



COMP250: Artificial Intelligence

7: Procedural Content Generation

What is PCG?

What is procedural content generation (PCG)?

- ▶ **Procedural:** by computer program or algorithm, with little or no direct input from designer or user
- ▶ **Content:** levels, maps, art, animations, stories, items, quests, music, weapons, vehicles, characters, ...
- ▶ **Generation:** creating stuff

Types of PCG

- ▶ **Online**

- ▶ Generate content at run-time
- ▶ Part of the game

- ▶ **Offline**

- ▶ Generate content at design-time
- ▶ Tool for developers

PCG \neq randomness

- ▶ Many PCG systems use random numbers, but randomness in itself is not PCG
- ▶ Can have PCG without randomness, e.g. based on fractals or simulations
- ▶ Randomness in PCG is generally **constrained** to produce desired content
- ▶ Shuffling a deck of cards for a game of Solitaire is **not** PCG!

Why PCG?

- ▶ More content for less development effort
- ▶ Decrease development costs
- ▶ Increase replayability
- ▶ Decrease storage requirements
- ▶ Allow game mechanics based on unseen content

Further reading

Noor Shaker, Julian Togelius and Mark J. Nelson.
*Procedural Content Generation in Games: A textbook
and an overview of current research*. Springer, 2016.
Available online: <http://pcgbook.com>

The Binding of Isaac (2011)



Enter The Gungeon (2016)



Spelunky (2008)



Dwarf Fortress (2006)



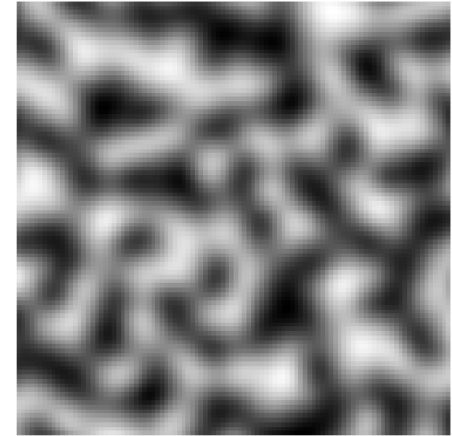
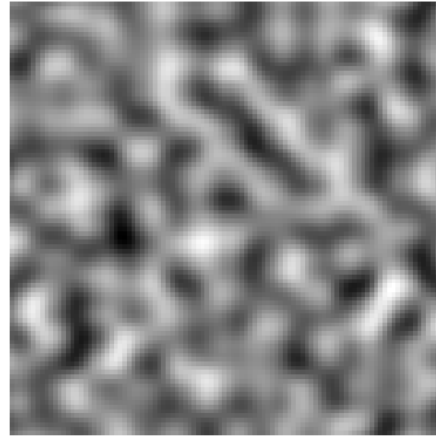
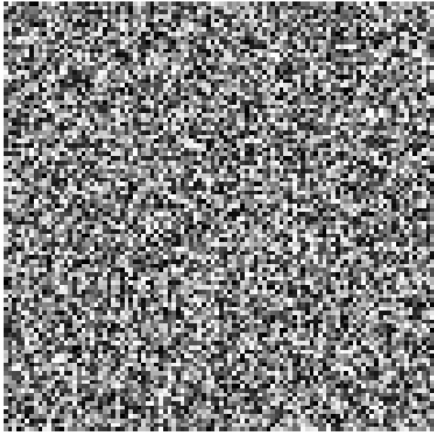
No Man's Sky (2016)





NOISE FUNCTIONS





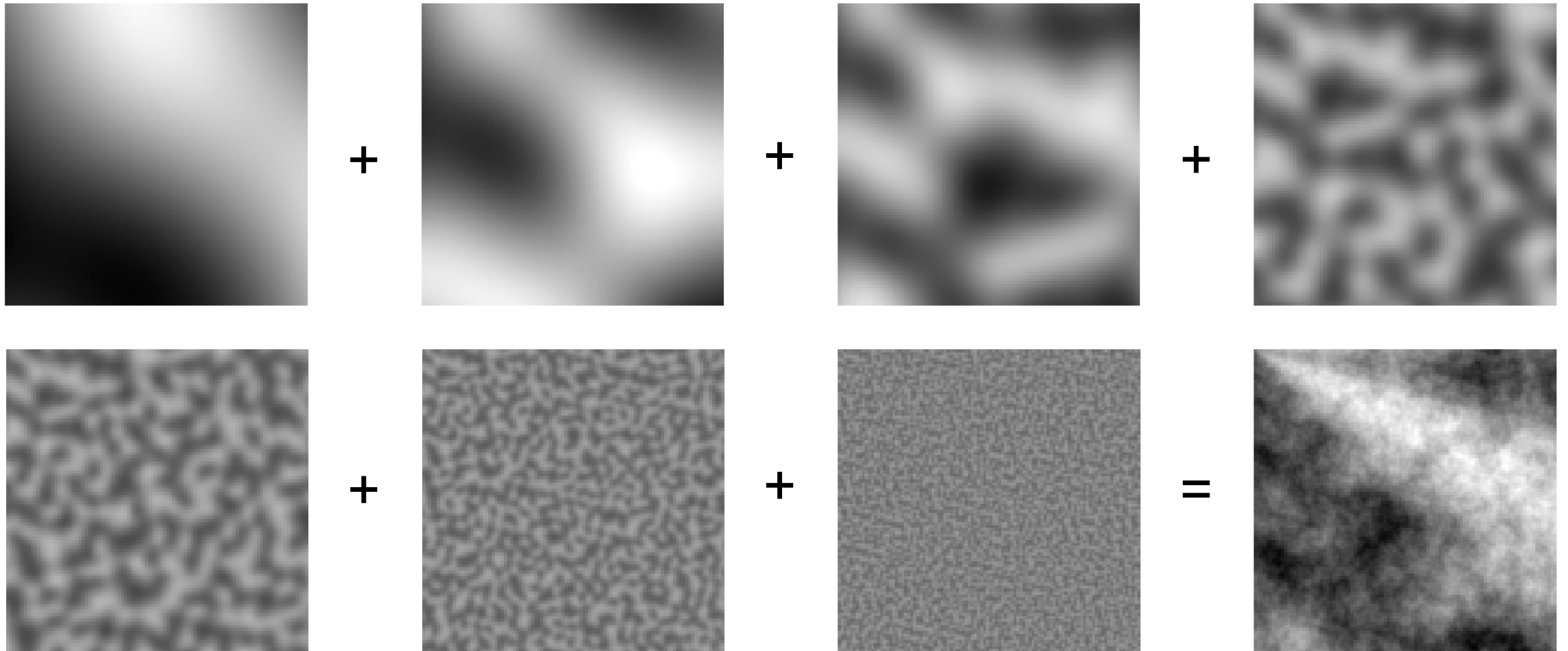
NOISE FUNCTIONS

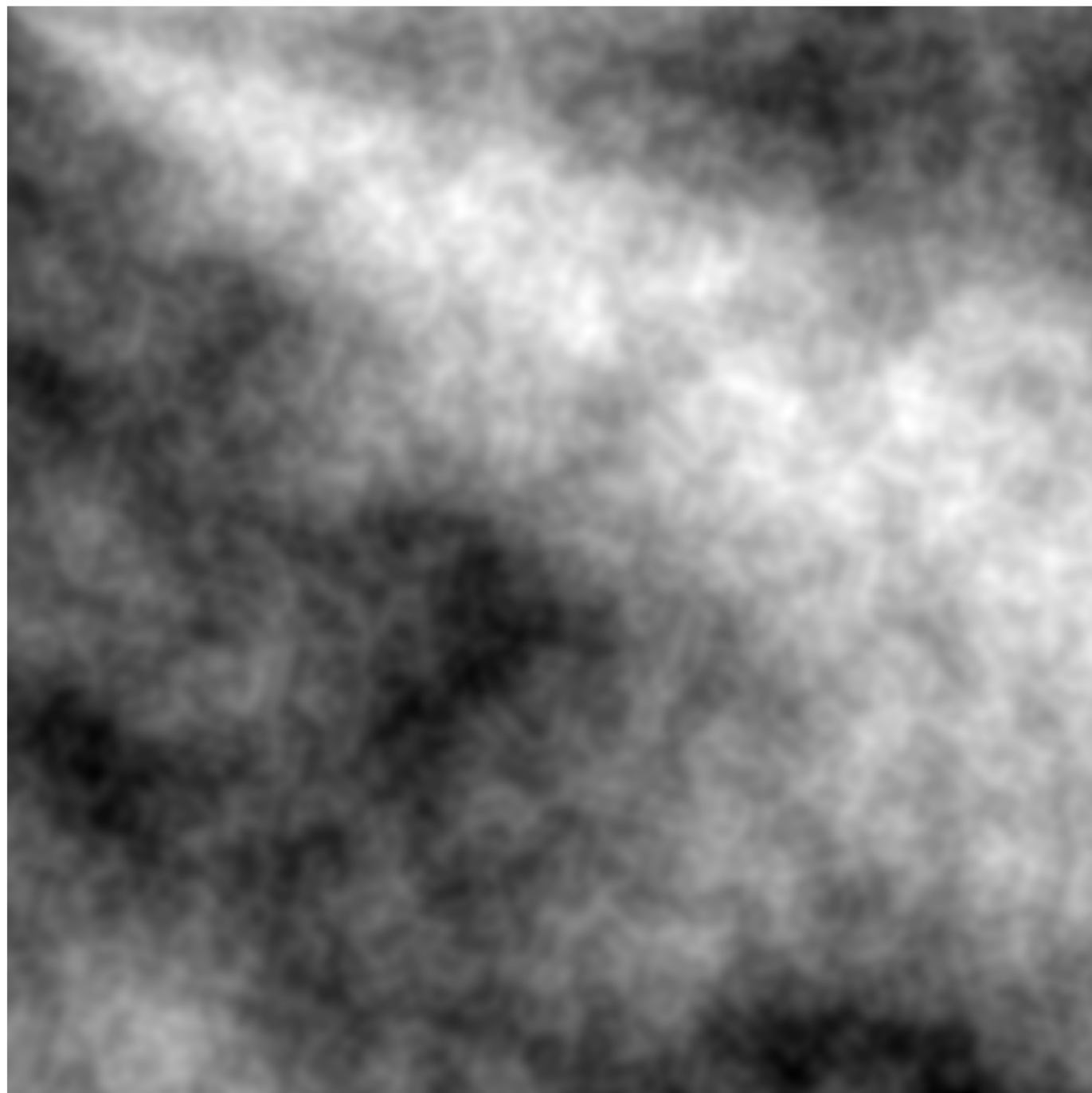
- Functions which map 1D, 2D or 3D points to pseudorandom values
- Input parameter is a float or Vector2 or Vector3; output return value is a float
- **Pure random noise** is generally not used as it's **too** noisy
- **Perlin noise** has smoother gradients
- **Simplex noise** (also developed by Perlin!) uses a non-rectangular grid – reduces artefacts

FRACTAL NOISE

- Can get higher **frequency** noise by multiplying the x, y, z parameters by a constant
- Can change the **amplitude** of noise by multiplying the output by a constant
- Fractal noise: add together several frequencies of noise – **higher frequency, lower amplitude**
- Low frequency features are big – mountains, valleys
- High frequency features are small – bumpy surfaces

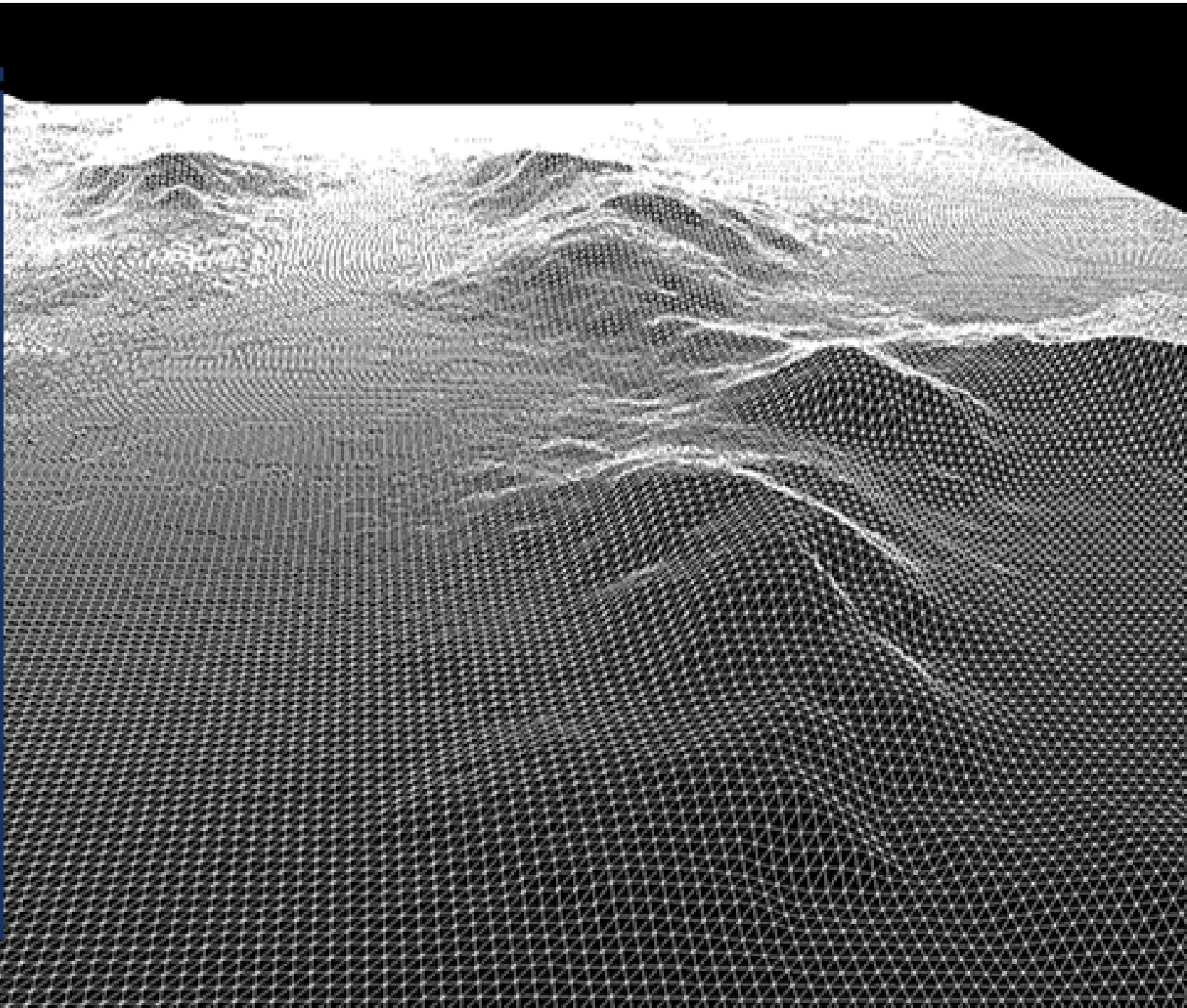
FRACTAL NOISE EXAMPLE





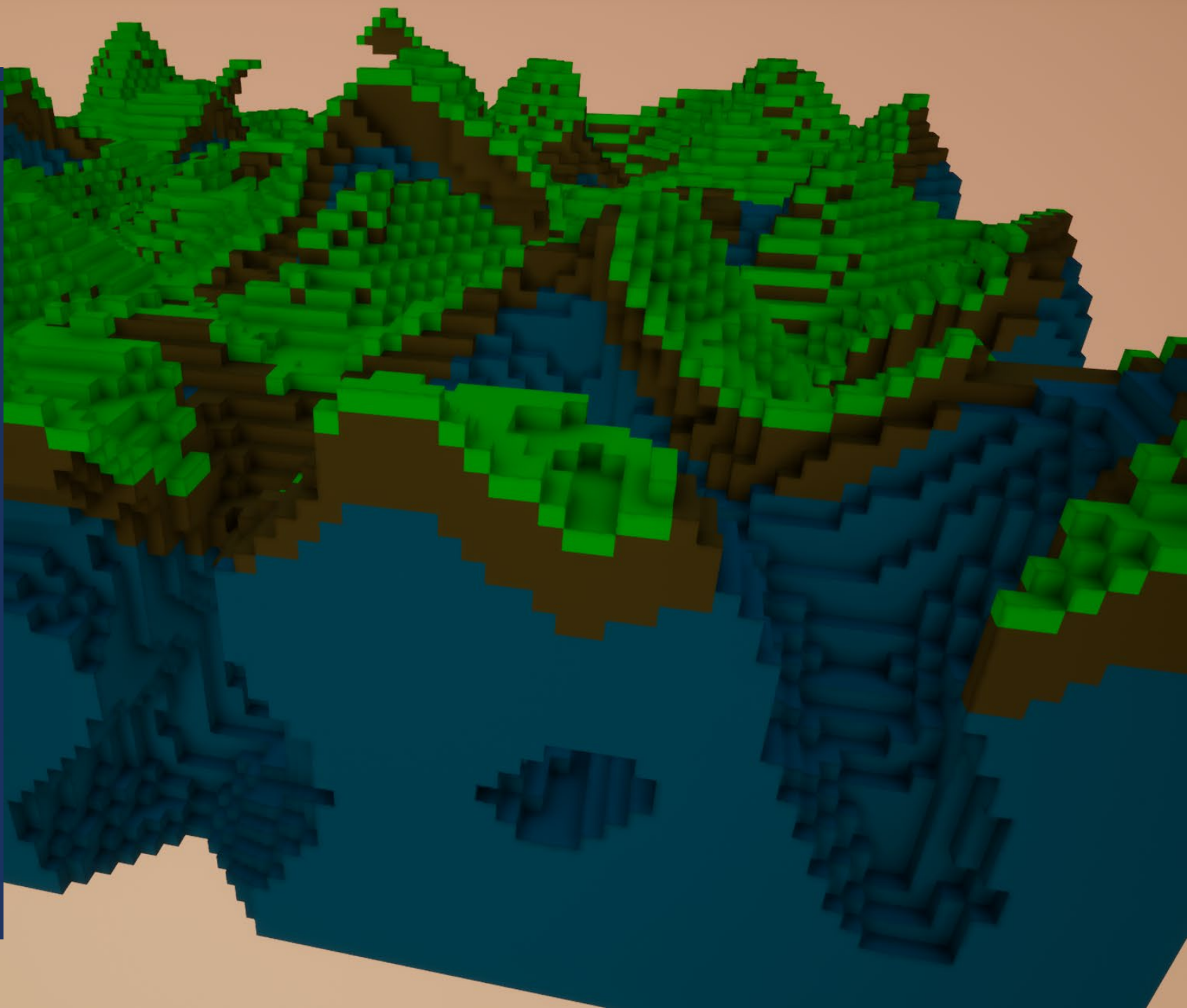
USING NOISE

- 2D noise can be used as a **height map** to generate terrain
- Start with a **2D grid** on the X-Z plane
- Set the **Y value** of each vertex based on the noise value



USING NOISE

- Generate 3D noise on a **voxel grid**
- Apply a **threshold** – e.g. if $\text{noise}(x, y, z) > 0.5$ then fill the voxel, else leave empty
- Can generate “Minecraft-style” terrain with caves



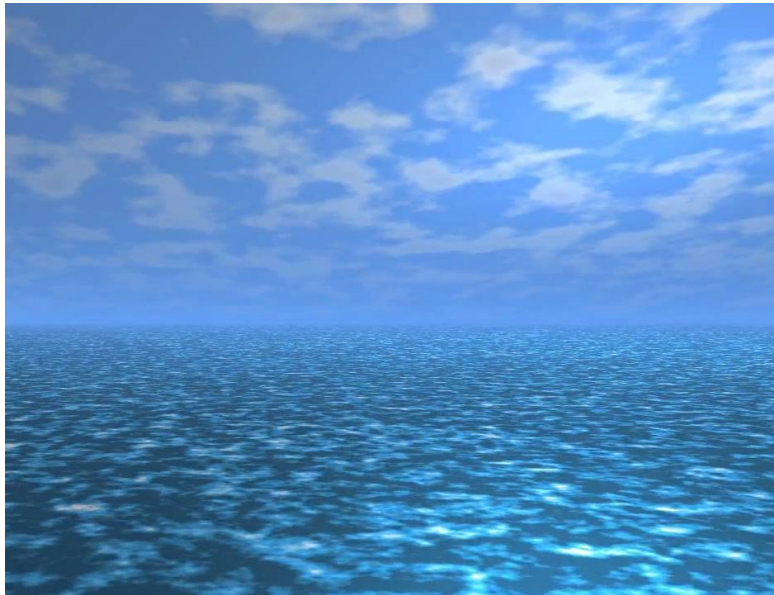
USING NOISE

- Different noise functions can be layered to generate terrain, water, resources, ...



USING NOISE

- Many creative uses of noise to generate textures
- Clouds, water, fire, marble, wood, grass, lava, liquid, ...



USING NOISE

- **Perlin worms**
- Use the noise function to guide a **random walk**
- Can be used to generate caves, rivers, artificial life, ...





N-GRAM MODELS



N-GRAMS

- Consider a **text string**
- An **N-gram** is a sequence of N consecutive characters
- E.g. a 2-gram is a pair of characters, a 3-gram is a triple, etc

| | | | | | | | | | | | |
|---|---|---|---|---|---|---|---|---|---|---|---|
| I | n | t | e | l | l | i | g | e | n | c | e |
|---|---|---|---|---|---|---|---|---|---|---|---|

2-grams: “In”, “nt”, “te”, “el”, “ll”, “li”, ...

3-grams: “Int”, “nte”, “tel”, “ell”, “lli”, ...

TRAINING A MODEL

- Given a large set of text, we can count the **frequency** of each possible N-gram
- This is a very basic form of **machine learning**

| 3-gram | Frequency |
|--------|-----------|
| ton | 156 |
| ham | 95 |
| ing | 79 |
| ort | 57 |
| ord | 54 |
| for | 53 |
| ley | 51 |
| ter | 49 |
| on- | 41 |
| rth | 40 |
| est | 39 |
| and | 39 |
| sto | 38 |

USING THE MODEL

- Generate a string **iteratively**
- At each step, look at the last N-1 characters
- Frequency table tells us how often each following letter occurs
- Choose next letter at random based on these frequencies

| 3-gram | Frequency |
|--------|-----------|
| out | 34 |
| oug | 29 |
| our | 9 |
| ouc | 3 |
| ous | 2 |
| oul | 2 |
| oud | 1 |

S o u

ENGLISH TOWNS AND CITIES, N=2

Kile

Daswichin

Dury

Selt Maney

Brerrntomonghone

Bichaxmbyke

Witllesl

Sts

Dan-Fon

Kinhyn

Wan

Soth

Eam

Oshicedbor

Farorsthemetondort
Horthers

Cach

Nene

Cale

Telk

Pe

ENGLISH TOWNS AND CITIES, N=3

Gray

Wiveyntinscomyaltongrwarighton

Twickham

St Reth
Edmandfieleigh

Toth Warle-one

Sandburntword

Amborley

Rowmand

Sough

Mitnabley

Southetford

Whipon

Dary

Ive

Wivey

Bunston Leothet
Hareetton

Marthoe

Hykerthes

Easterloughord

Oakeat Ber

ENGLISH TOWNS AND CITIES, N=6

Lichfield

***Medlar with
Newton***

Fazeley

***Frinton and
Winslow***

Penrith

Malmesbury

Crewkerne

Staines-upon-
Thames

Blyth

Alston

Gainsborough

Falmouth

***Burton and
Loscoe***

Oakengates

Reading

Wem

Burgh-le-
Marsh

Morecambe

Torpoint

Chagford

RPG GAMES, N=4

Under

City

Dunger

Thievery

Rune

Commission

Fans of the
Domin

Fifth Cycle Warrings
Alley on Herouthern

Dangers

Breathworld

Stal Freet Voyage of the 7
Skyrealms of the 23rd
Weird RPG

Legave

Rapture Game

Cutthroat: The One Weird is - Time of
And Creak: The Space Timemastic
Role-Playing Game

Fantain

Fearscapes

Mekton's World

Omnibronicle

Hard of Dark Dunger
Suburban Earthening game

Dead

POKEMON, N=3

Shinett

Swagon

Shera

Surk

Miepting

Munid

Raile

Gulayque

Learodur

Whirizior

Fareezormado

Forusharon

Sawsbulbastarcato

Close

Trespra

Woobbuzz

Swakar

Para

Woonfoom

Phime Jr.

“THE ADVENTURES OF SHERLOCK HOLMES”, N=3

“We sons, at ve do way mising,” he tonfeent
unithathe ingave whove; I haver at sectes.
We to buiether a vould gothe ingust
andea rematin as larchat a sad I hich so I
ingic se-bas wance theiressse thipsell and hat
I cout ince.

“THE ADVENTURES OF SHERLOCK HOLMES”, N=10

“You are a benefactor. Are you hungry, Watson, founded upon the table and glanced back at me.” The words of the sill, but I felt a sudden effort, straight into the match, and lashed furiously with his thick red finger planted halfway down Swandam Lane is a vile alley lurking behind us, and send down to the fire. The last straggling houses here. It arrived. I paid the fee was at least a presumption that Colonel Lysander Stark stopped at last.

OTHER USES

- Not limited to generating text – can generate other sequences e.g. music, game levels
- Related technique in 2D/3D: **Wave Function Collapse (WFC)**

