



# Procedural generation of underwater landscapes

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# Why virtual environments?

- For cinema,
- Video games,
- Simulators,
- ...



Avatar : The Way of Water (2022). By J. Cameron



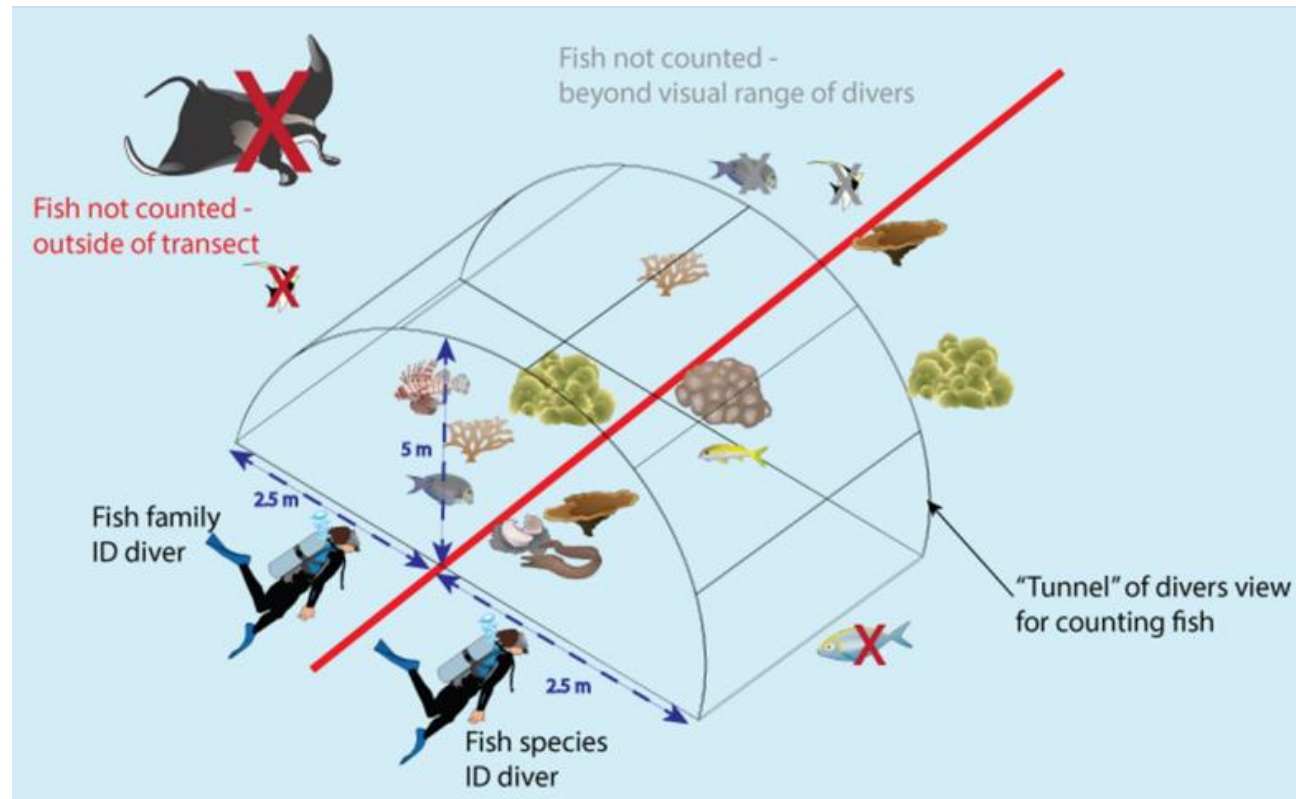
Red Dead Redemption II (2018). Rockstar Studio



Pierre Ecornier-Nocca et al.. Authoring Consistent Landscapes with Flora and Fauna. ACM Transactions on Graphics, Association for Computing Machinery, 2021

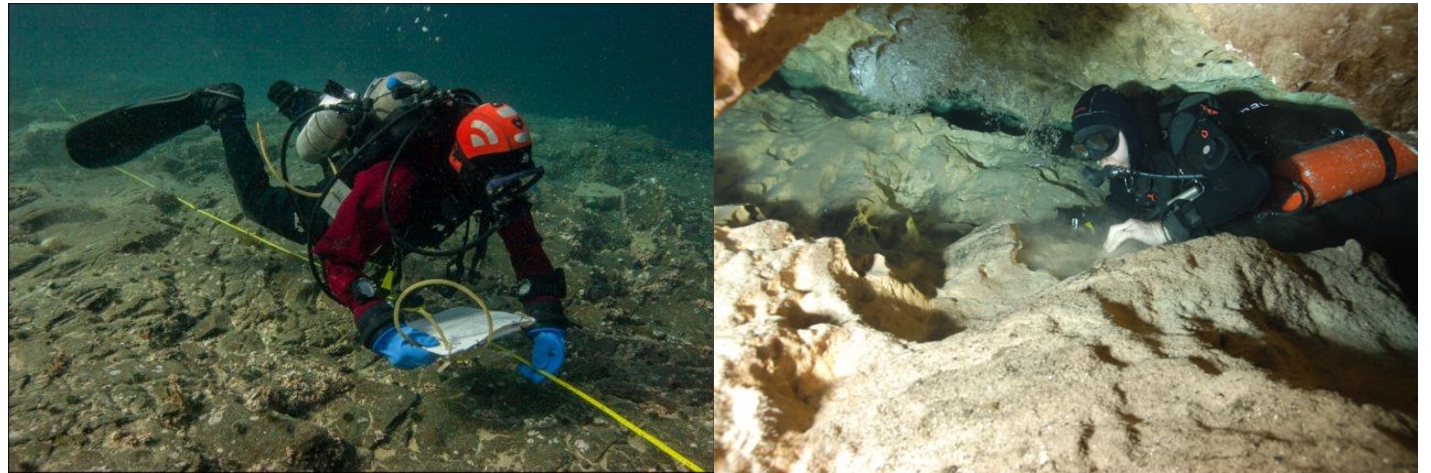
# Global project: Simulator for underwater exploration of robots

- For the study of marine biodiversity



# Global project: Simulator for underwater exploration of robots

- Human divers:
  - Long,
  - Expensive,
  - Dangerous,
  - Perturbation of the wildlife
  - A lot of paperwork

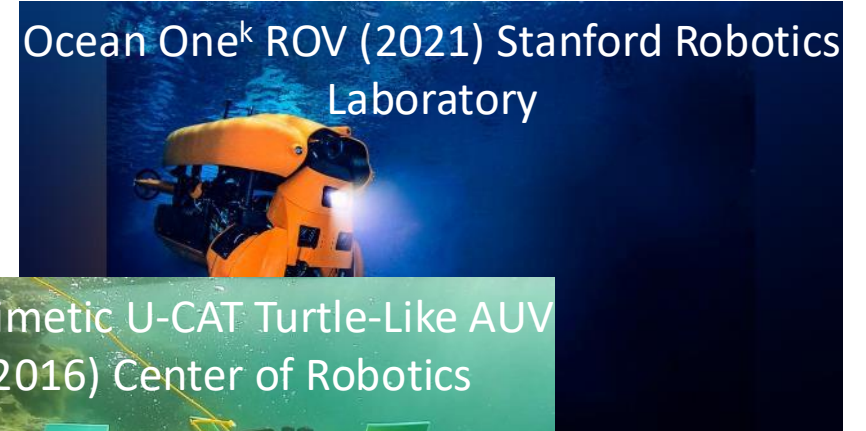


Source: Schultz et al. (2019). Arctic marine ecology benchmarking program: Monitoring biodiversity using scuba



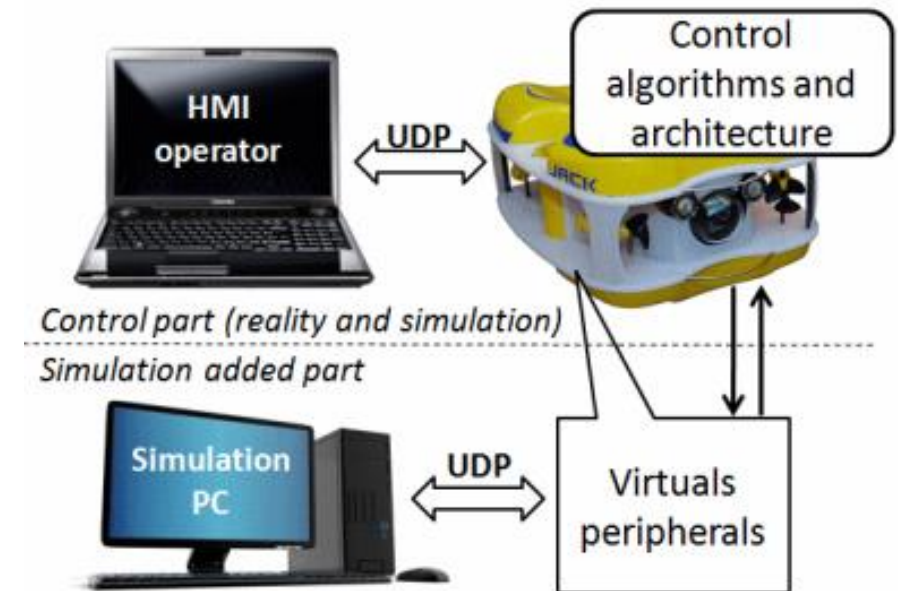
# Global project: Simulator for underwater exploration of robots

- Using robots:
- ... remotely operated:
  - Cables can be a big problem
- ... autonomous :
  - Terrains are complex
  - Lots of noise and perturbations on sensors
  - Not sure if the robot will ever come back



# Global project: Simulator for underwater exploration of robots

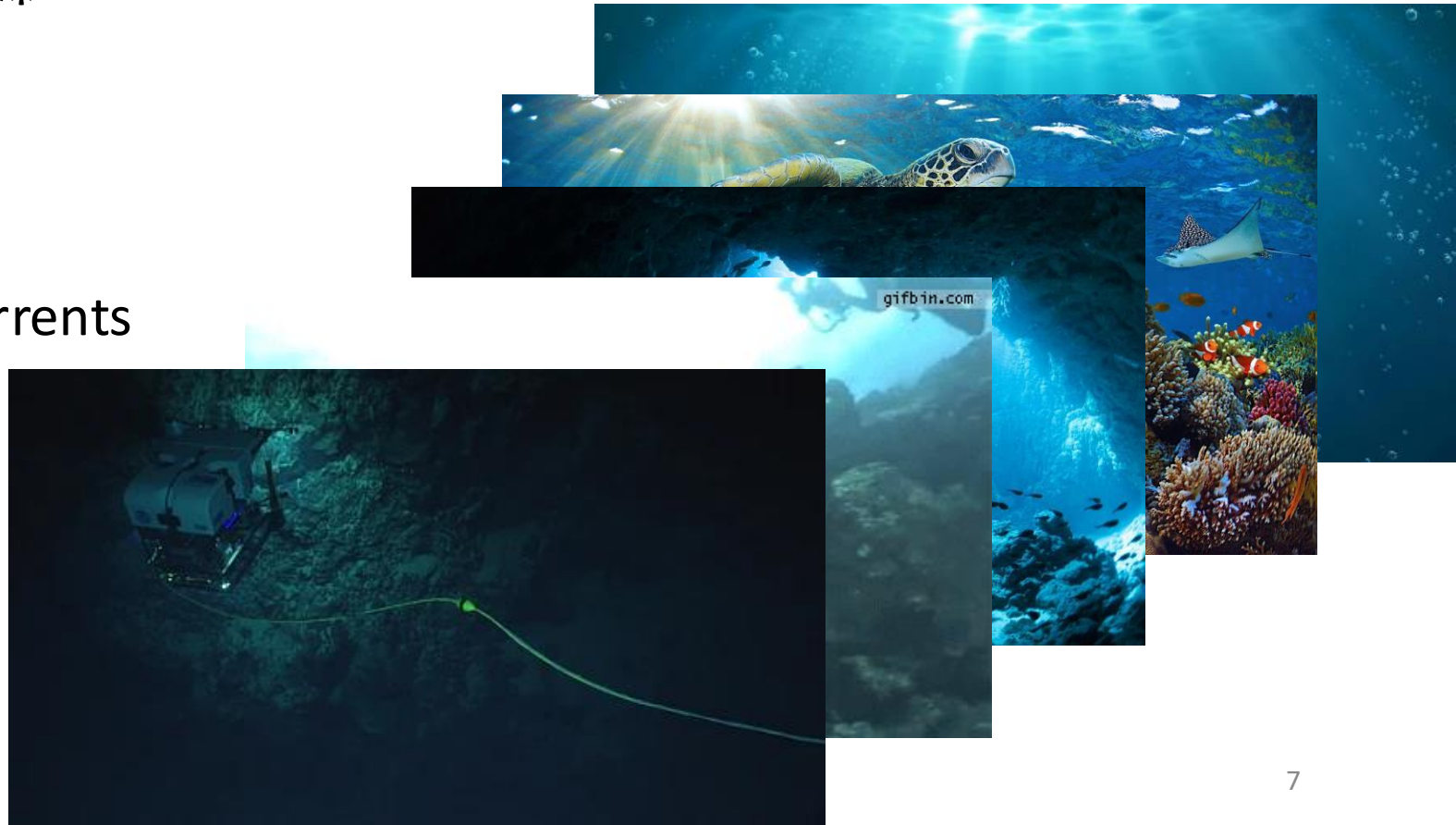
- Creation of a training camp for robots!



Source: Louis, Silvain, et al. *HIL Simulator for AUV with ContrACT*. 2019.

# Difficulties of underwater generation compared to terrestrial generation

- A lot of works made for terrestrial since the '80s
- Nothing for underwater\*
  - Water-filled vs. air
  - Different gravity
  - Notion of 3D
  - Importance of water currents
  - Lack of visibility
  - Difficulty in access

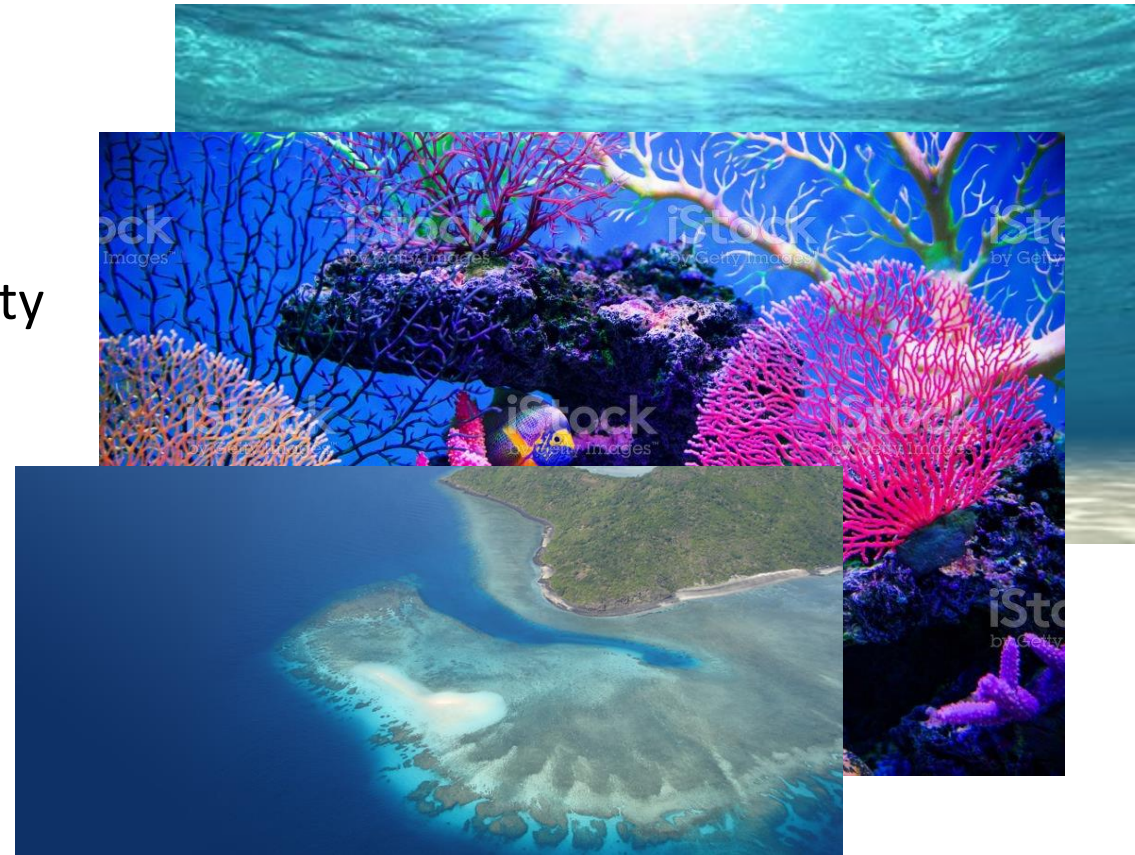


\* «at the best of my knowledge»



# More specifically, difficulties for coral islands

- Modeling of 99.9% of oceans: easy!
- Coral islands :
  - < 0.1% of ocean's surface, for 25% of biodiversity
  - Lack of observation instruments
  - Protected areas
- Geology mixed with biology
- Everything interacts with everything
- Physical simulations are too complex, not enough understanding



Darwin, C. (1842). *The structure and distribution of coral reefs - Chap I : Atolls or lagoon-islands*. In *The Structure and Distribution of Coral Reefs*.

Daly, R. A. . (1915). *The Glacial-Control Theory of Coral Reefs*. *Proceedings of the American Academy of Arts and Sciences*.

Davies, P. J., & Kinsey, D. W. (1977). *Holocene reef growth -- One Tree Island, Great Barrier Reef*. *Marine Geology*.

Droxler, A. W., & Jorjy, S. J. (2021). *The Origin of Modern Atolls : Challenging Darwin's Deeply Ingrained Theory*. *Annual Review Of Marine Science*.

Liu et al. (2022). *The Formation of Atolls: New Insights From Numerical Simulations*. *Journal of Geophysical Research: Earth Surface*.

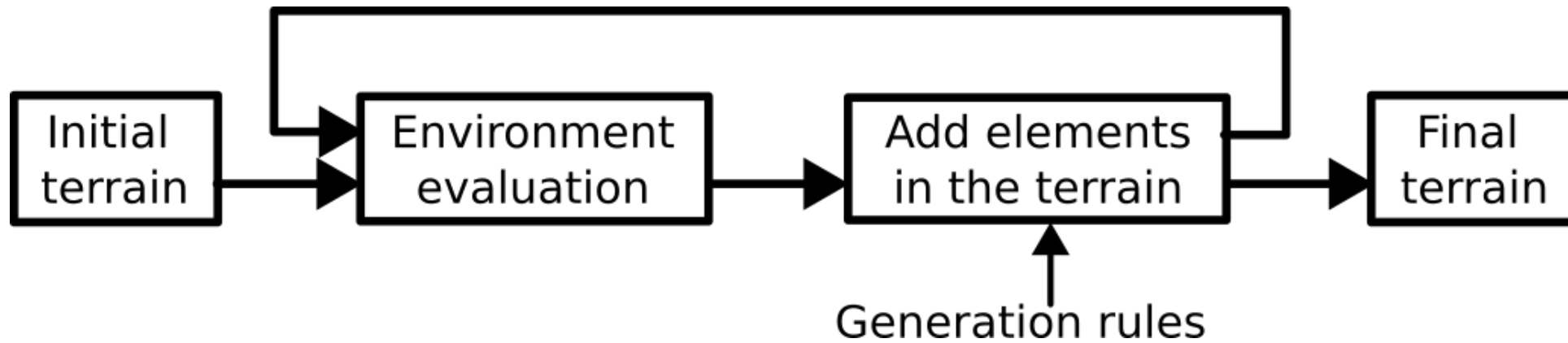


# My method for procedural generation of landscapes

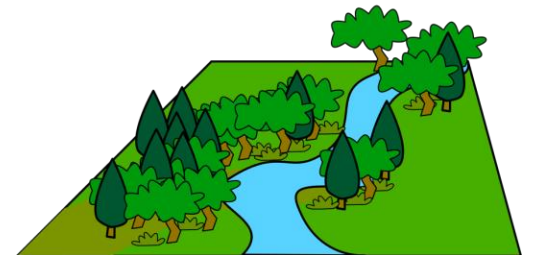
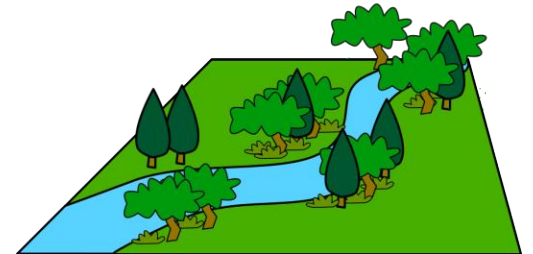
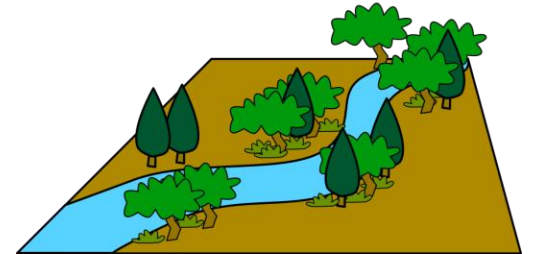
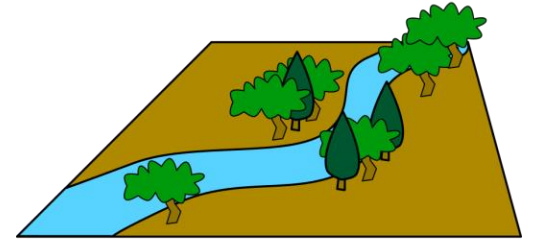
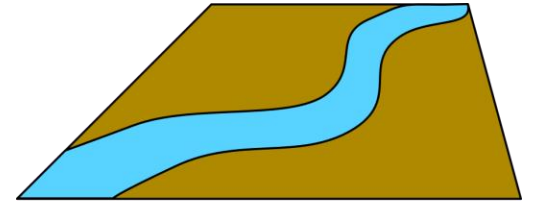
- Using "Environmental objects"
  - Construct the terrain using semantics
  - Simplify the representation
- Generation rules
  - Interactions between Objects and the environments defined by experts' knowledge
- Phenomenology
  - Provides an abstraction from physical simulations



# Pipeline



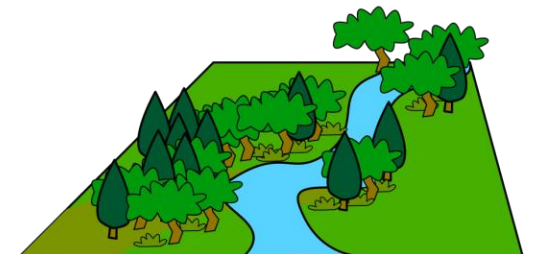
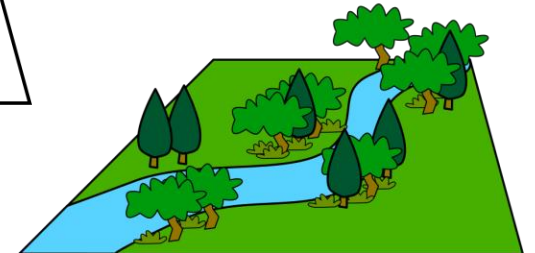
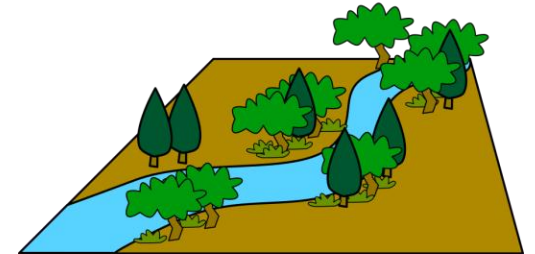
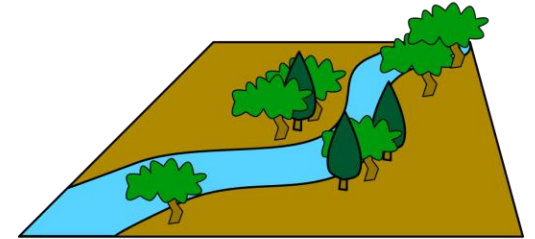
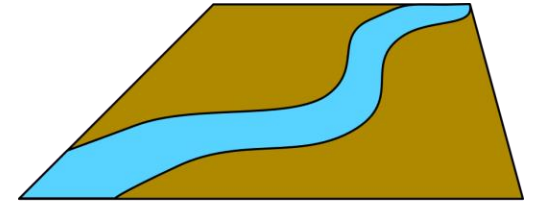
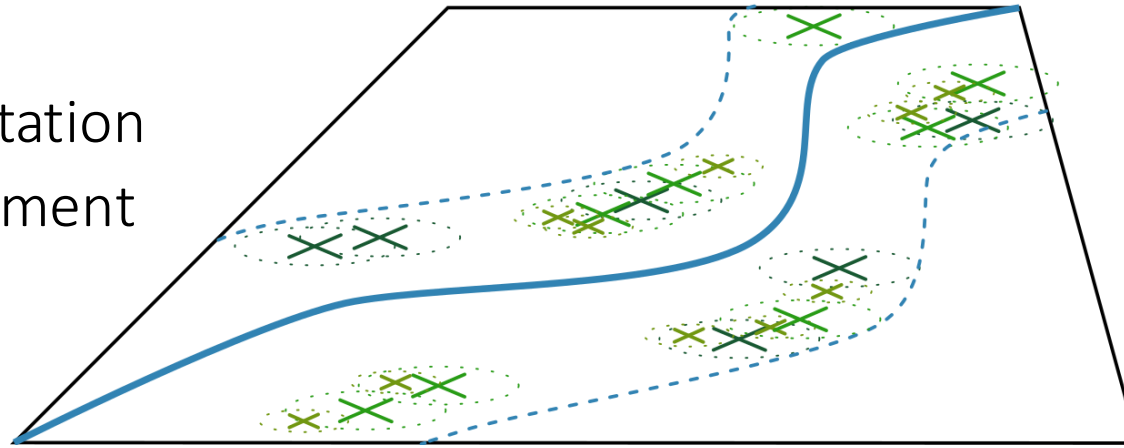
# Environmental Objects





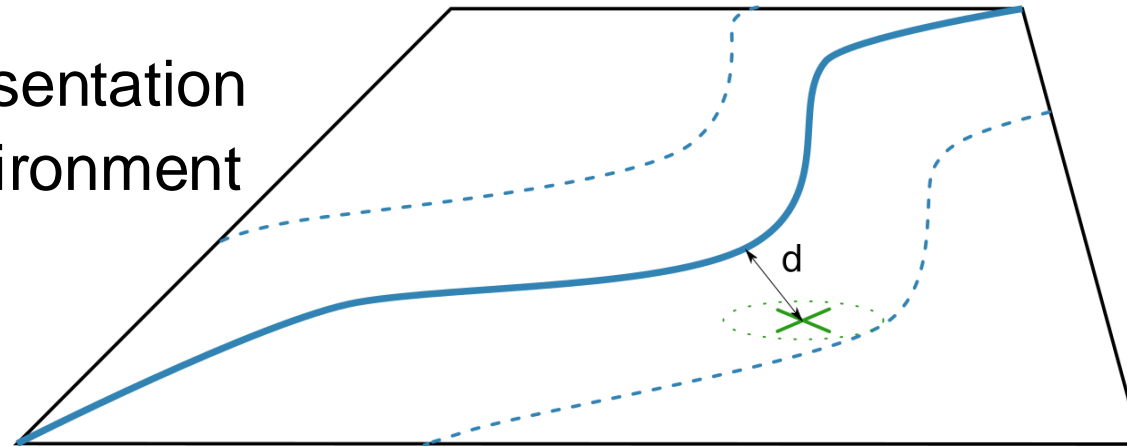
# Environmental Objects

- Defined by:
  - A skeleton
  - A geometric representation
  - Effects on the environment
  - A generation rule

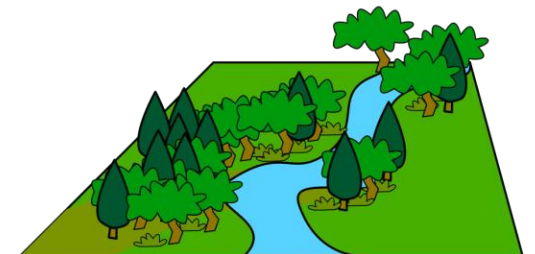
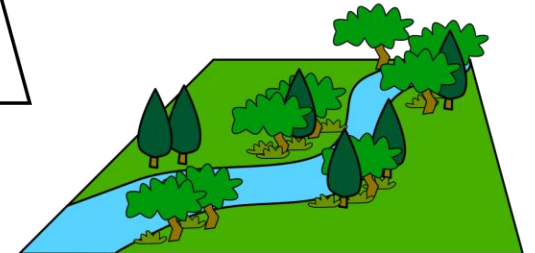
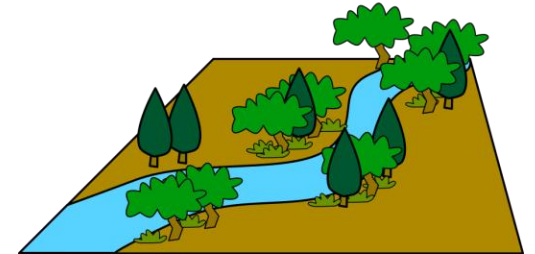
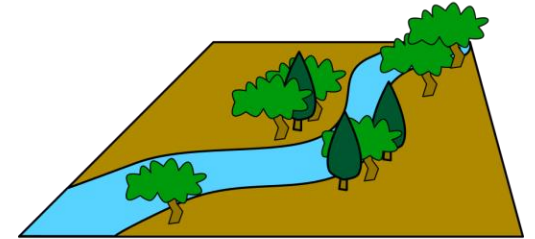
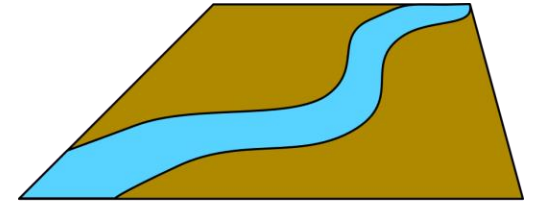


# Environmental Objects

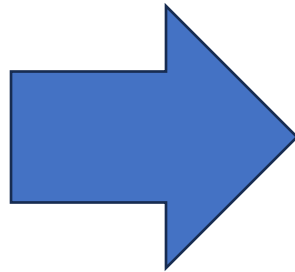
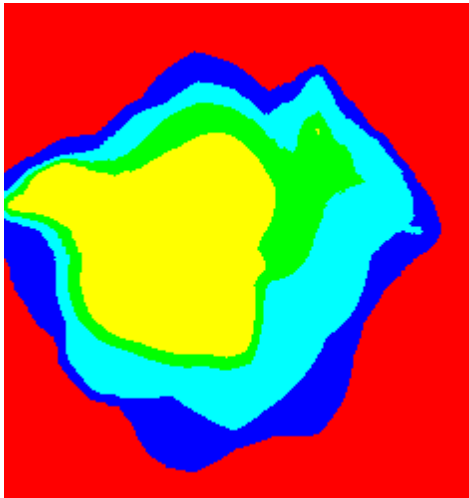
- Defined by:
  - A skeleton
  - A geometric representation
  - Effects on the environment
  - A generation rule



$$f(p) = |dist(riviere, p) - 10m| - 100 \times hydration(p)$$

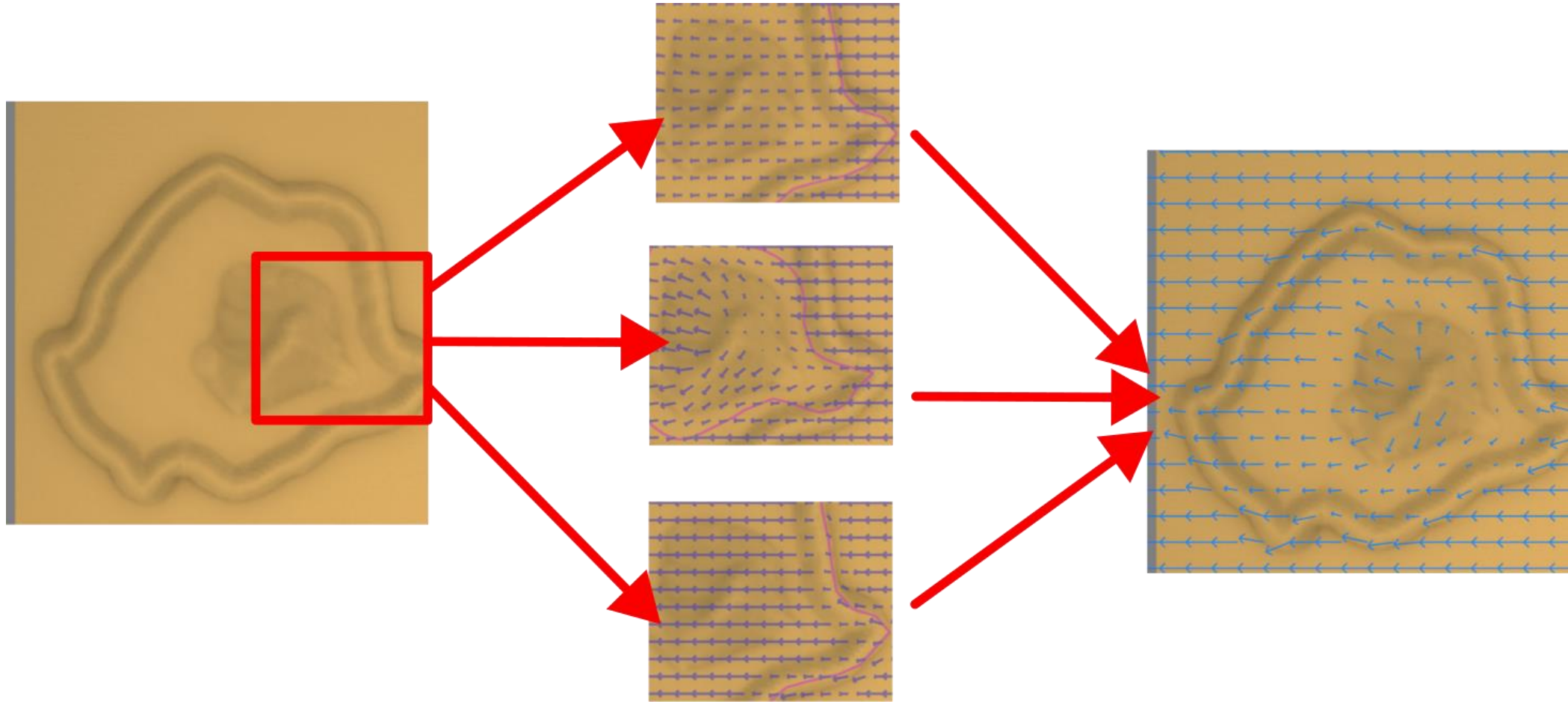


# Initial terrain



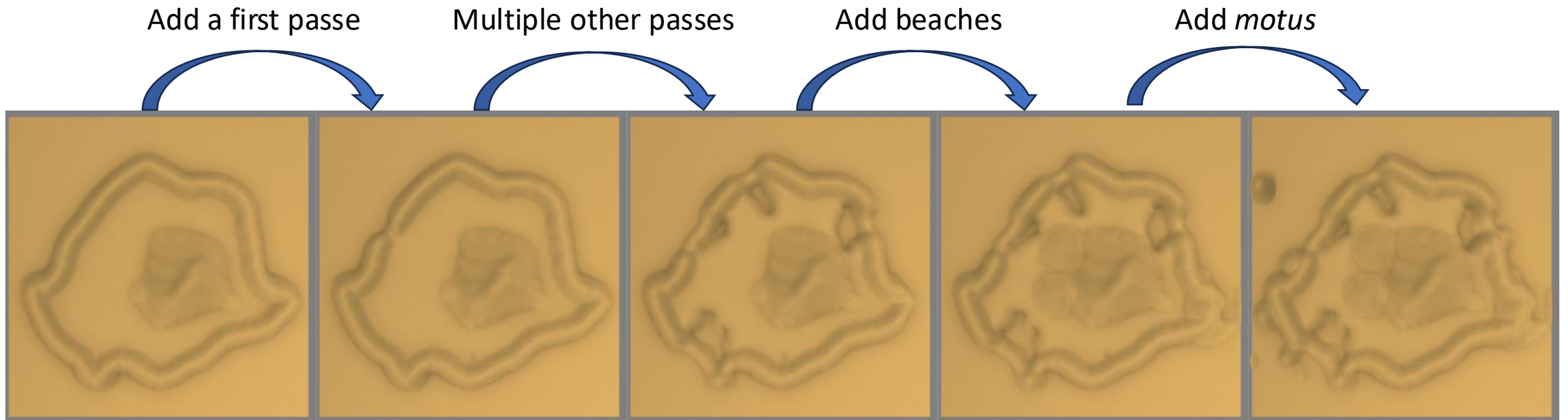


# Current state – Updating the water flow



The reef and island deviate the water flow  
and lagoon slow it down

# Current state – Adding new objects

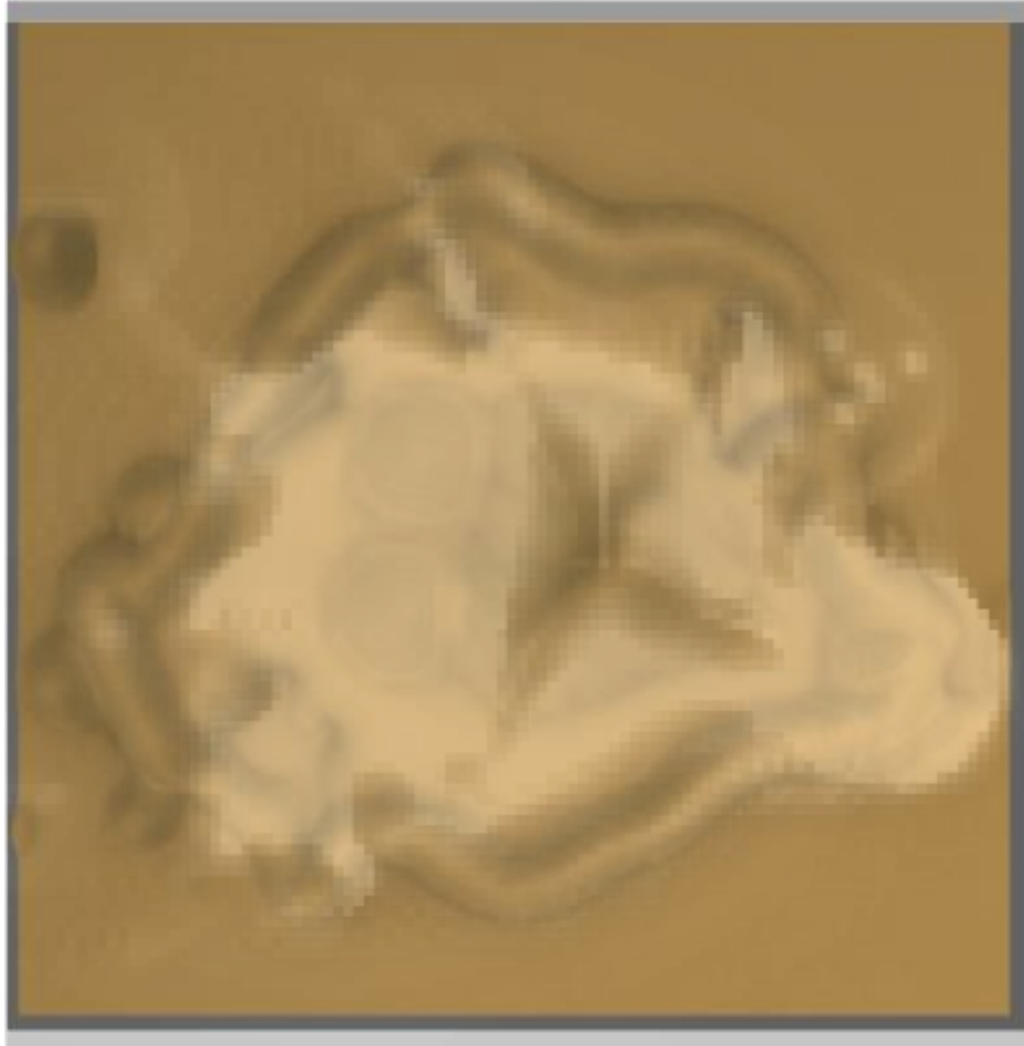


$$f_{passe}(\mathbf{p}) = \langle N_{reef}(\mathbf{p}), \vec{v}_{current}(\mathbf{p}) \rangle * 10 - dist(\mathbf{p}, reef)$$

$$f_{beach}(\mathbf{p}) = -dist(\mathbf{p}, island)$$

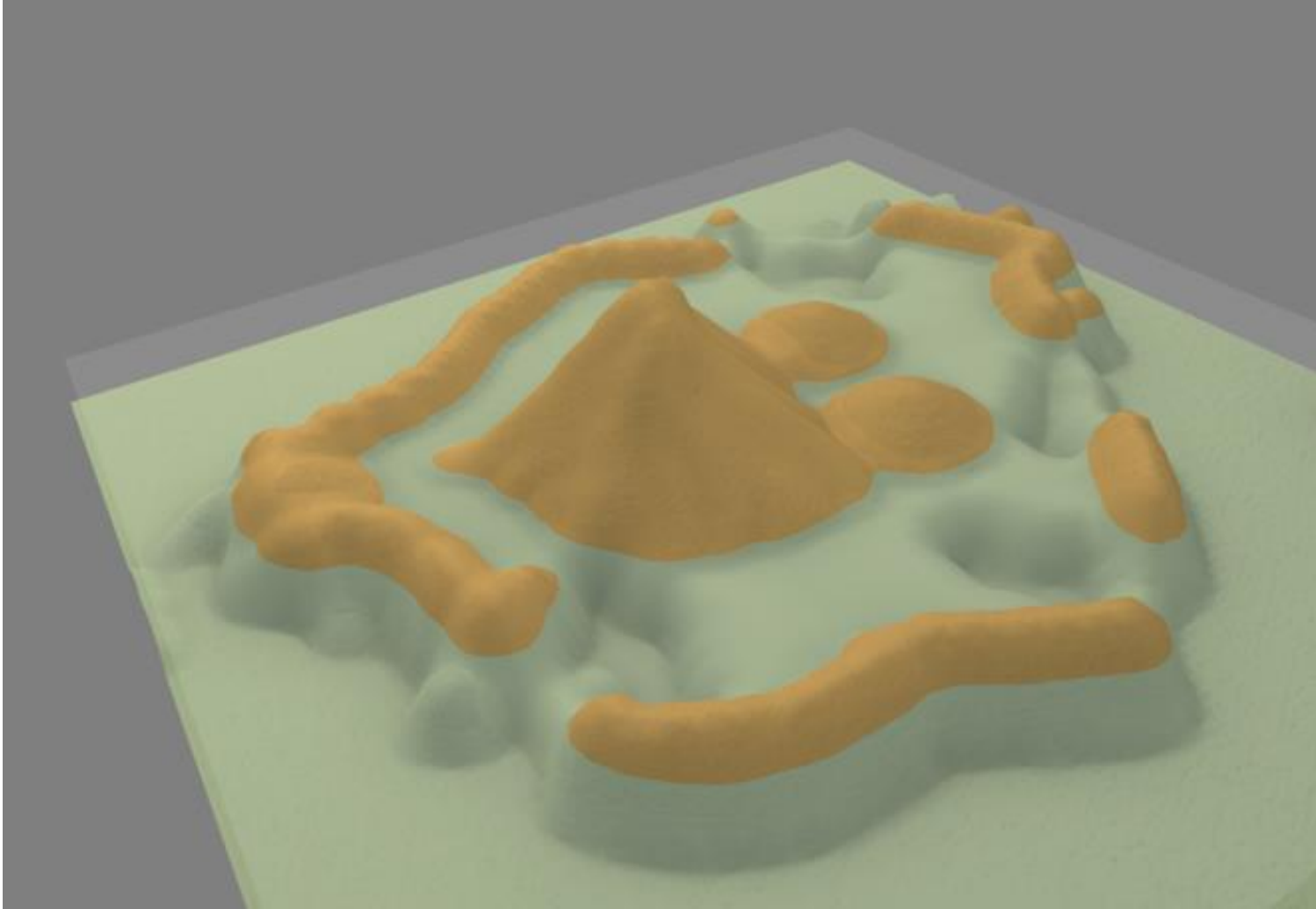
$$f_{motu}(\mathbf{p}) = (10 - dist(\mathbf{p}, passe)) * (5 - dist(\mathbf{p}, reef)) * sand$$

Current state – Changing the environment



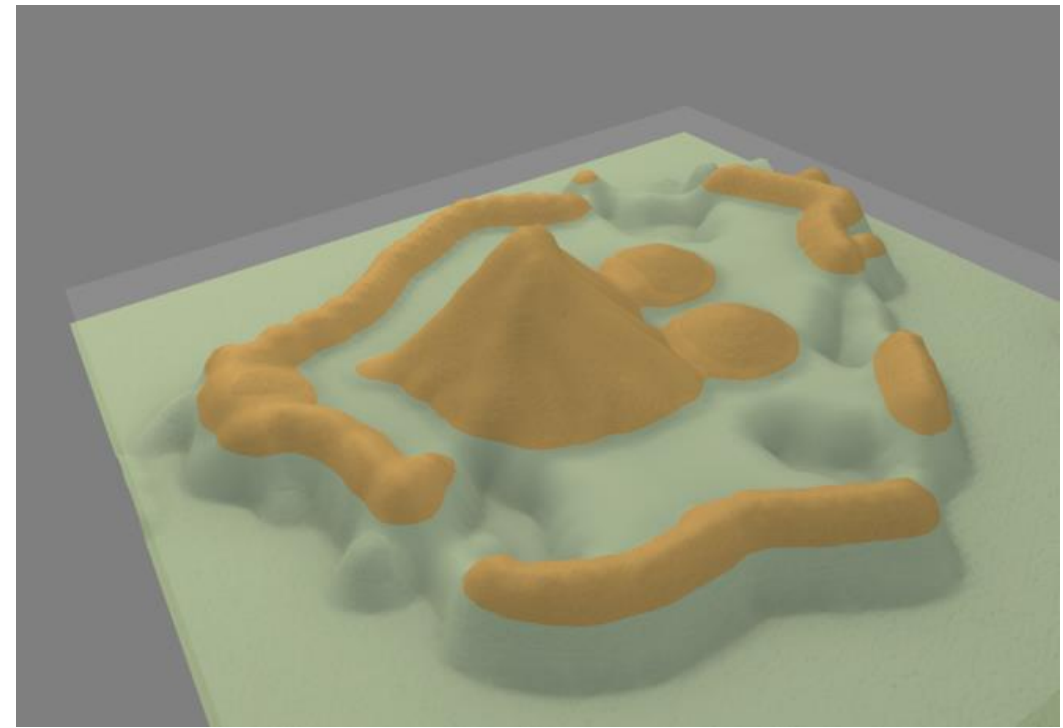


# Current state



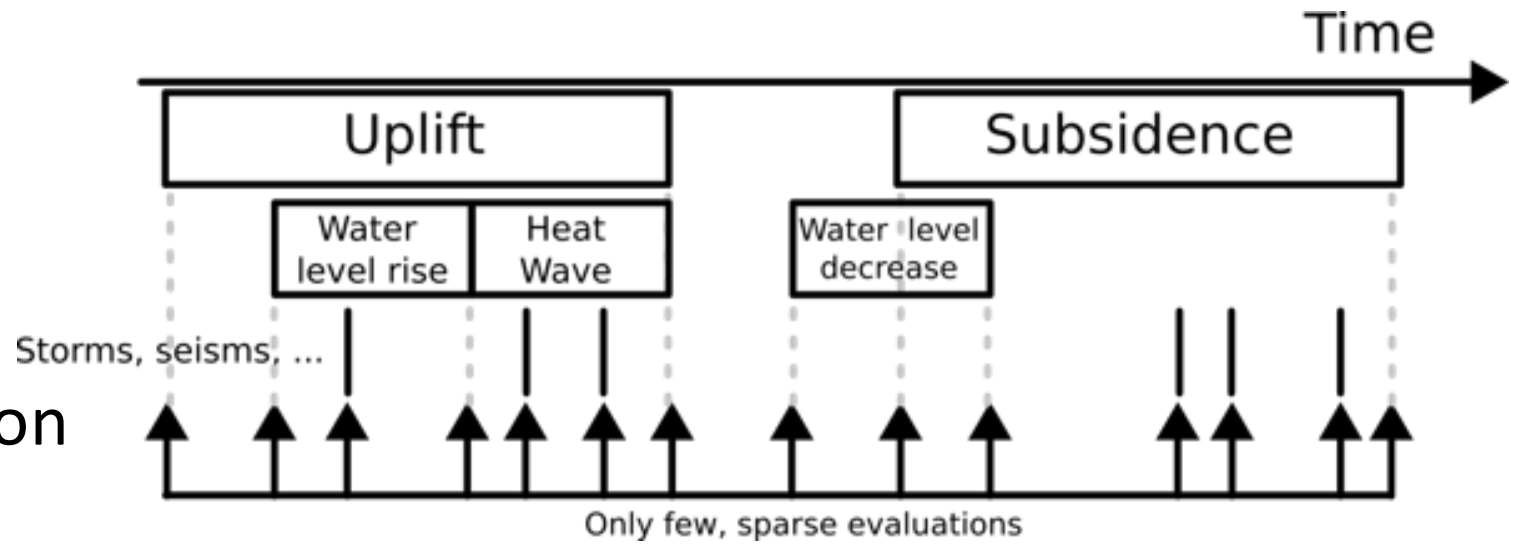
# Current state

- We can have new elements
  - They change the environment's properties (Water flow and sand deposition)
  - They appear depending on the environment's properties
- What we still need:
  - A realistic geometry (use of more advanced implicit surface functions)
  - More robust generation rules
  - More work on the water flow alteration

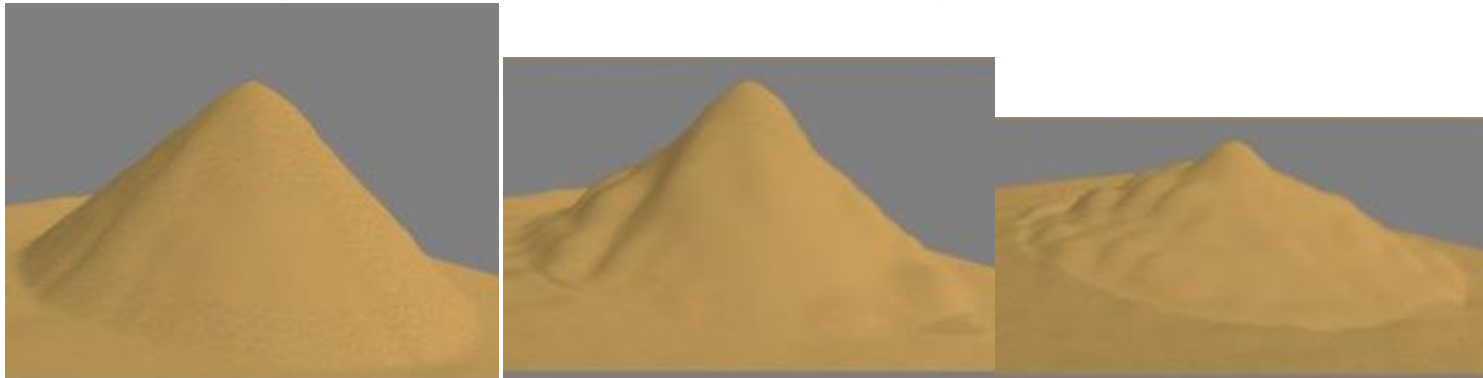


# Future works

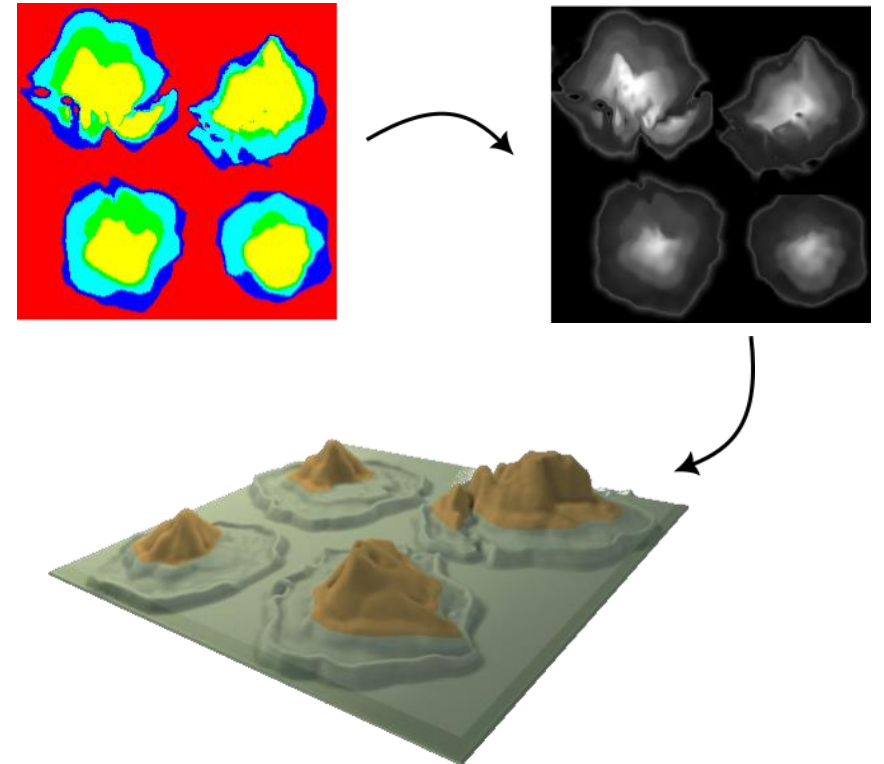
- An event-driven generation



- A parametric erosion representation



- Object's geometry from real data





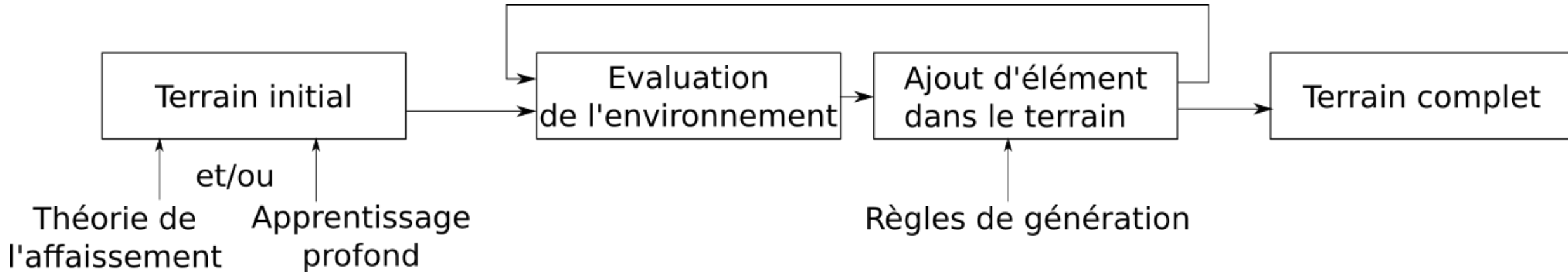
# Conclusion

- A sparse semantic representation of landscape's elements
  - Applying phenomenology
  - Injecting expert's knowledge
  - Without physical simulation
- The overall objectives being
  - Generating underwater scenes
  - With models that have explicability
  - A representation that can be modified more easily by a user
  - Improving the link between field experts and computer scientists

# The end!

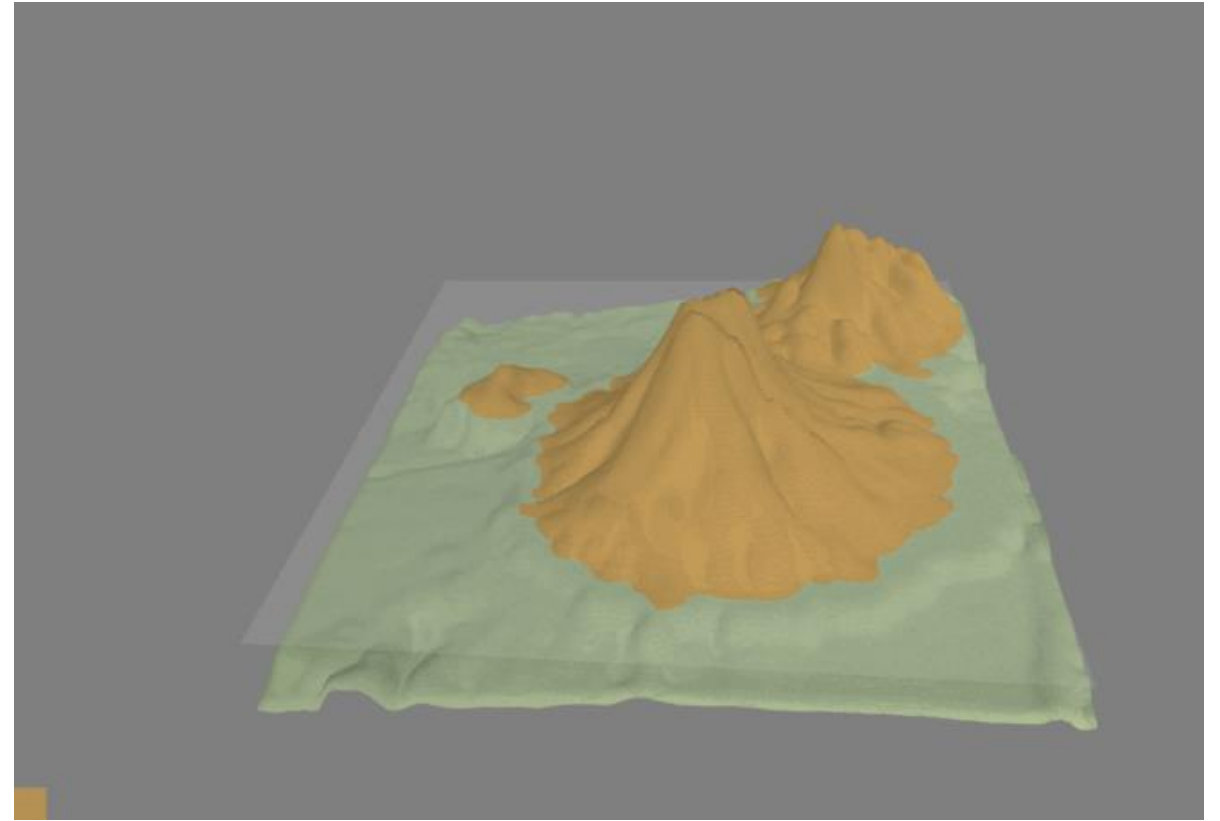
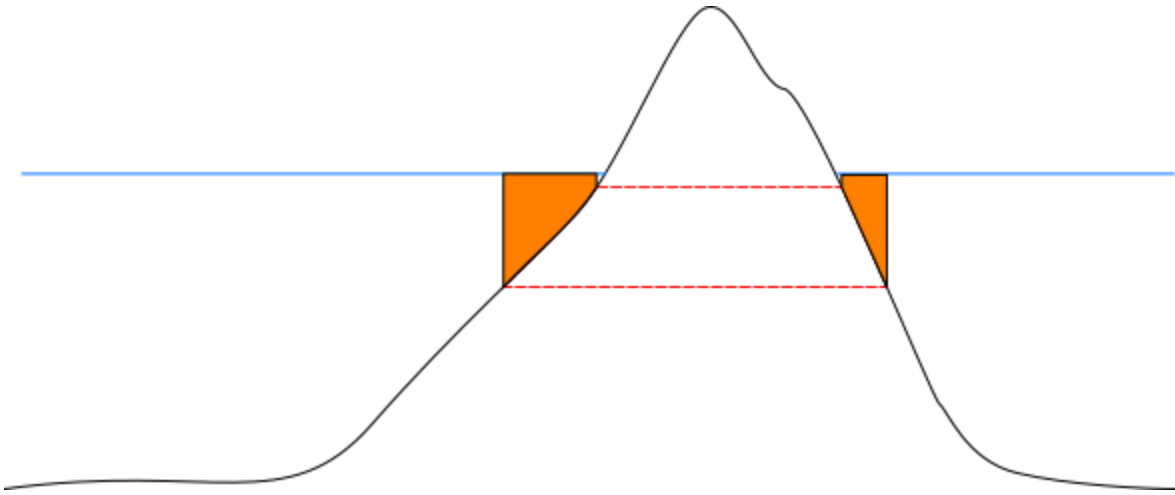
Des questions?

# Pipeline



# Coral barrier formation

- The Subsidence Theory (Darwin)



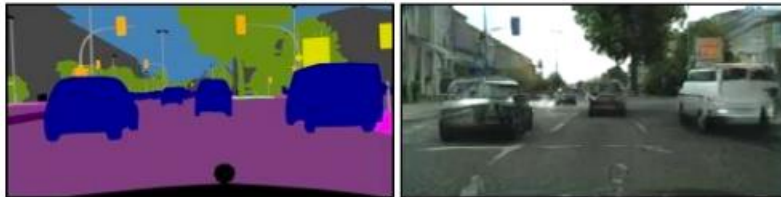
Darwin, Charles (1842), *The Structure and Distribution of Coral Reefs. Being the first part of the geology of the voyage of the Beagle, under the command of Capt. Fitzroy, R.N. during the years 1832 to 1836*



# Using cGAN

- Model pix2pix

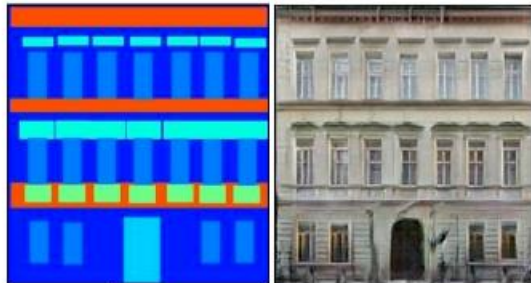
Labels to Street Scene



input

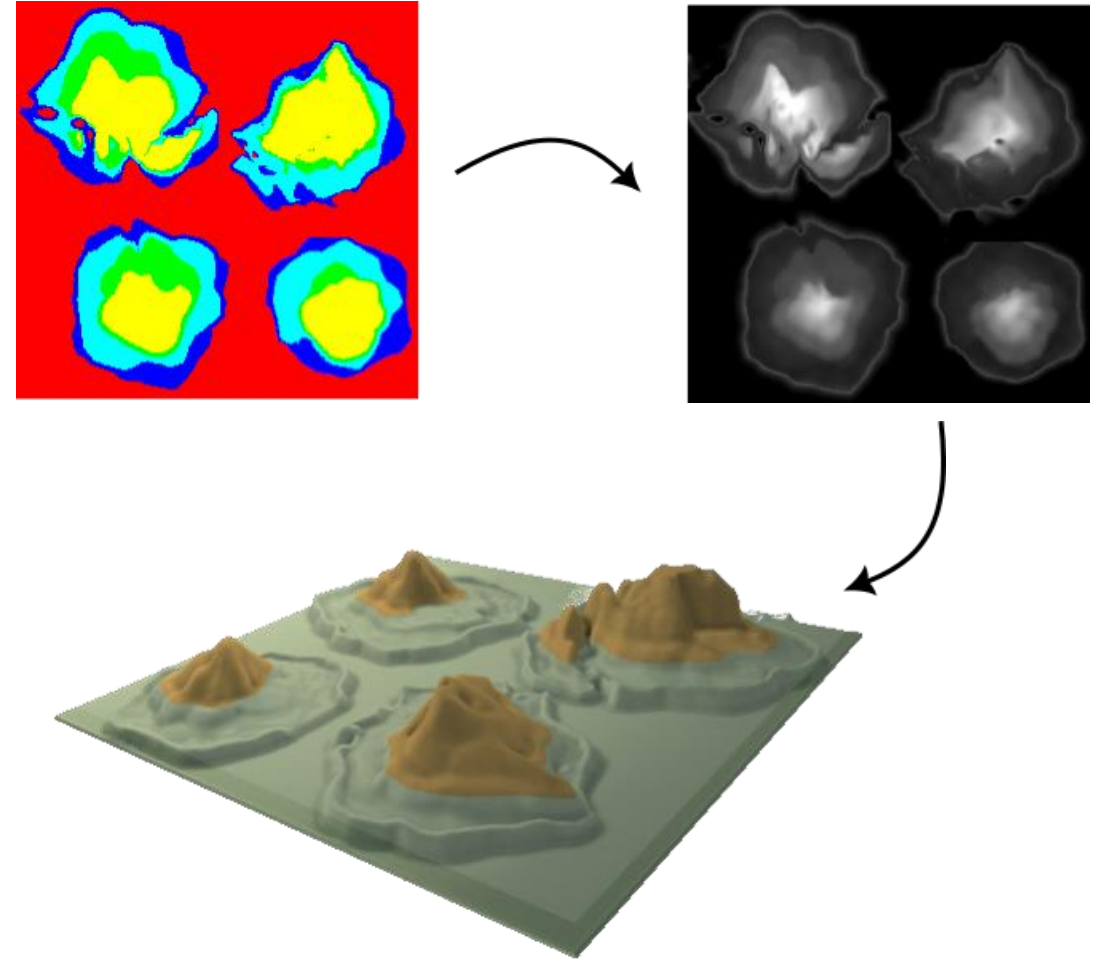
output

Labels to Facade

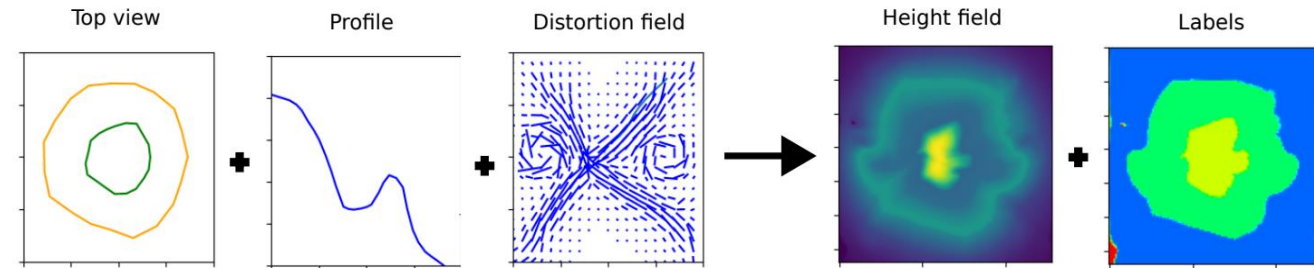


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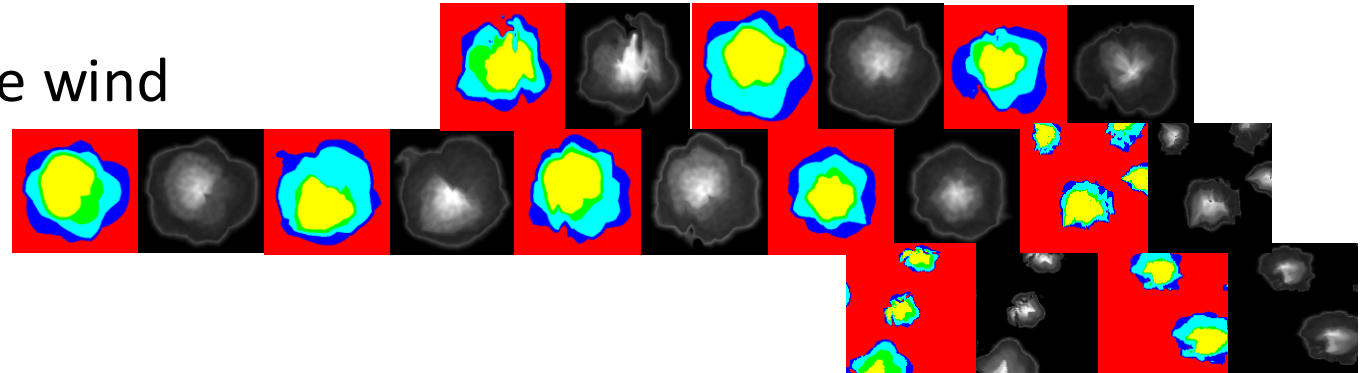
output



# Using cGAN



- Lack of labeled data -> Creation of synthetic dataset
- What we know :
  - Islands are globally circular
  - Deformations are caused by the wind
  - The reef surrounds the island
  - We know the profile



Pelletier, D. M. A. G. M. (2019). *Problèmes et méthodes de l'étude géomorphologique des récifs coralliens*.  
Purkis, S. J. (2018). Remote sensing tropical coral reefs: The view from above. *Annual Review of Marine Science*.  
Goldberg, W. M. (2016). *Atolls of the world: Revisiting the original checklist*. Atoll Research Bulletin  
Terry, J. P., & Goff, J. (2013). *One hundred and thirty years since Darwin : ' Reshaping ' the theory of atoll formation*.