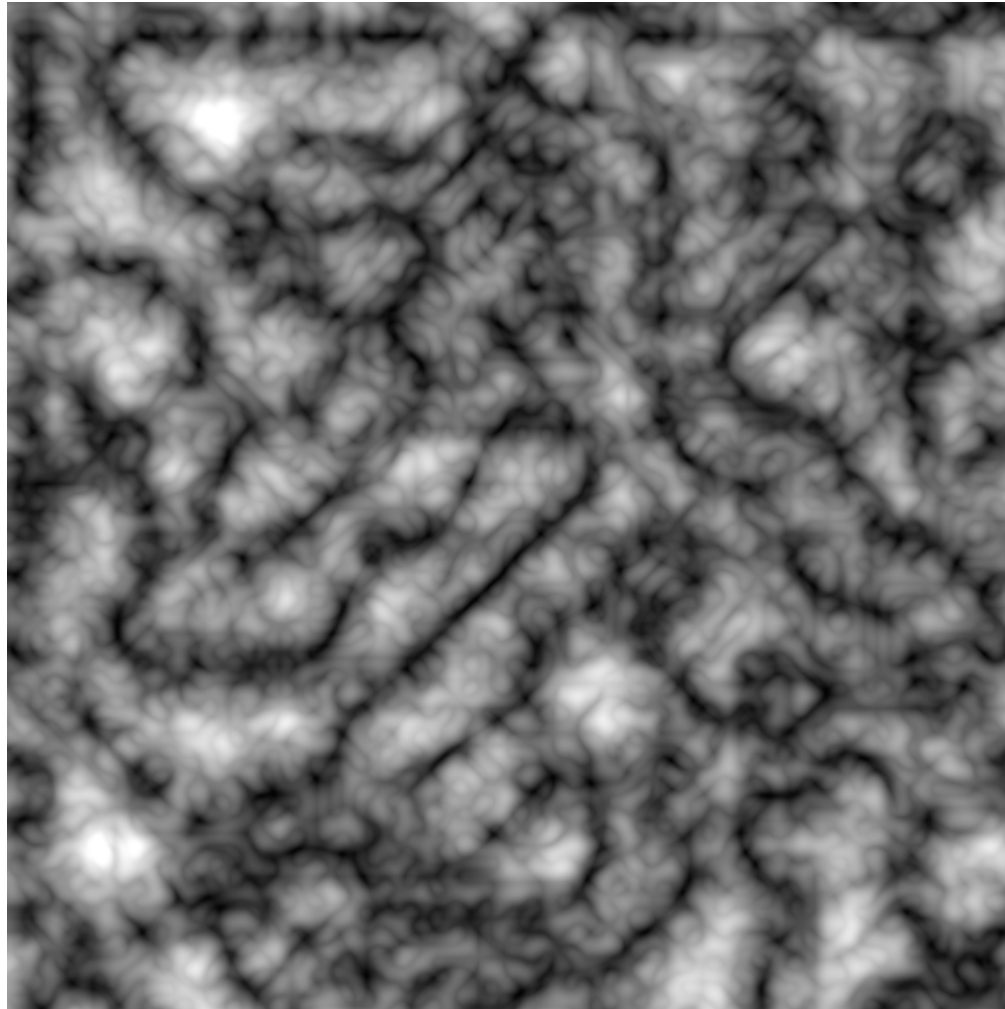
# Turbulence - 1 Octave



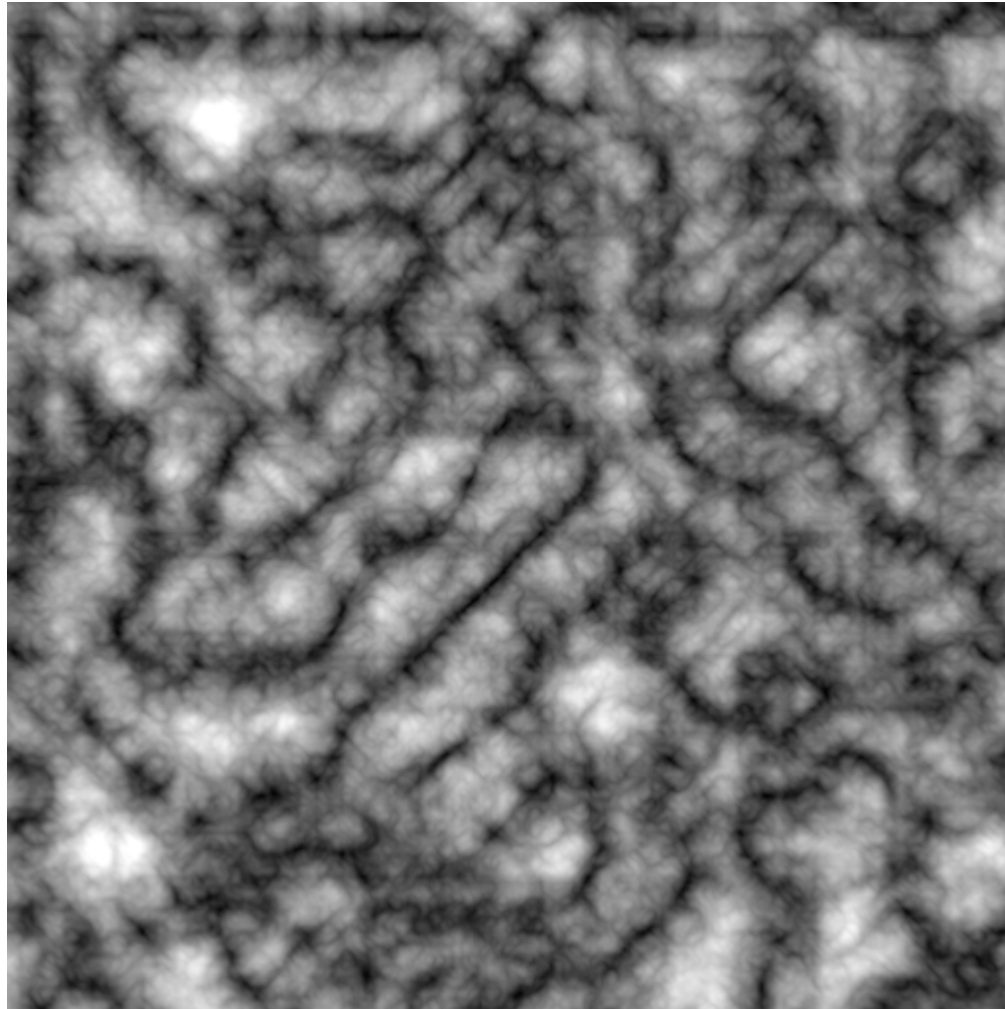
# Turbulence - 2 Octave



# Turbulence - 3 Octave

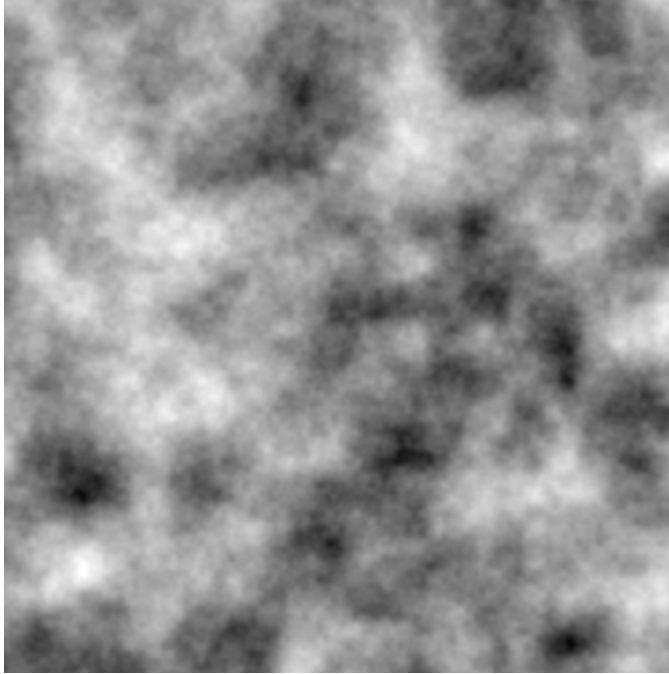


# Turbulence - 4 Octave

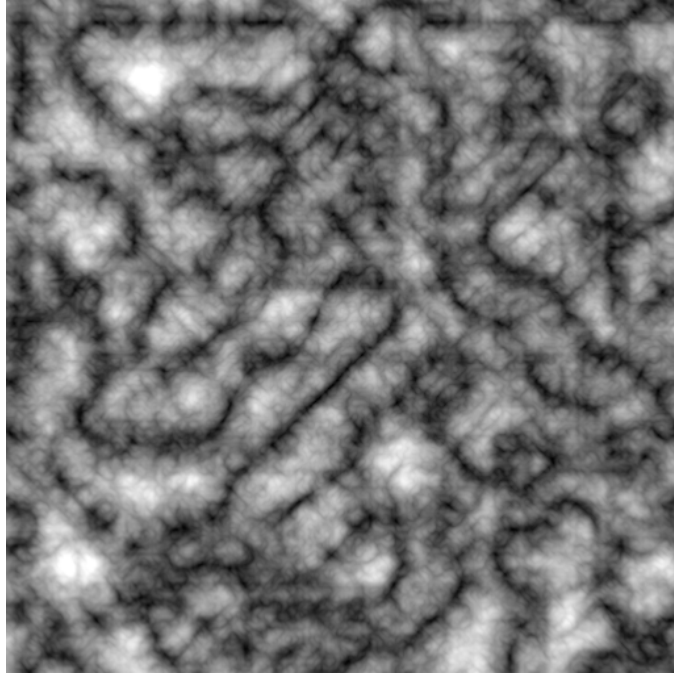


# FBm vs Turbulence

Both useful primitives for emulating natural materials

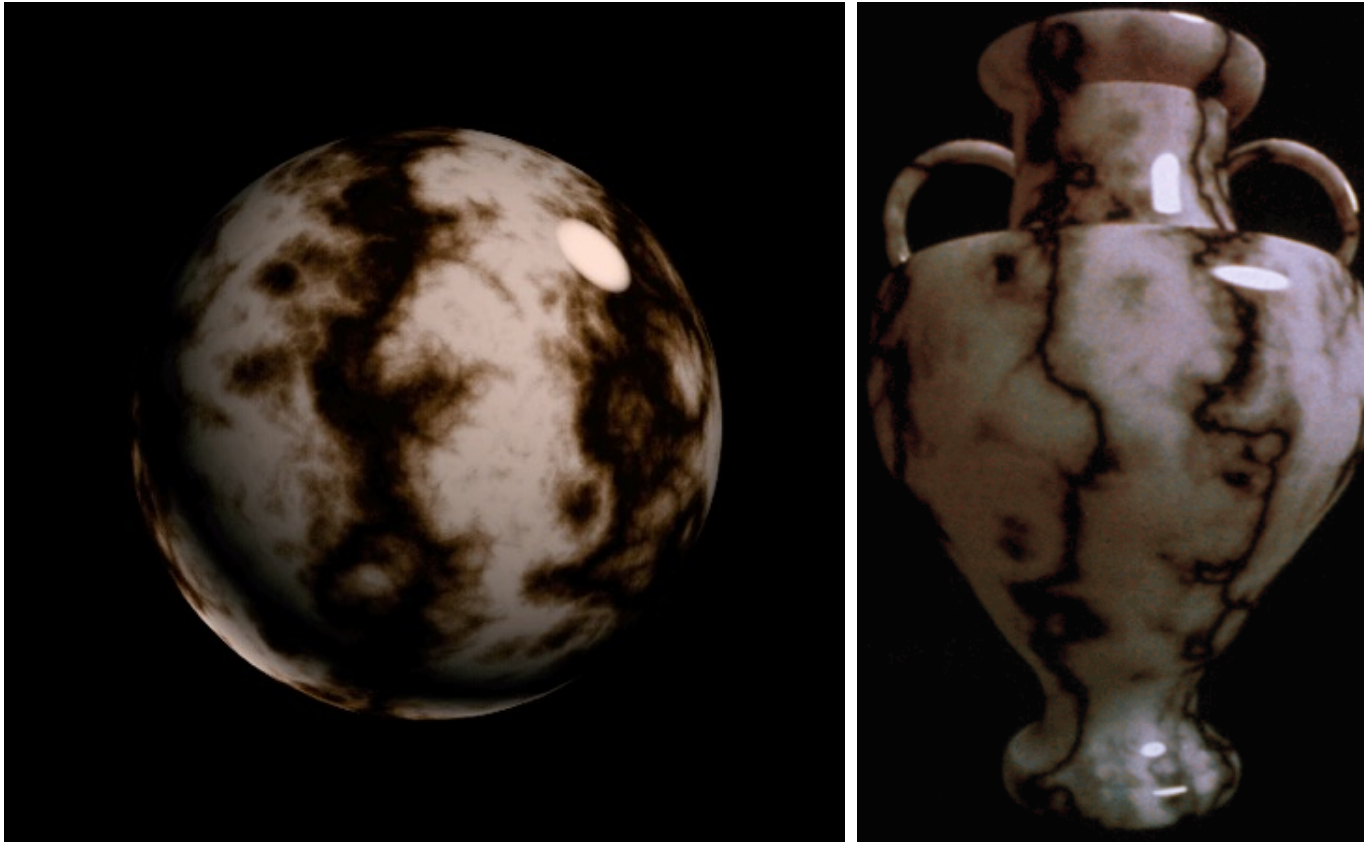


*fBm*



*turbulence*

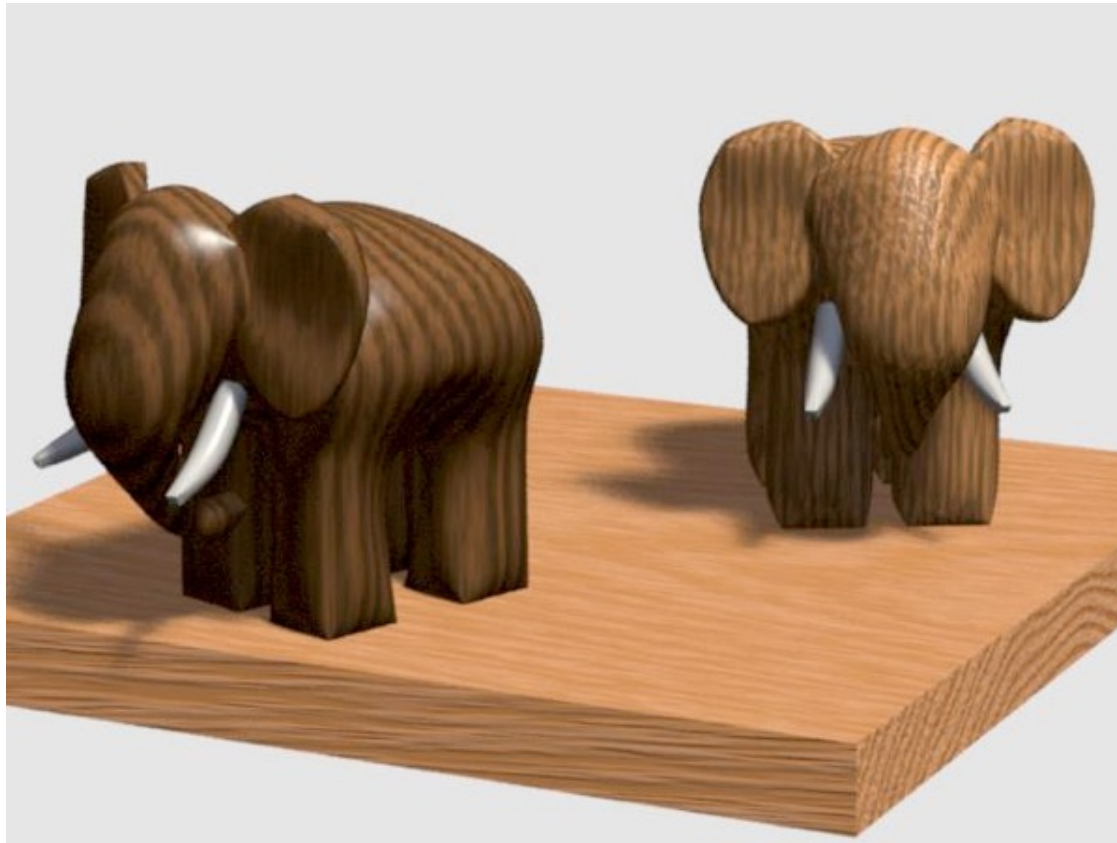
# Marble



$$\text{color} = \sin(x + \text{turbulence}(x, y, z))$$



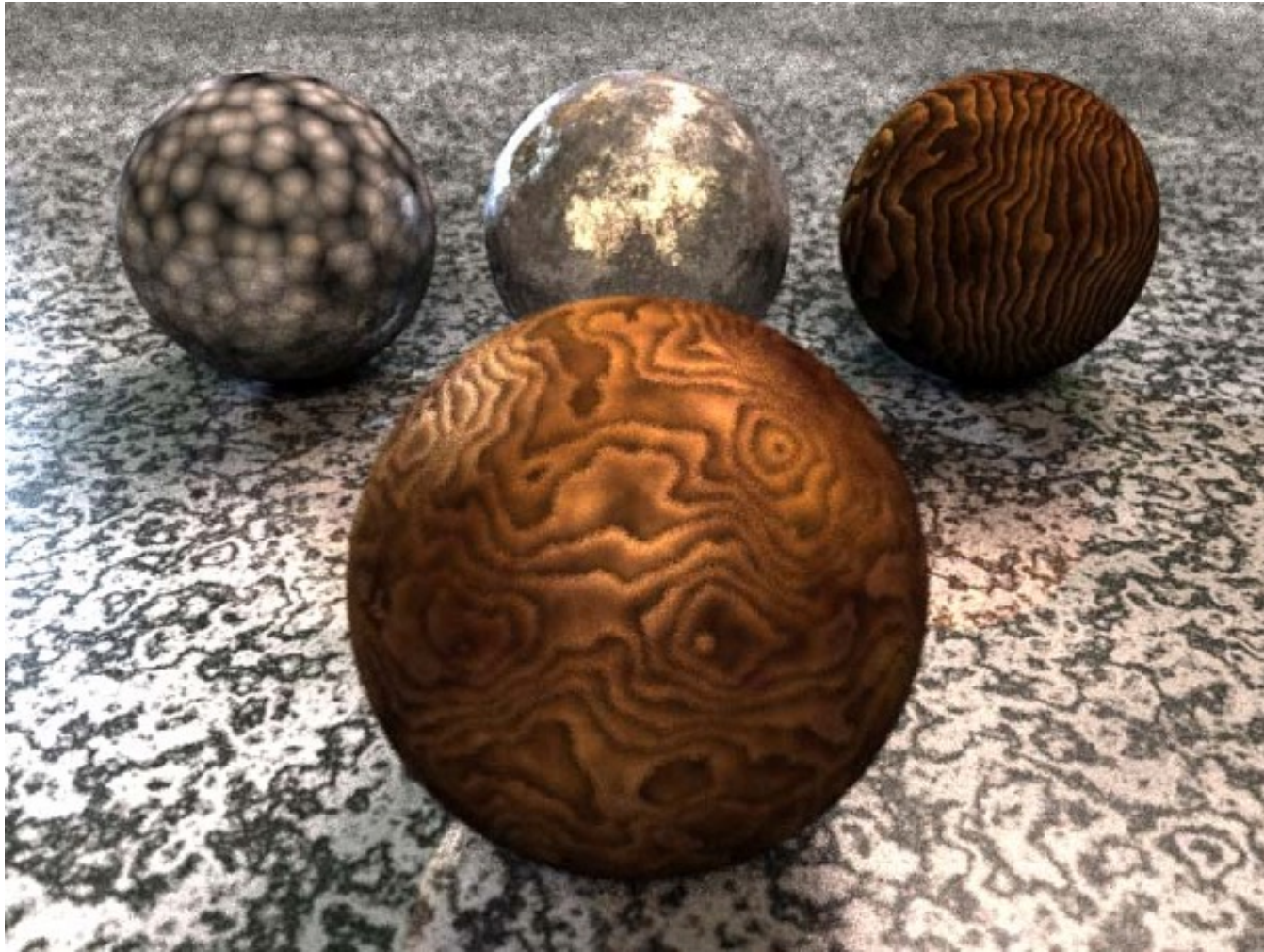
# Wood



$$\text{color} = \sin \left( \sqrt{x^2 + y^2} + \text{fbm}(x, y, z) \right)$$



# And More...



# And More...



# Literature

