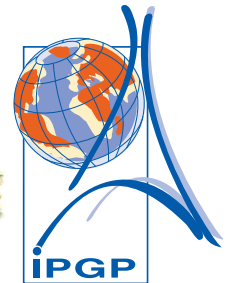
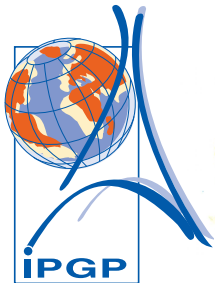


# *Morphodynamics of superimposed bedforms in a CA dune model*

*Characteristic length scale for the nucleation of dunes*

Clément Narteau

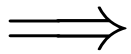


Institut de Physique du Globe de Paris

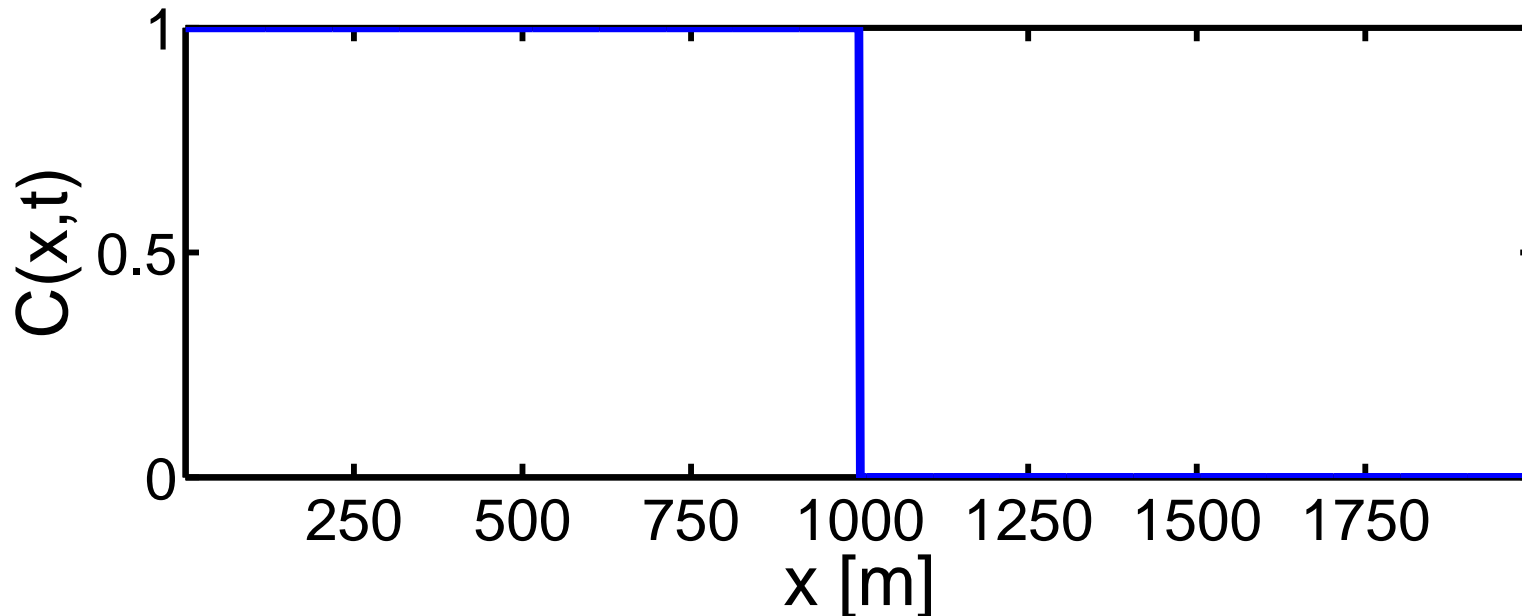
A preamble ...

## *Deterministic approach for diffusion*

$$\frac{\partial C(x, t)}{\partial t} = D \frac{\partial^2 C(x, t)}{\partial x^2}$$

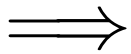


$$C(x, t) = A \operatorname{erf} \left( \frac{x}{\sqrt{2Dt}} \right) + B$$

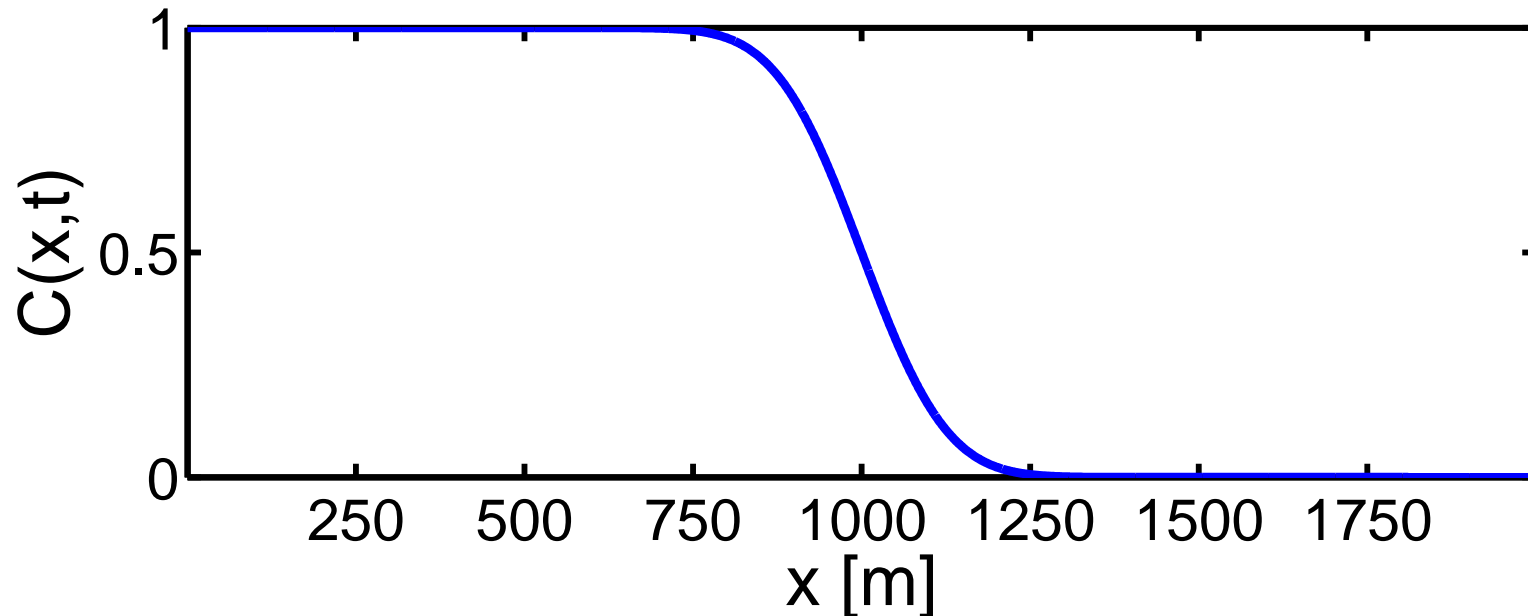


## *Deterministic approach for diffusion*

$$\frac{\partial C(x, t)}{\partial t} = D \frac{\partial^2 C(x, t)}{\partial x^2}$$

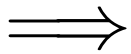


$$C(x, t) = A \operatorname{erf} \left( \frac{x}{\sqrt{2Dt}} \right) + B$$

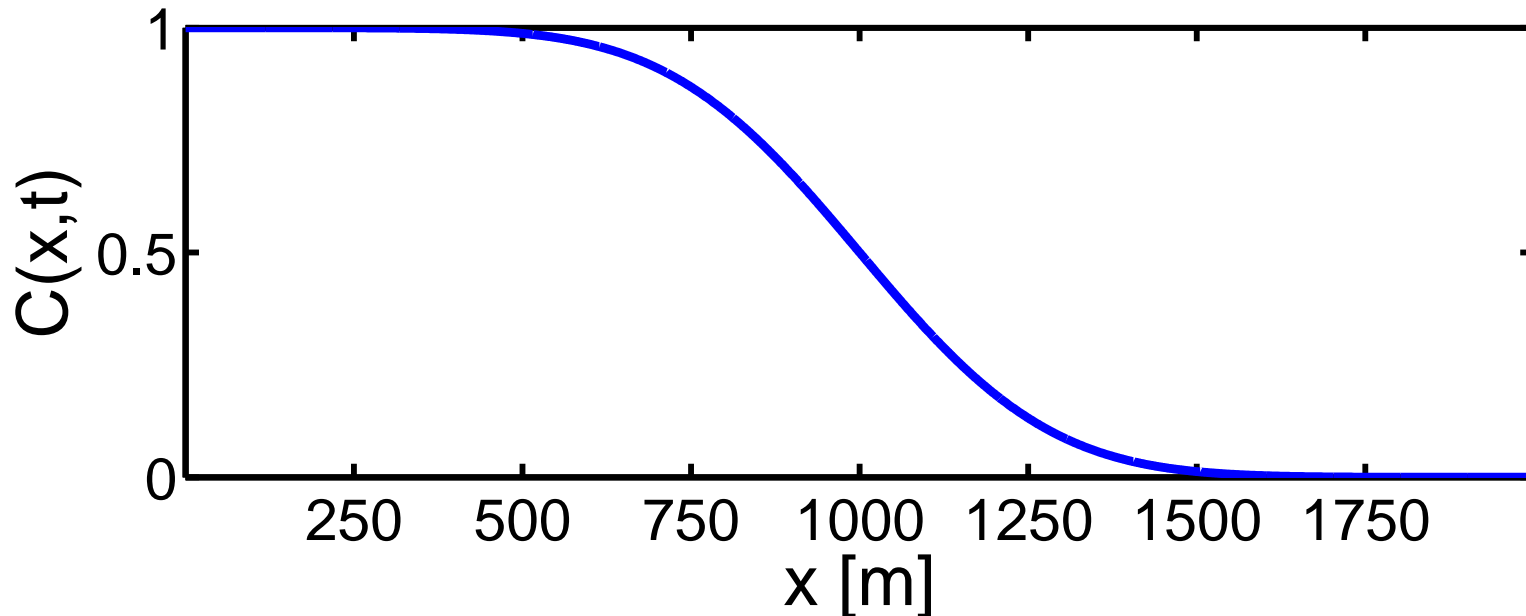


## *Deterministic approach for diffusion*

$$\frac{\partial C(x, t)}{\partial t} = D \frac{\partial^2 C(x, t)}{\partial x^2}$$

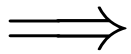


$$C(x, t) = A \operatorname{erf} \left( \frac{x}{\sqrt{2Dt}} \right) + B$$

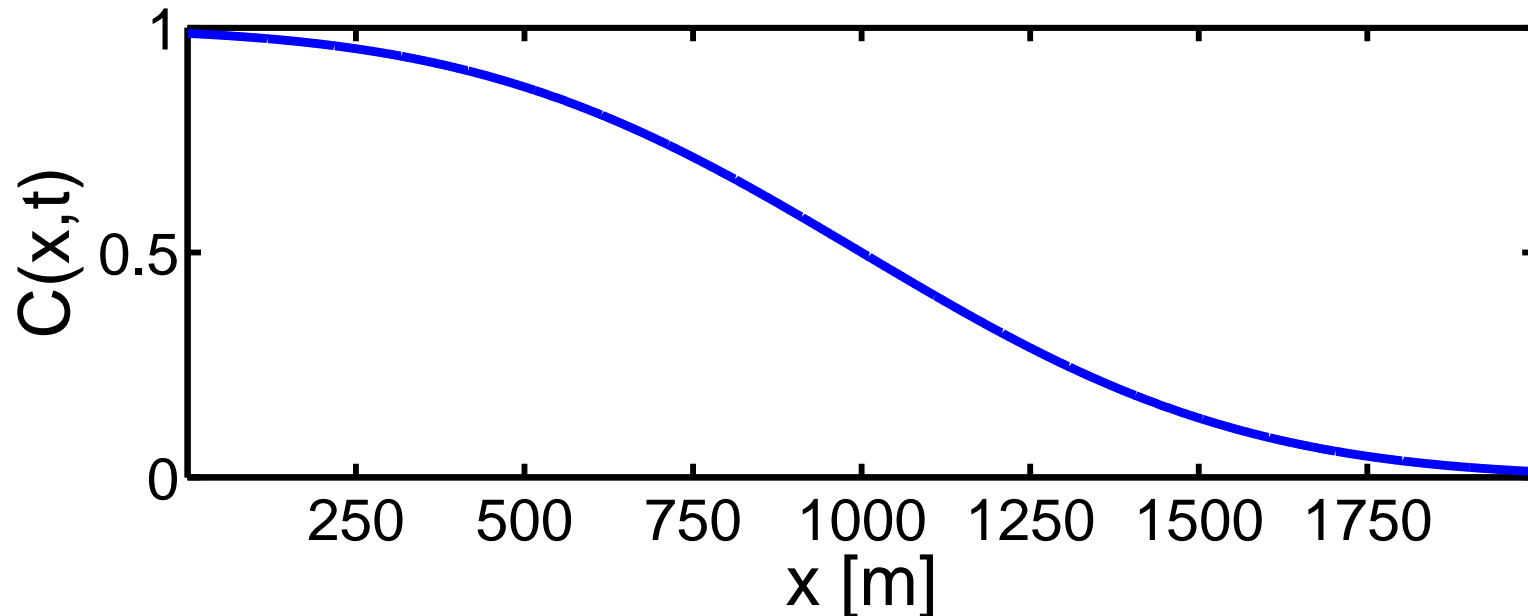


## *Deterministic approach for diffusion*

$$\frac{\partial C(x, t)}{\partial t} = D \frac{\partial^2 C(x, t)}{\partial x^2}$$



$$C(x, t) = A \operatorname{erf} \left( \frac{x}{\sqrt{2Dt}} \right) + B$$

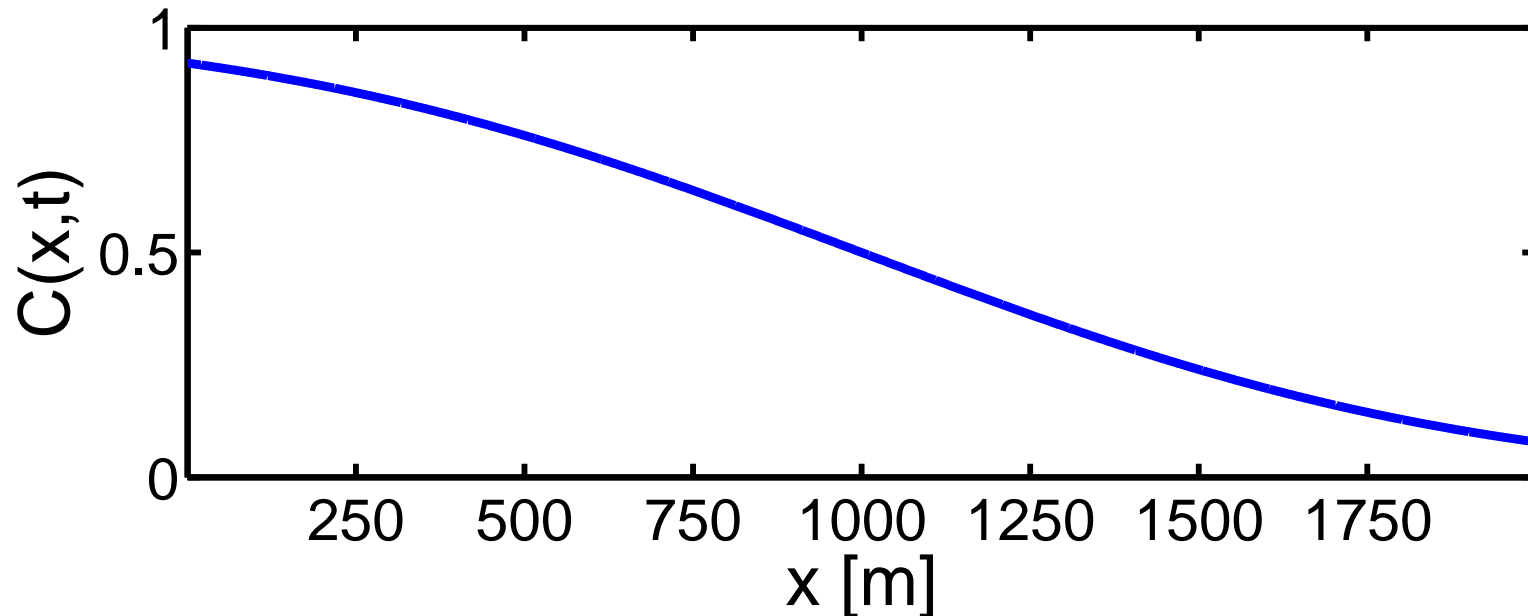


## *Deterministic approach for diffusion*

$$\frac{\partial C(x, t)}{\partial t} = D \frac{\partial^2 C(x, t)}{\partial x^2}$$

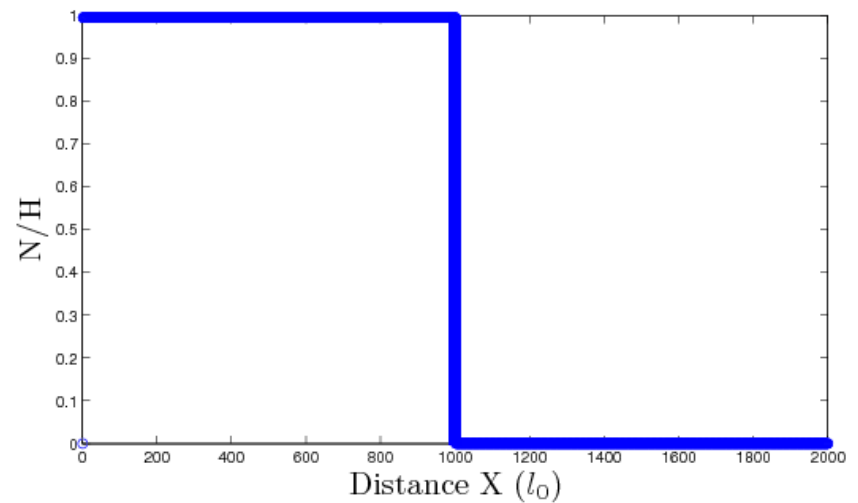
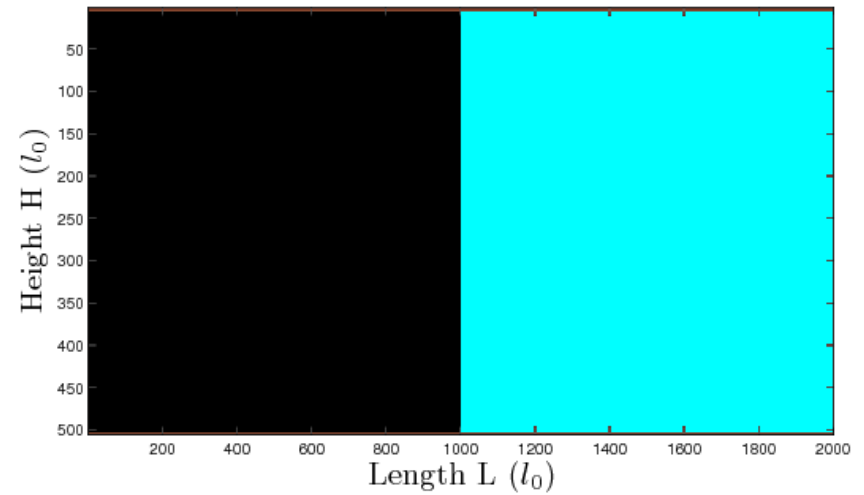
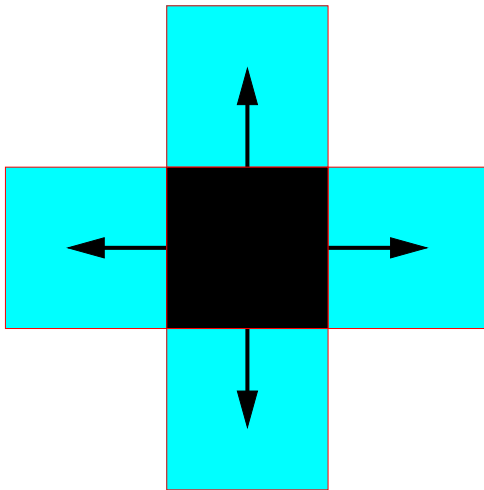
$\Rightarrow$

$$C(x, t) = A \operatorname{erf} \left( \frac{x}{\sqrt{2Dt}} \right) + B$$



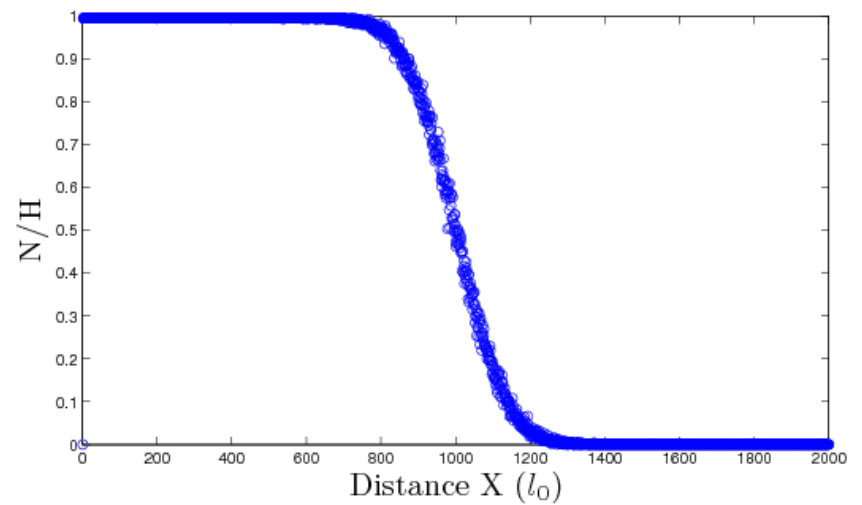
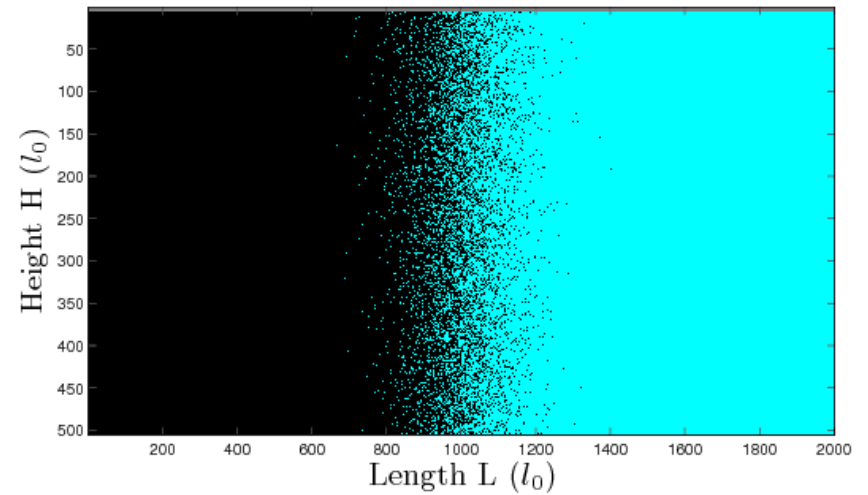
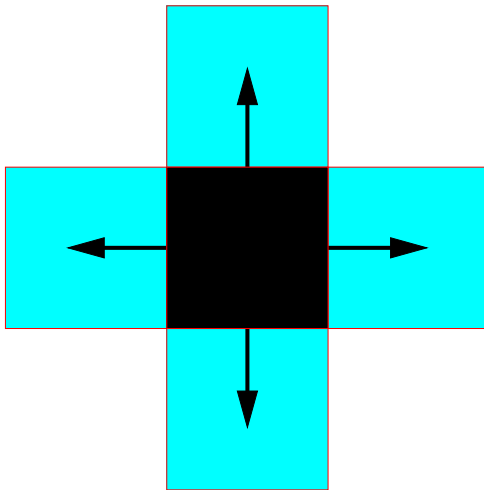
# Stochastic approach for diffusion

Brownian motion



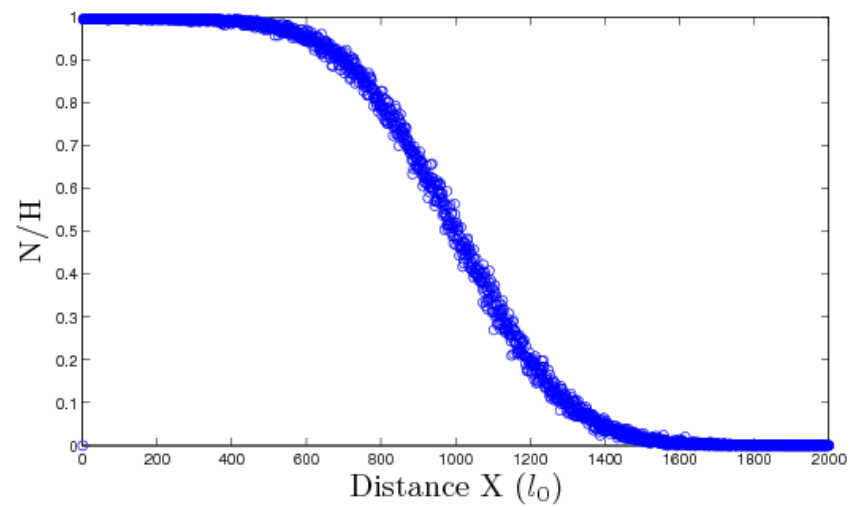
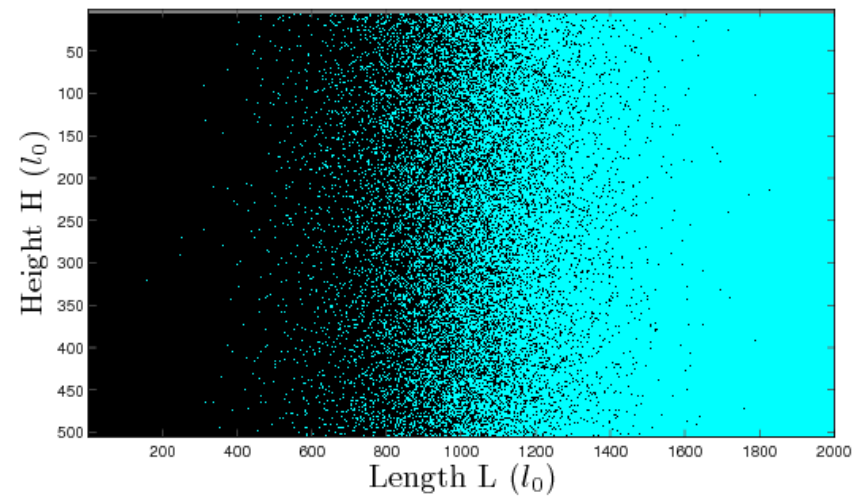
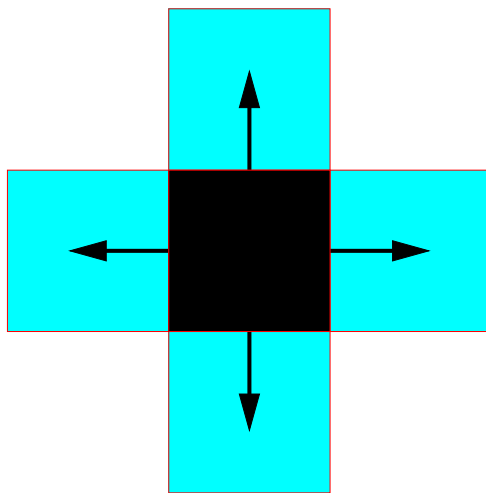
# Stochastic approach for diffusion

Brownian motion



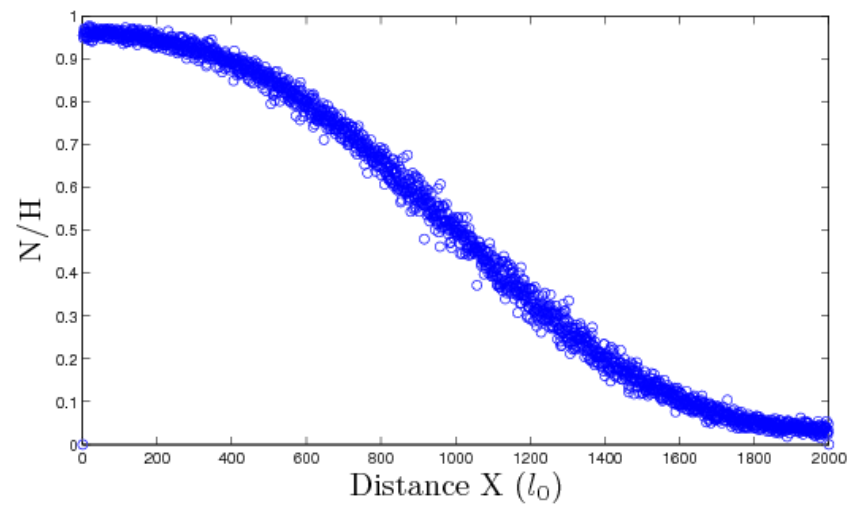
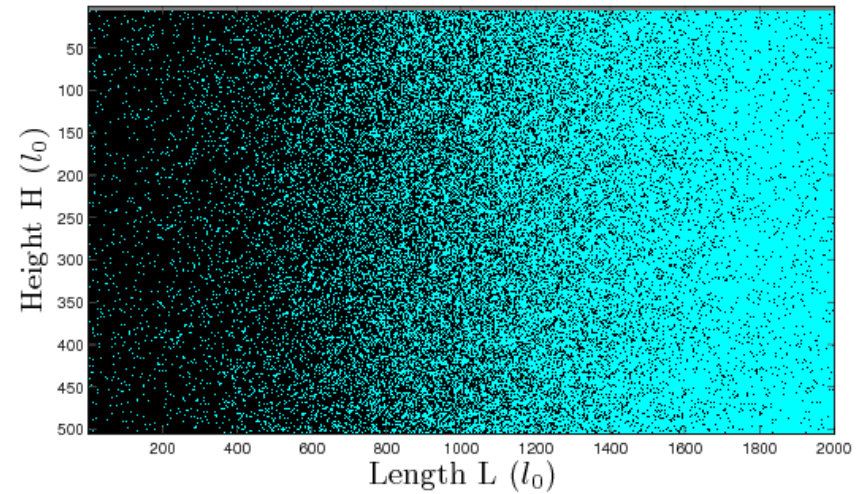
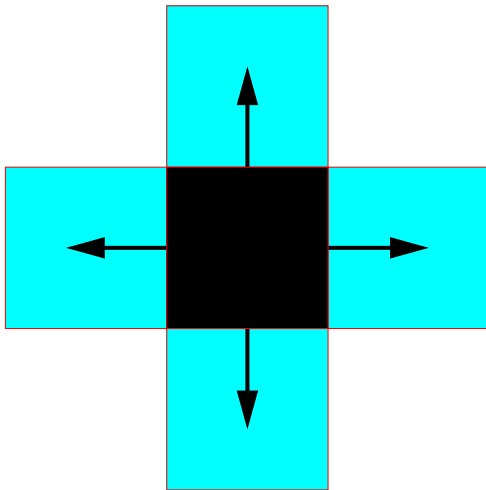
# Stochastic approach for diffusion

Brownian motion



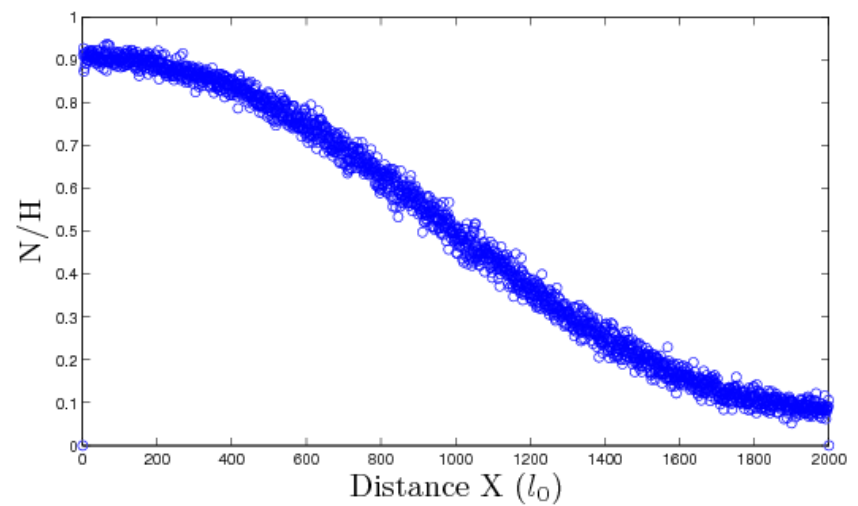
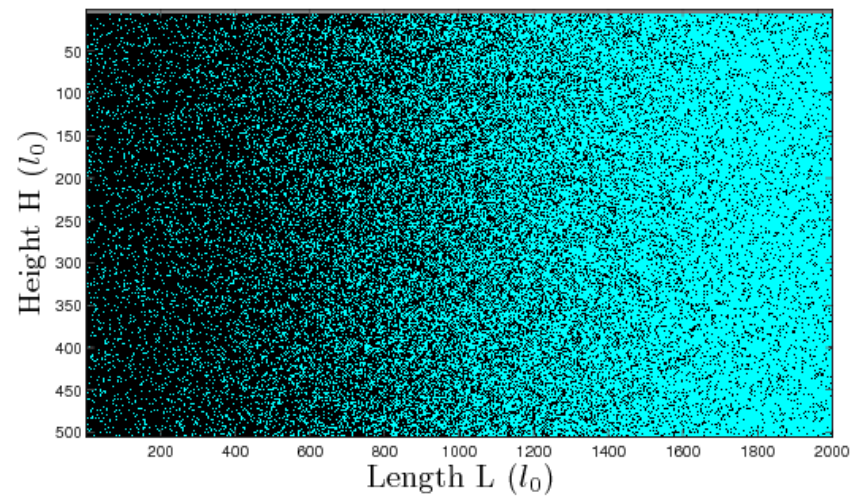
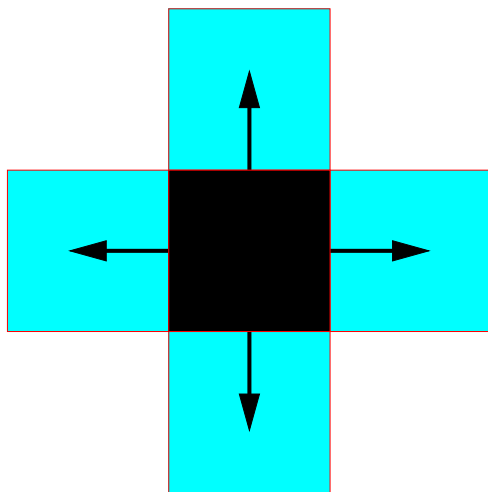
# Stochastic approach for diffusion

Brownian motion



# *Stochastic approach for diffusion*

Brownian motion



Deterministic approach for diffusion

$\approx$

Stochastic approach for diffusion

Asymptotic behaviours of different sets of partial differential equations

$$\frac{\partial h}{\partial t} = F(q, S, \dots)$$
$$\frac{\partial q}{\partial x} = G(h, S, \dots)$$

**Scaling**

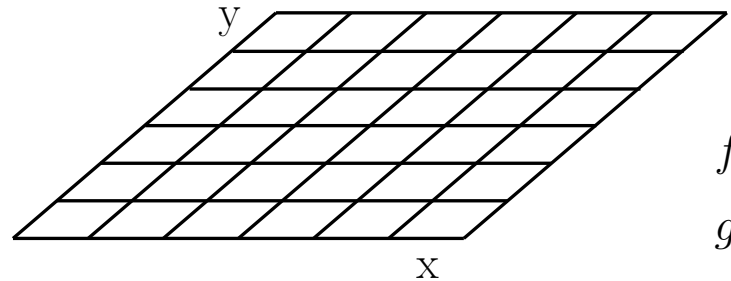
A cellular automaton approach

- A grid of specified shape.
- A collection of cells with different states.
- Rules based on the states of neighboring cells.

**Emergence**

Traditional cellular automata in geophysics

$$x \in \mathbb{N}$$
$$y \in \mathbb{N}$$
$$\Delta t = cte$$

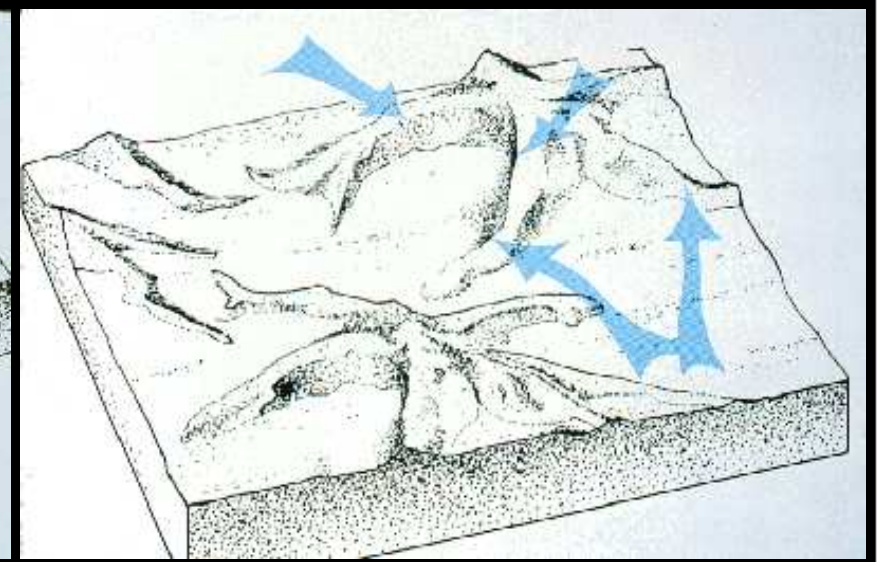
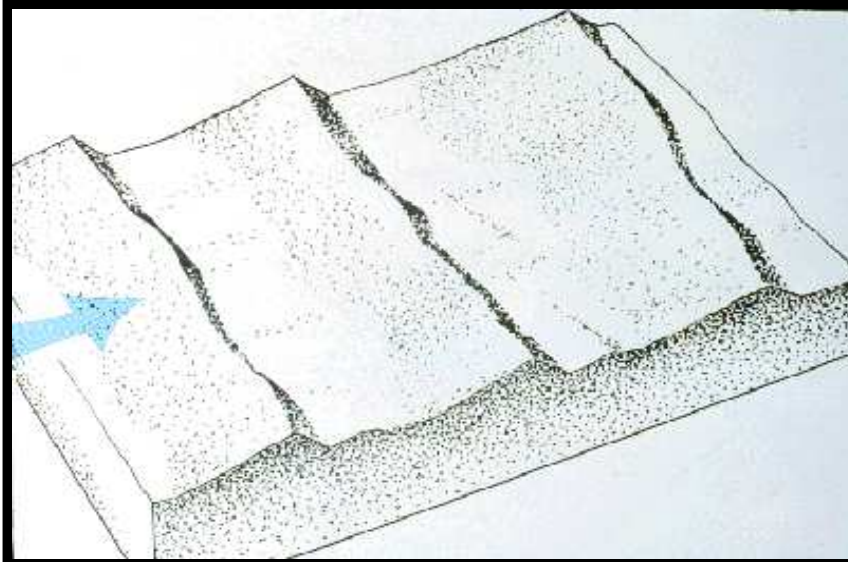
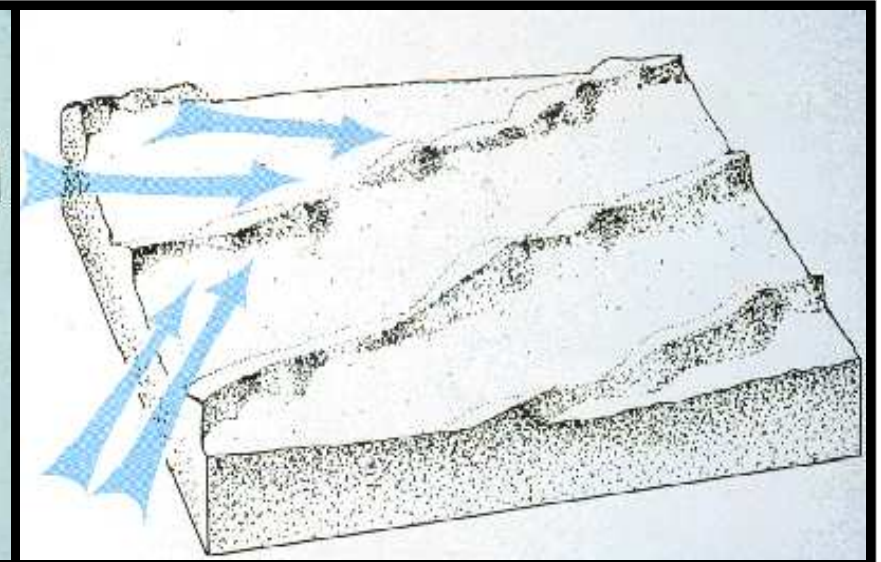
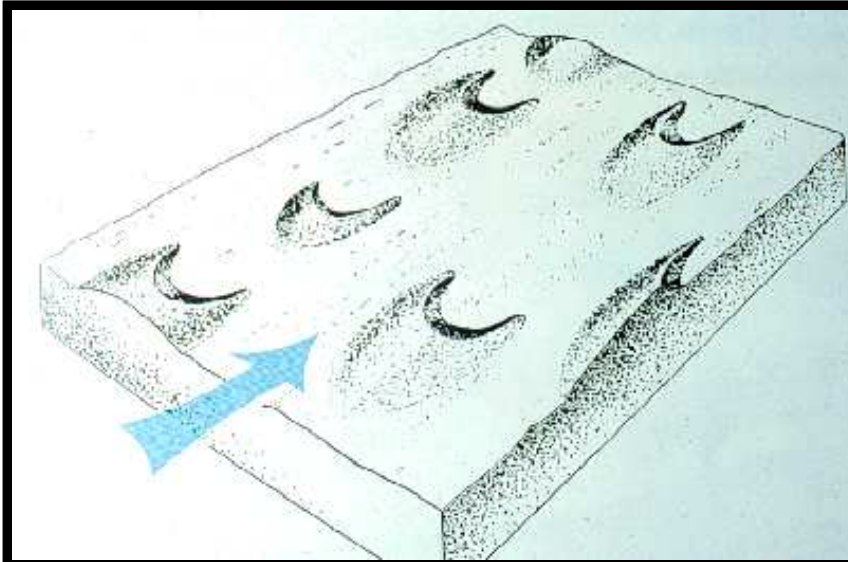


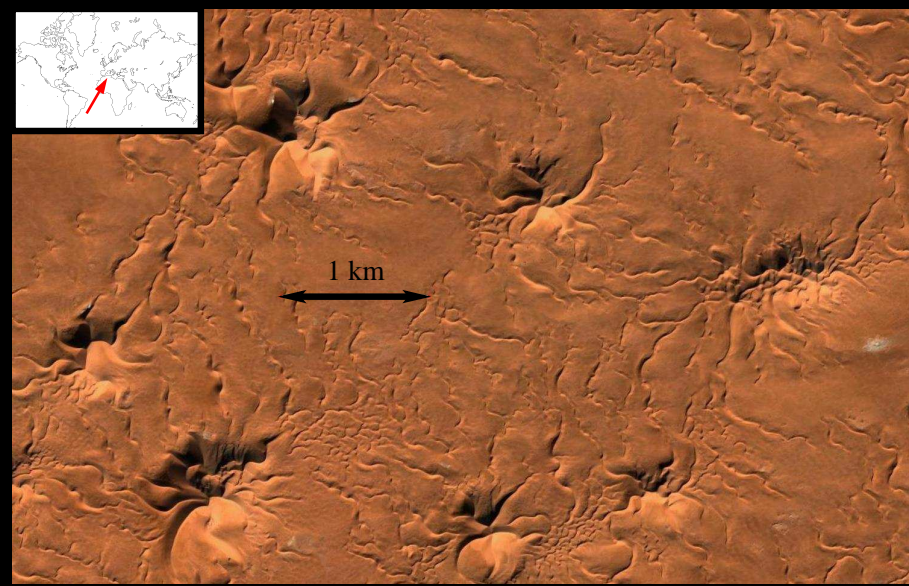
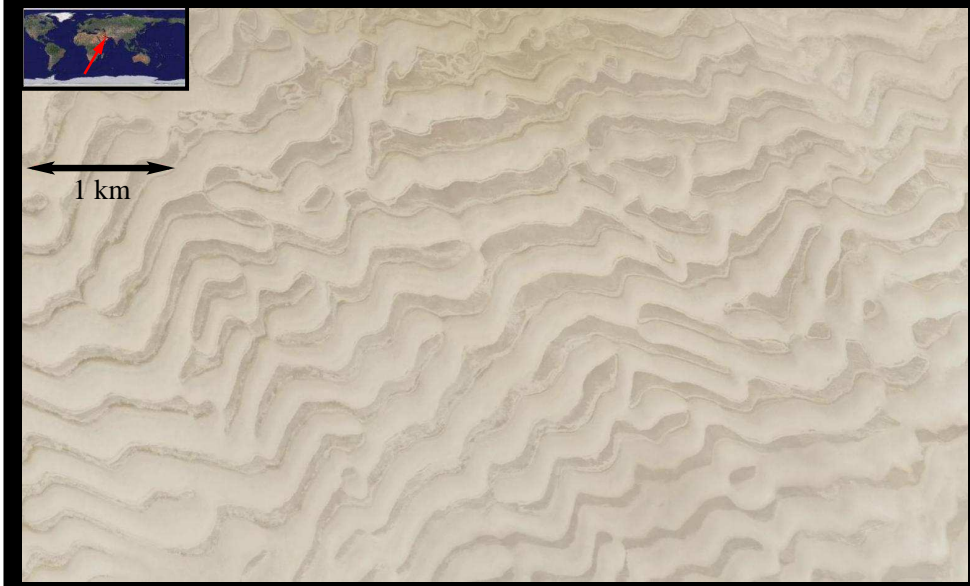
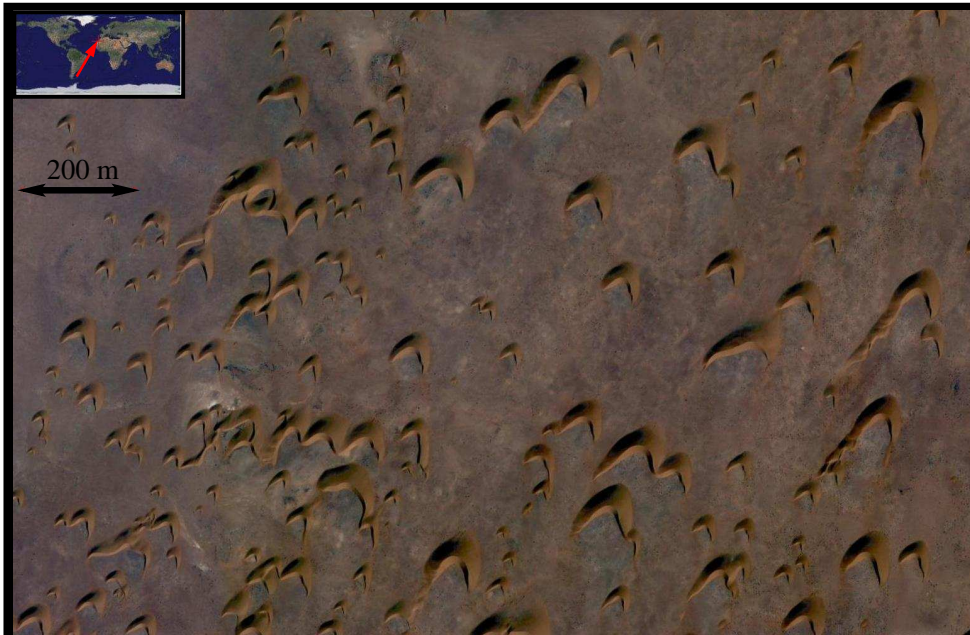
**Emergence ?**  
**Scaling ?**

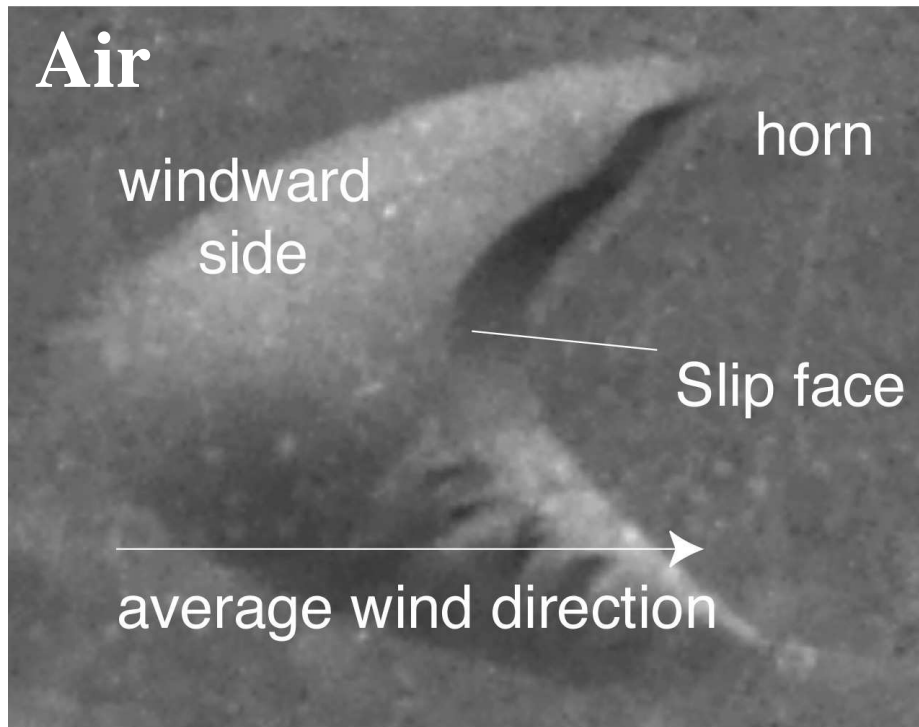
$$f(h(x, y, t), q(x, y, t)) \longrightarrow h(x, y, t + \Delta t)$$
$$g(h(x, y, t), q(x, y, t)) \longrightarrow q(x, y, t + \Delta t)$$

Let us develop new and more theoretical CAs to combine more efficiently scaling and emergence

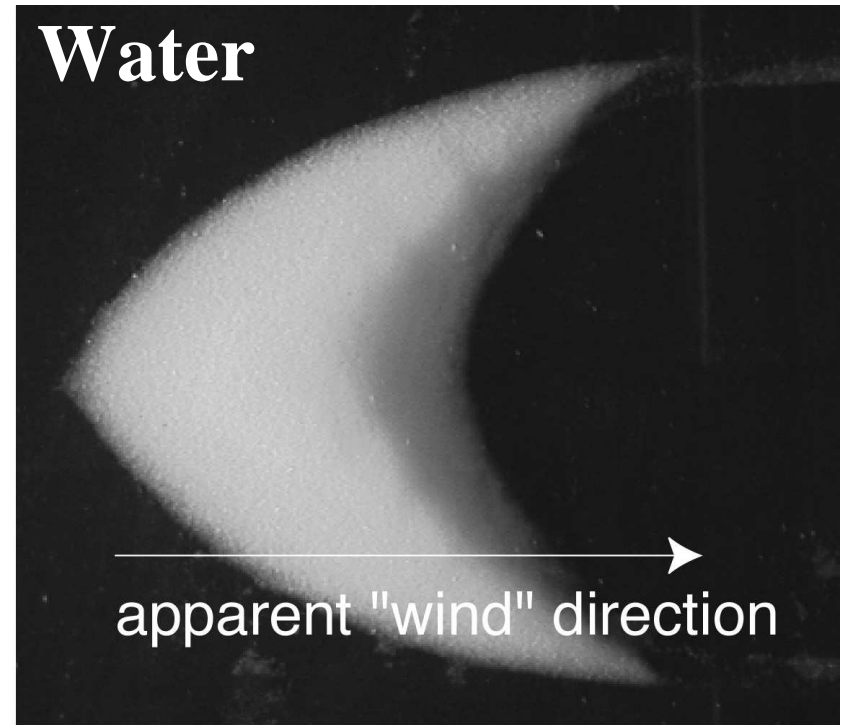
# *Different types of sand dunes*







50 m



5 cm



# *A minimum size for dunes*

$$l_{drag} = \frac{\rho_s}{\rho_f} d_s$$

$\rho_f$  fluid density.

$\rho_s$  sediment density.

$d_s$  grain diameter.

# *The physics of aeolian dunes*

$h$  the height profile

$q$  the sand flux per unit width

$$\frac{\partial h}{\partial t} = - \frac{\partial q}{\partial x}$$

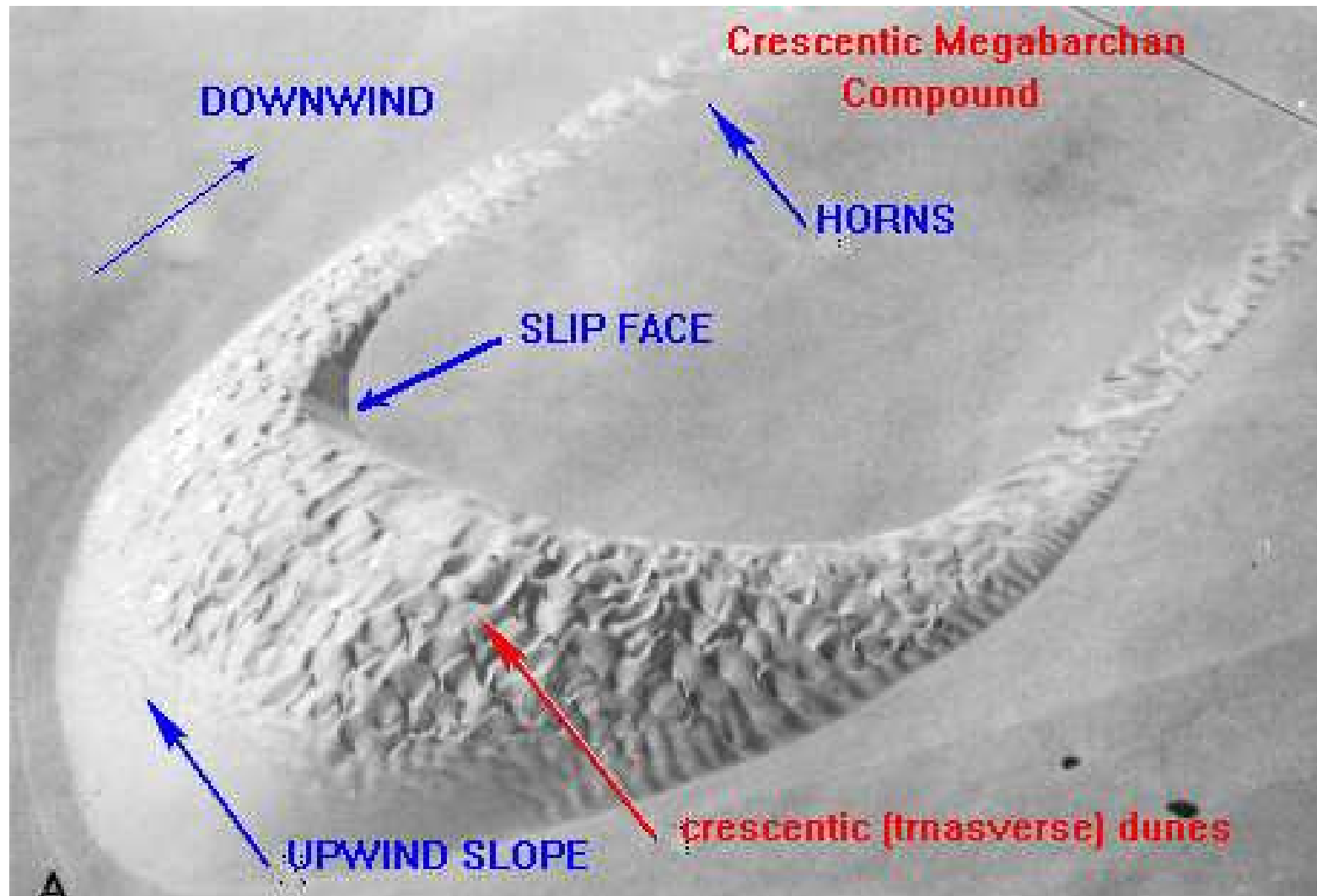
$Q_{sat}$  the saturated sand flux

$l_{sat}$  the saturation length.

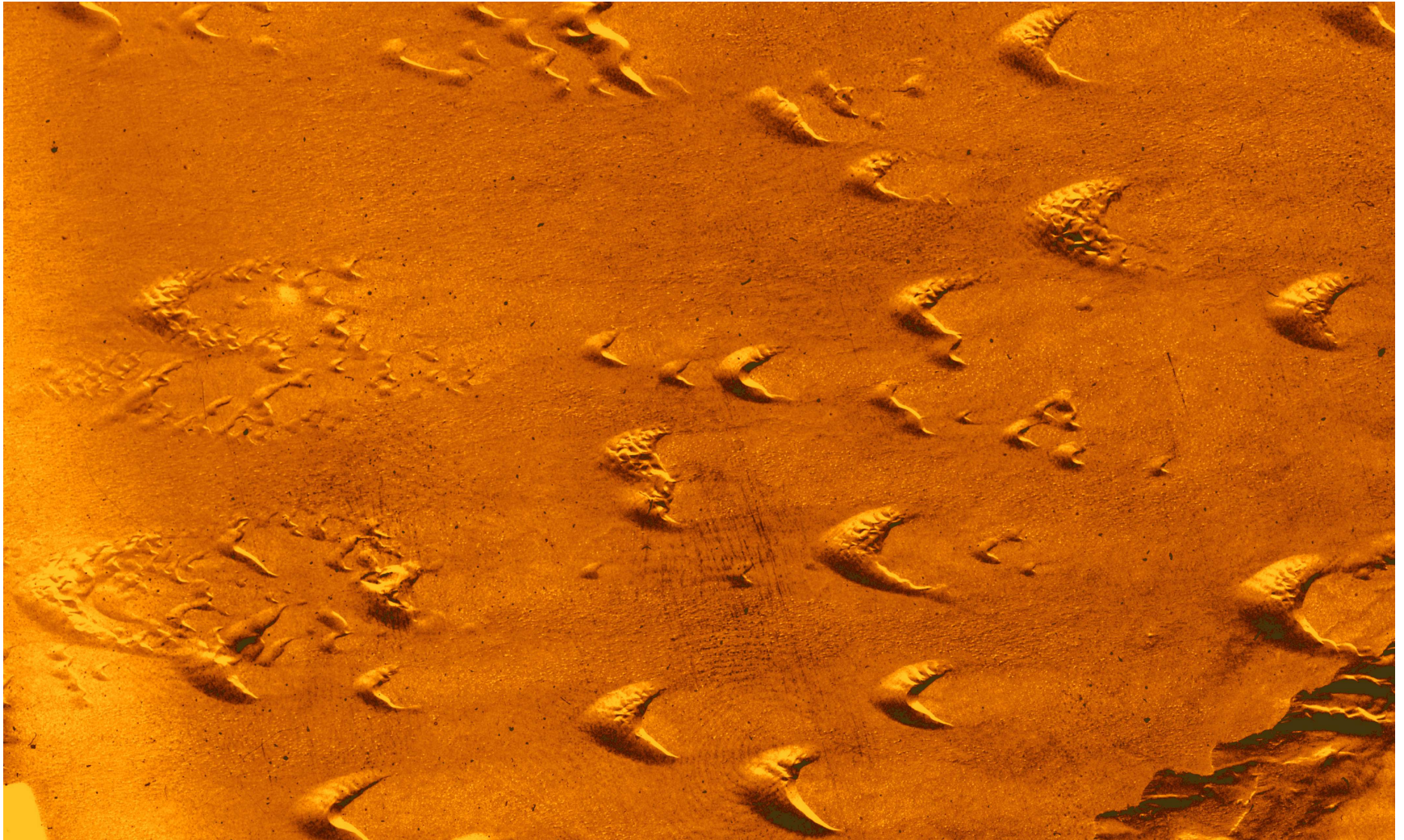
$$\frac{\partial q}{\partial x} \sim \frac{Q_{sat} - q}{l_{sat}}$$

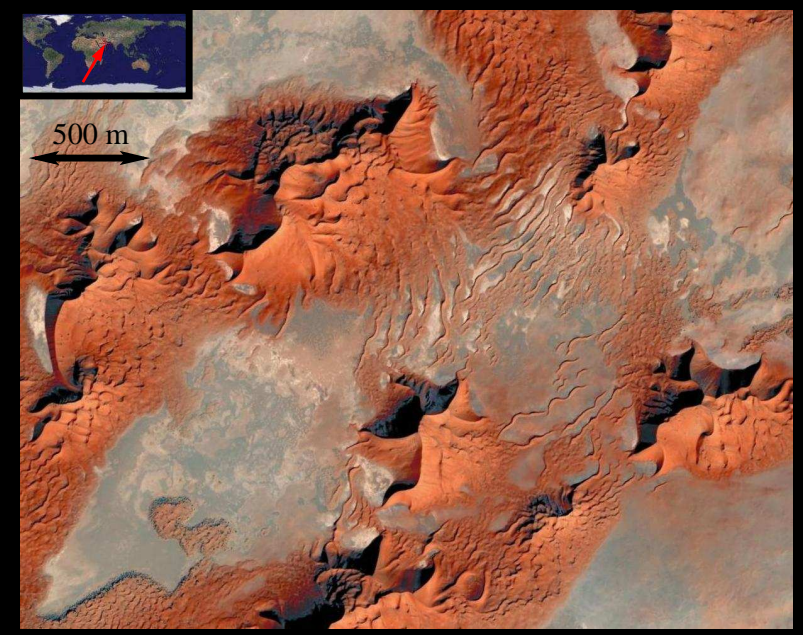
An elegant formalism which gives solutions that can be used as a benchmark for numerical codes.

# *Superimposed dune patterns*



# *Superimposed dune patterns*

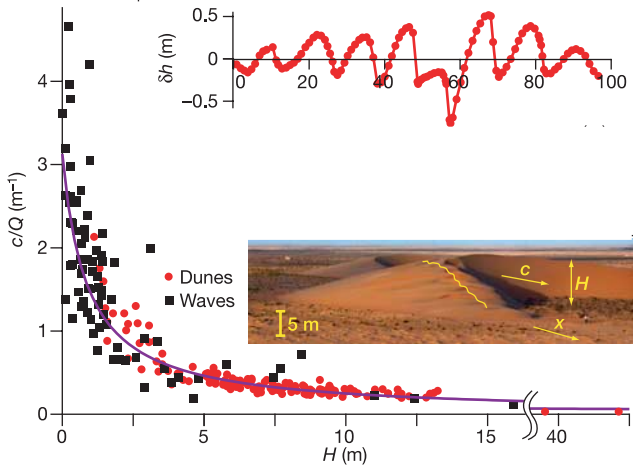


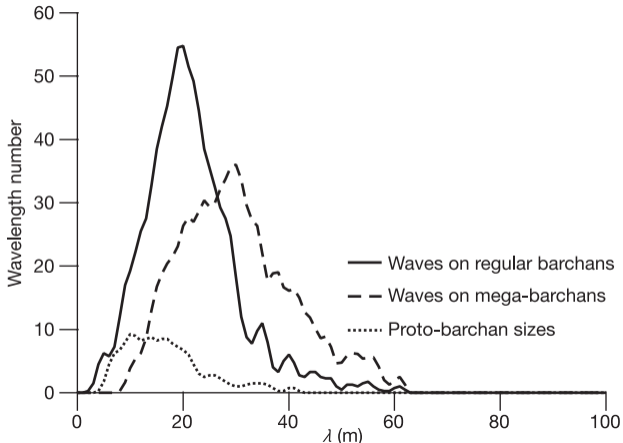


# *Superimposed dune patterns*

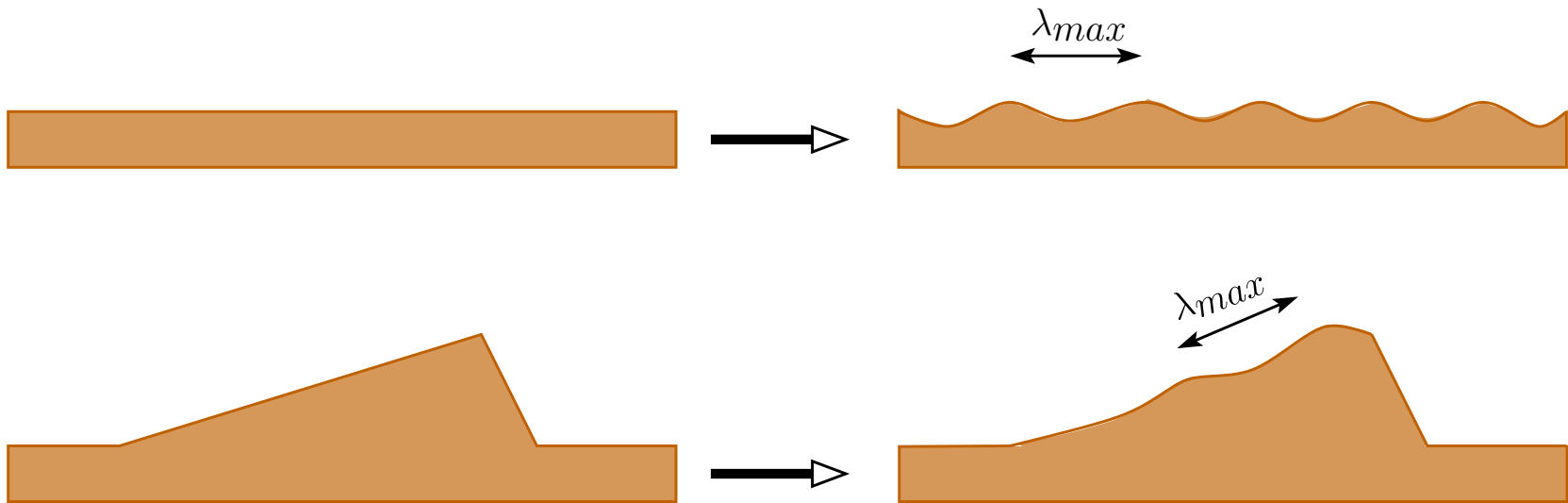


Elberithi et al. (2005)





# *A sand wave instability*



Characteristic length scale for the nucleation of dunes

$$\lambda_{max} = 20 \text{ m}$$

on a flat sand bed and dunes (if they are big enough).

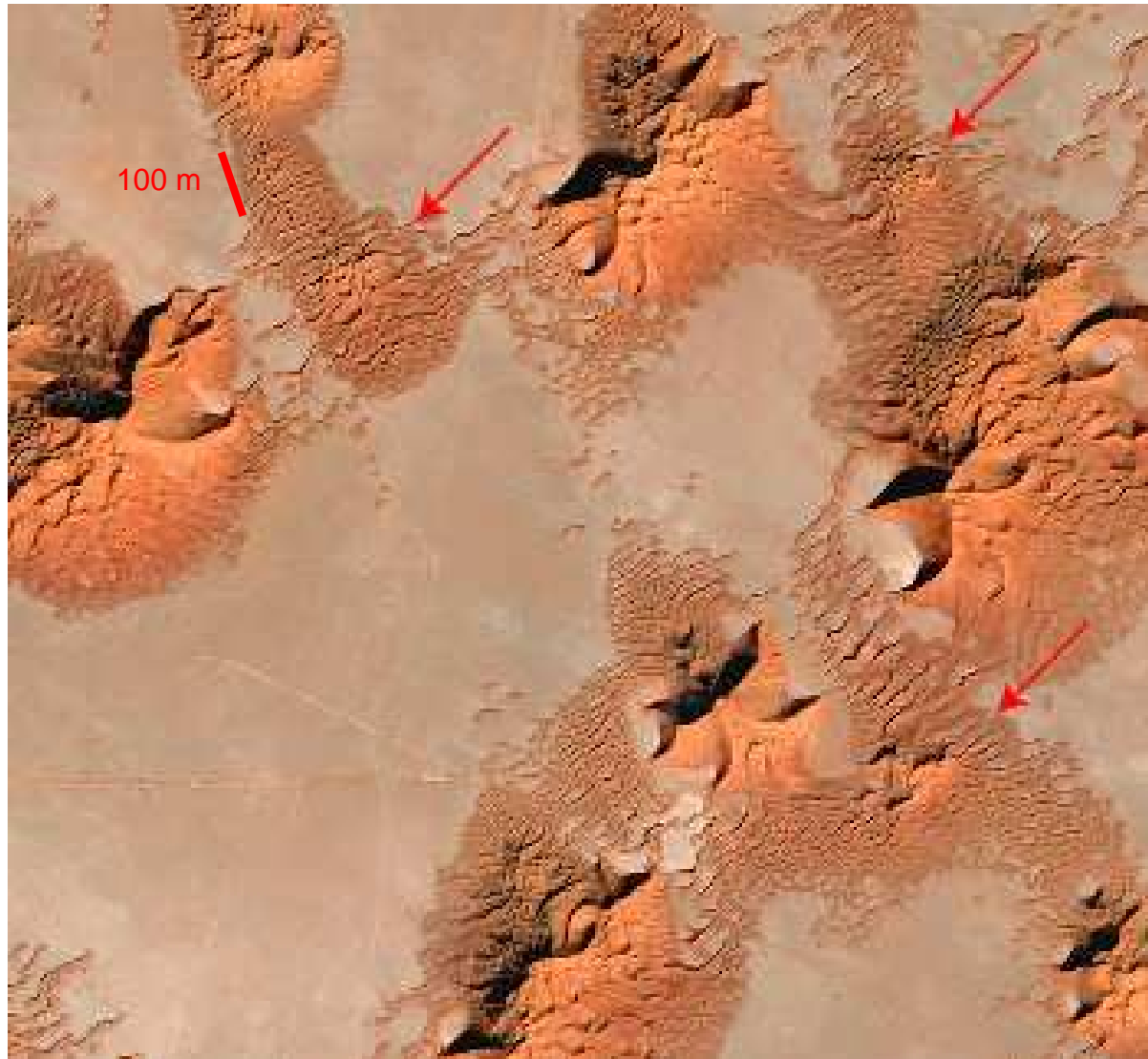
# *Superimposed dune patterns*



# *Superimposed dune patterns*



# *Superimposed dune patterns*



# *Superimposed dune patterns*

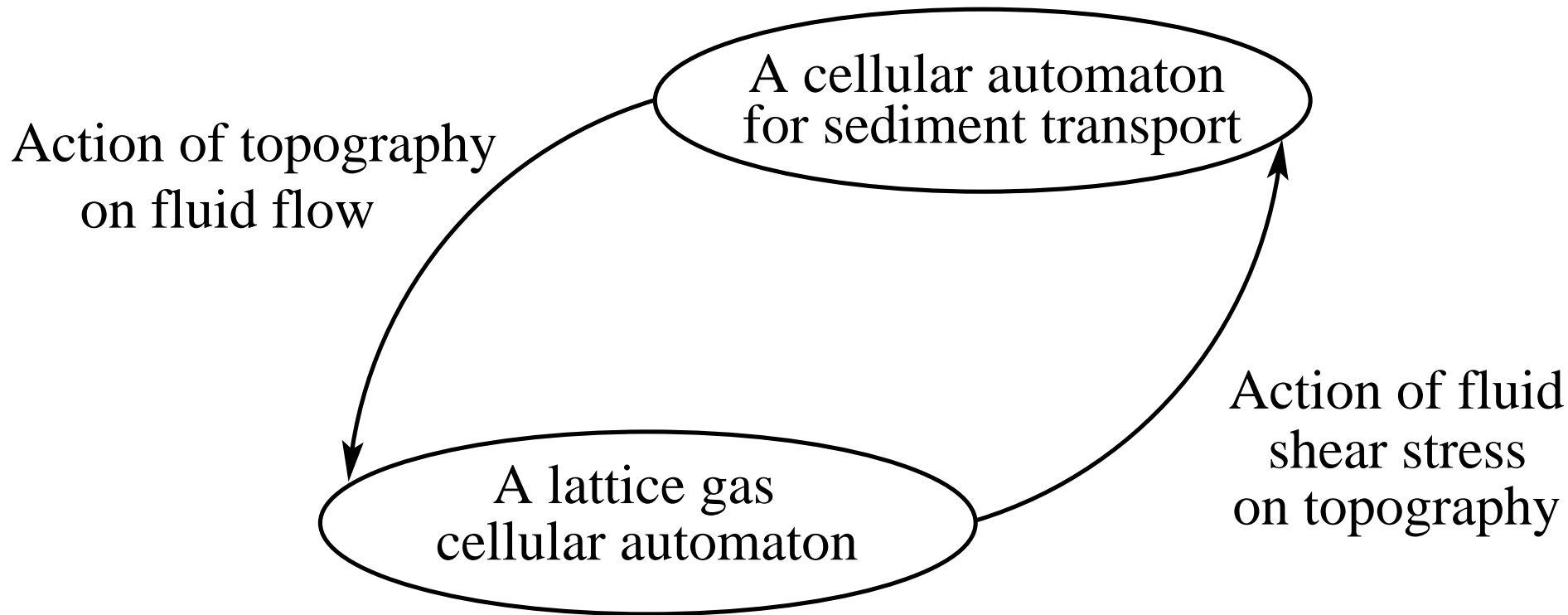


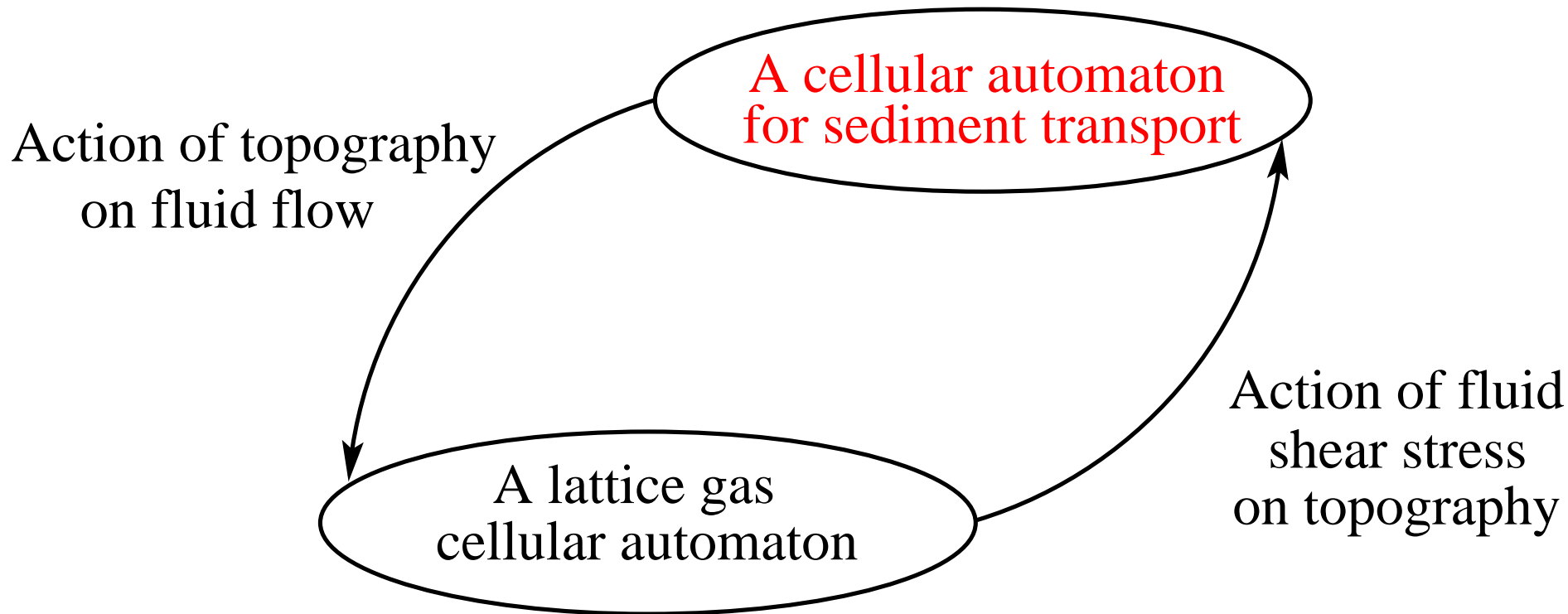
- A large set of observations
- Qualitative descriptions of dune shapes
- Elegant physical formalisms

- Pattern selection
- Population dynamics
- A quantitative analysis of sediment transport

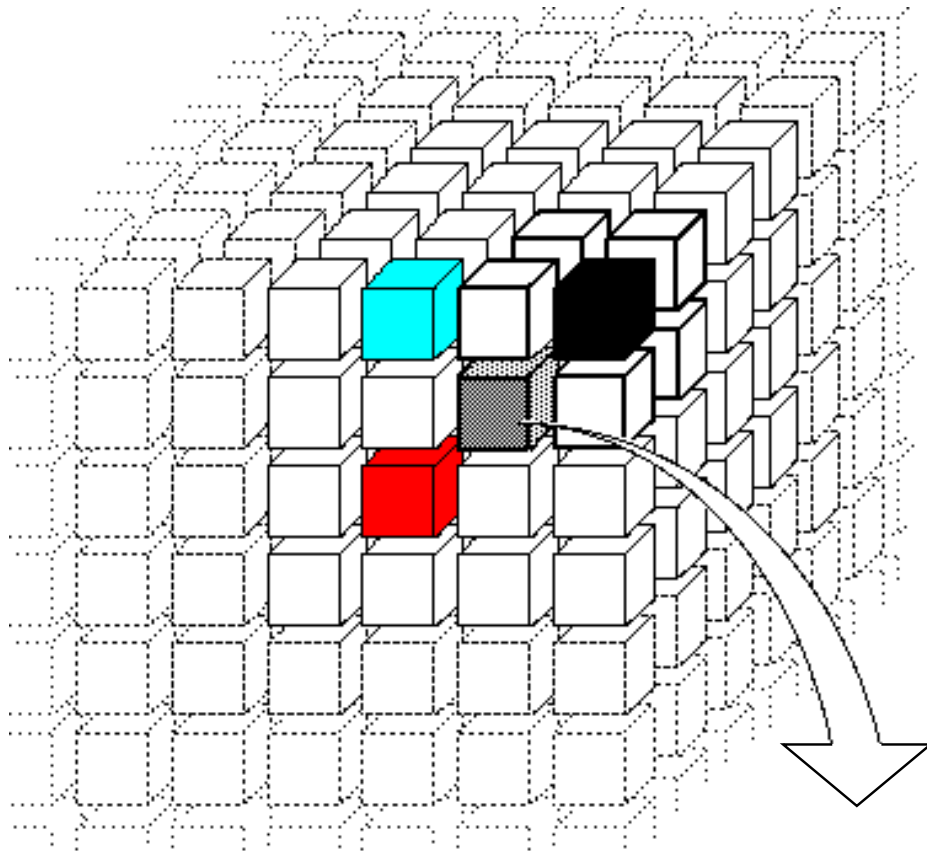


The physics of sand dunes  
as a complex system





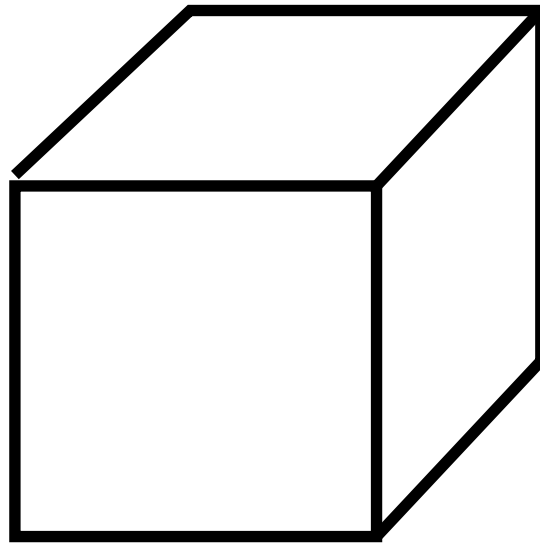
# *Cellular automaton for sediment transport*



$C_{i,j,k}$

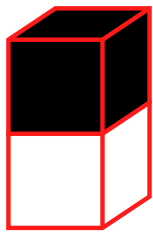
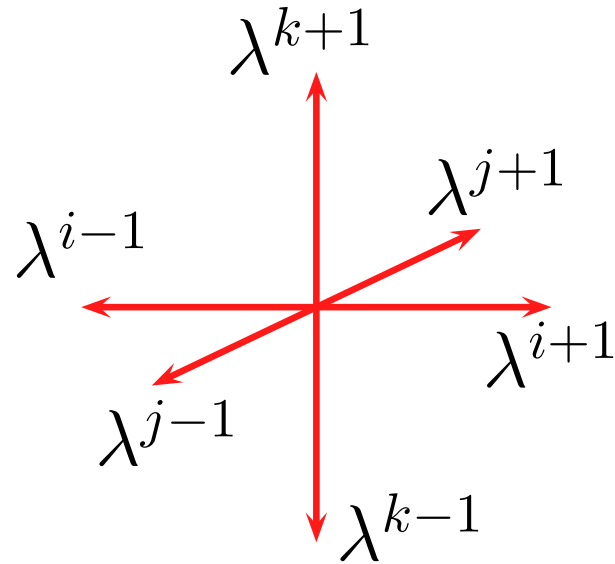
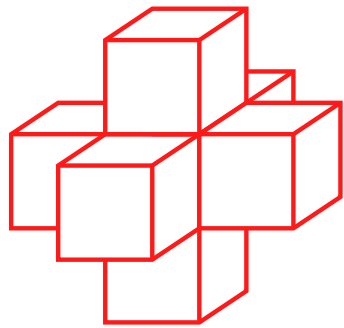
- A 3 dimensional model.
- State variables.
- Nearest neighbour interactions.
- Individual physical processes.

# *An elementary length scale*

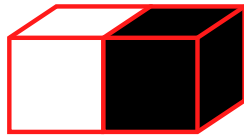


$l_0$

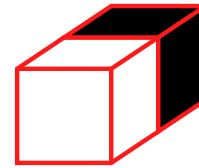
# Nearest neighbour interactions



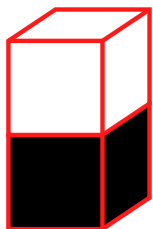
$\lambda^{k-1}$



$\lambda^{i-1}$



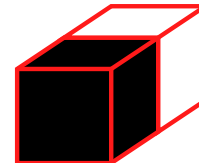
$\lambda^{j-1}$



$\lambda^{k+1}$

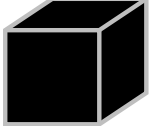
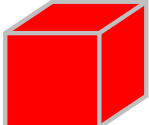



$\lambda^{i+1}$

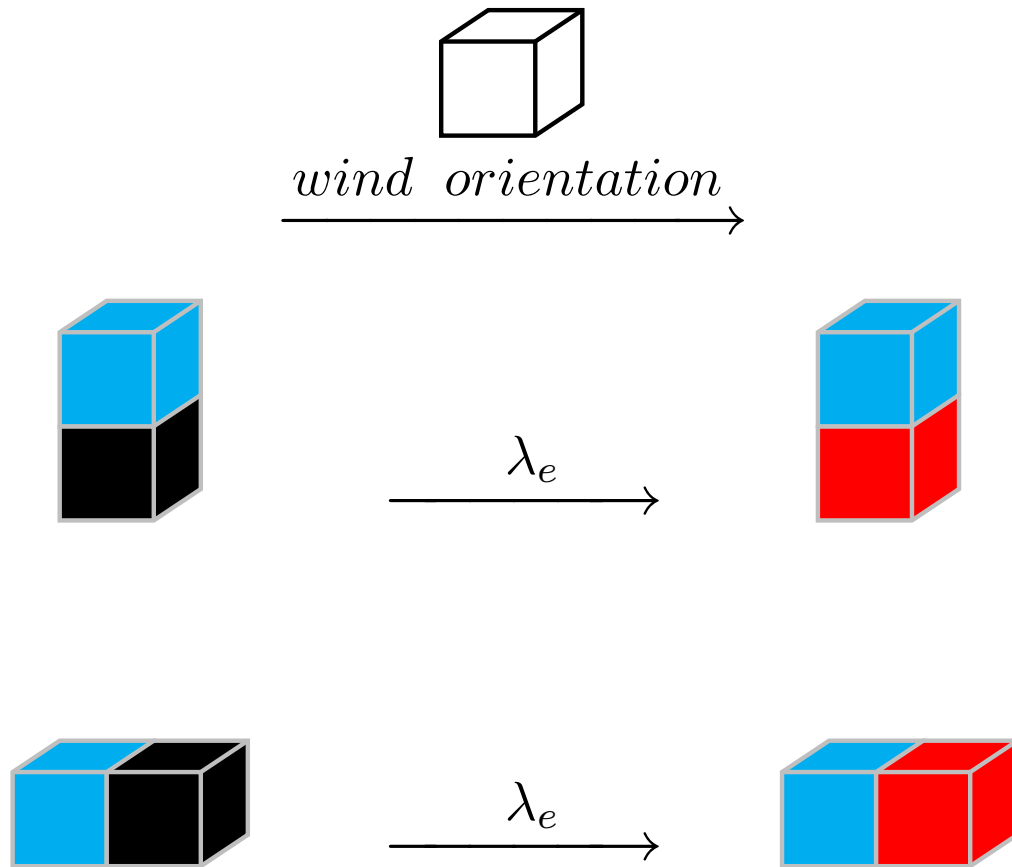


$\lambda^{j+1}$

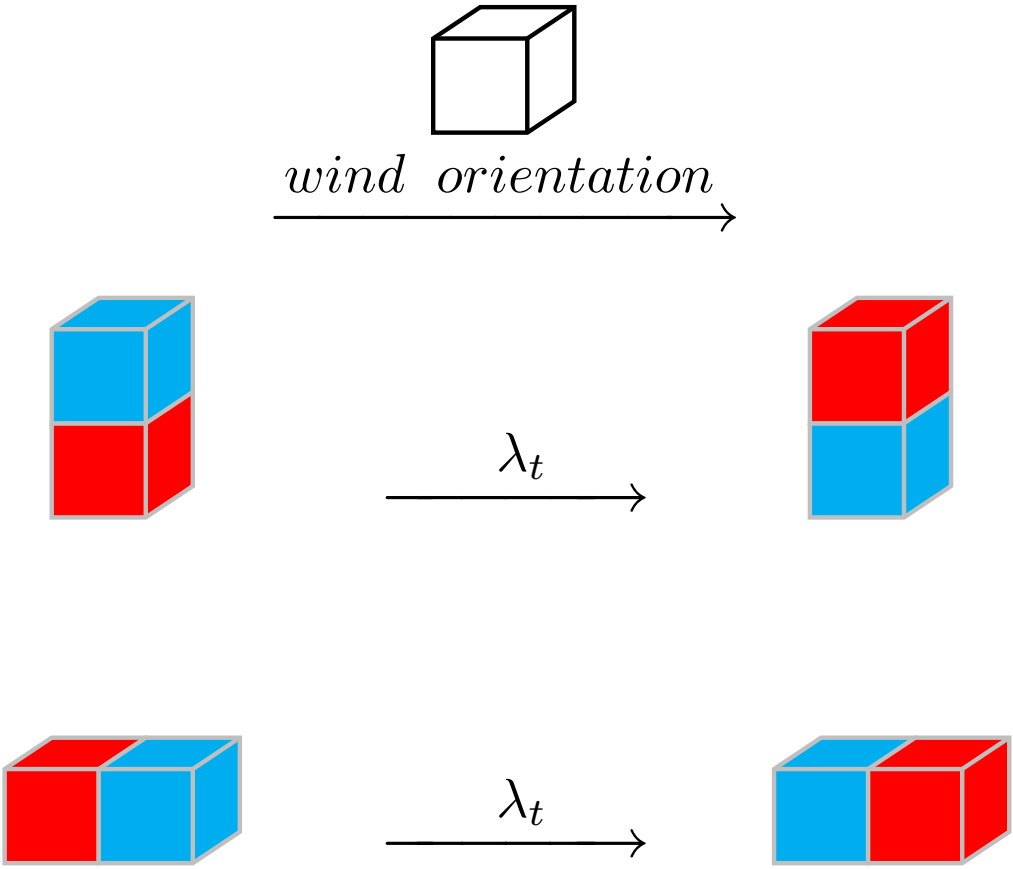
# *Physical states*

Granular material	 Grain
Mobilized granular material	 Mobilized grain
Fluid flow	 Fluid

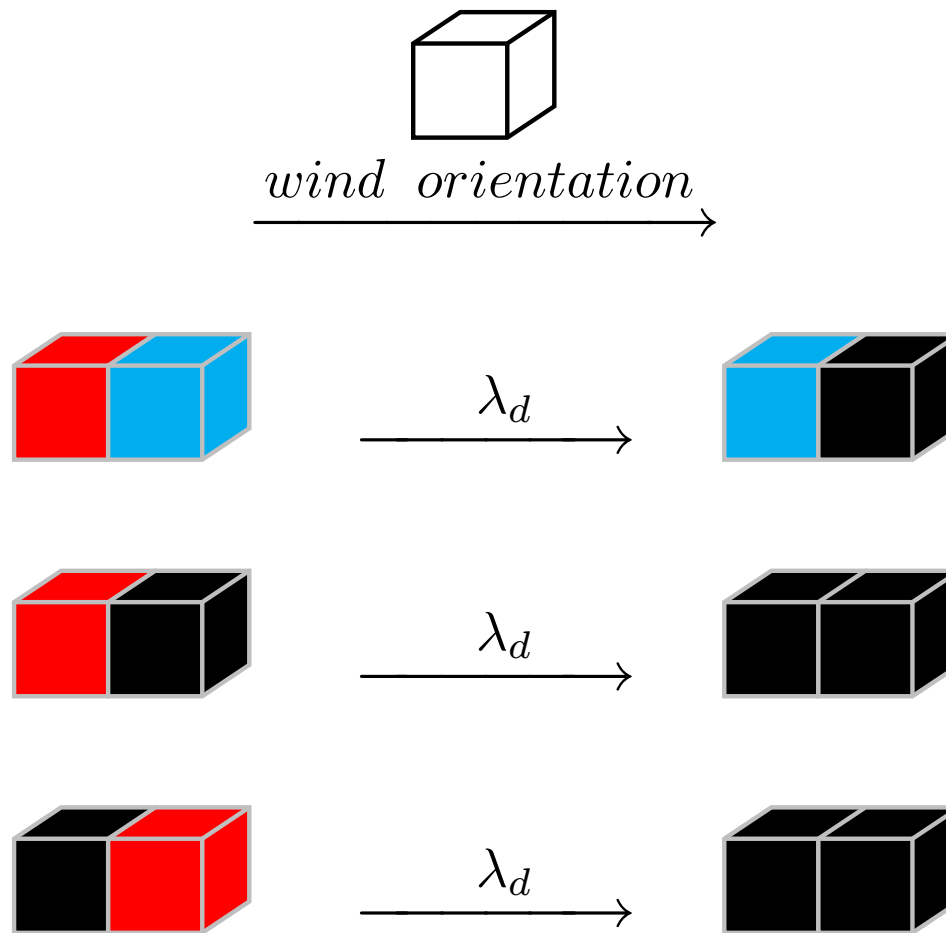
# Erosion



# Transport

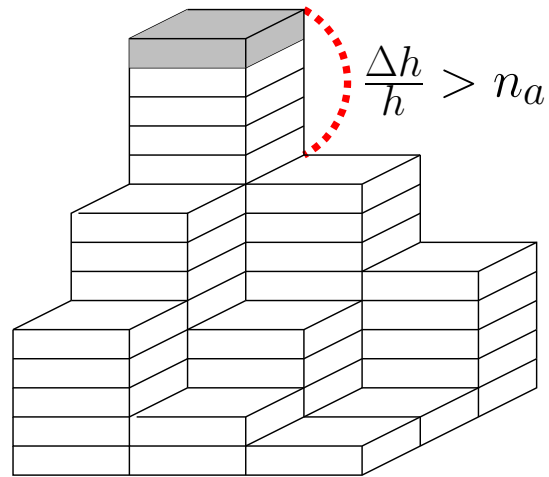


# Deposition

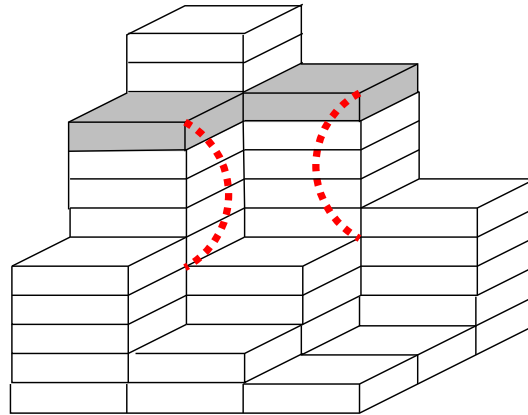


# Avalanches

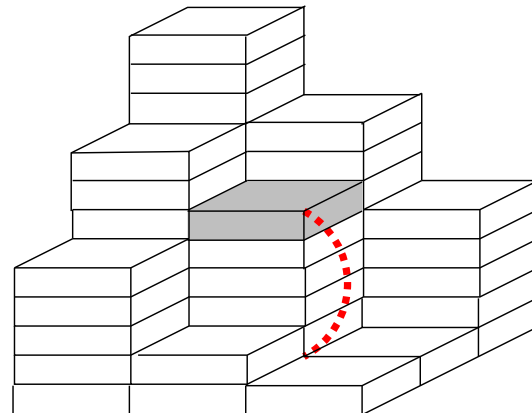
Initial configuration



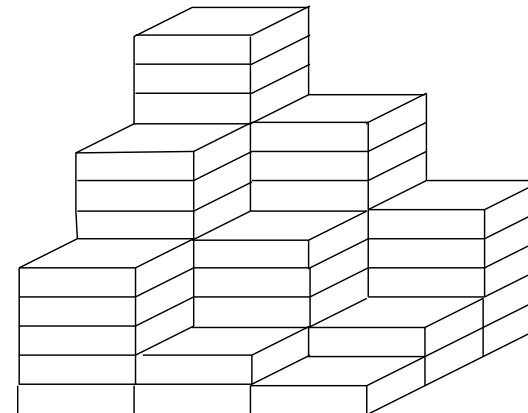
Stage 1



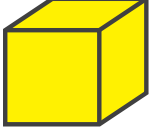
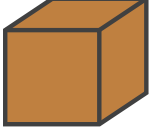
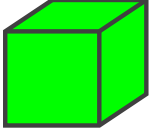
Stage 2

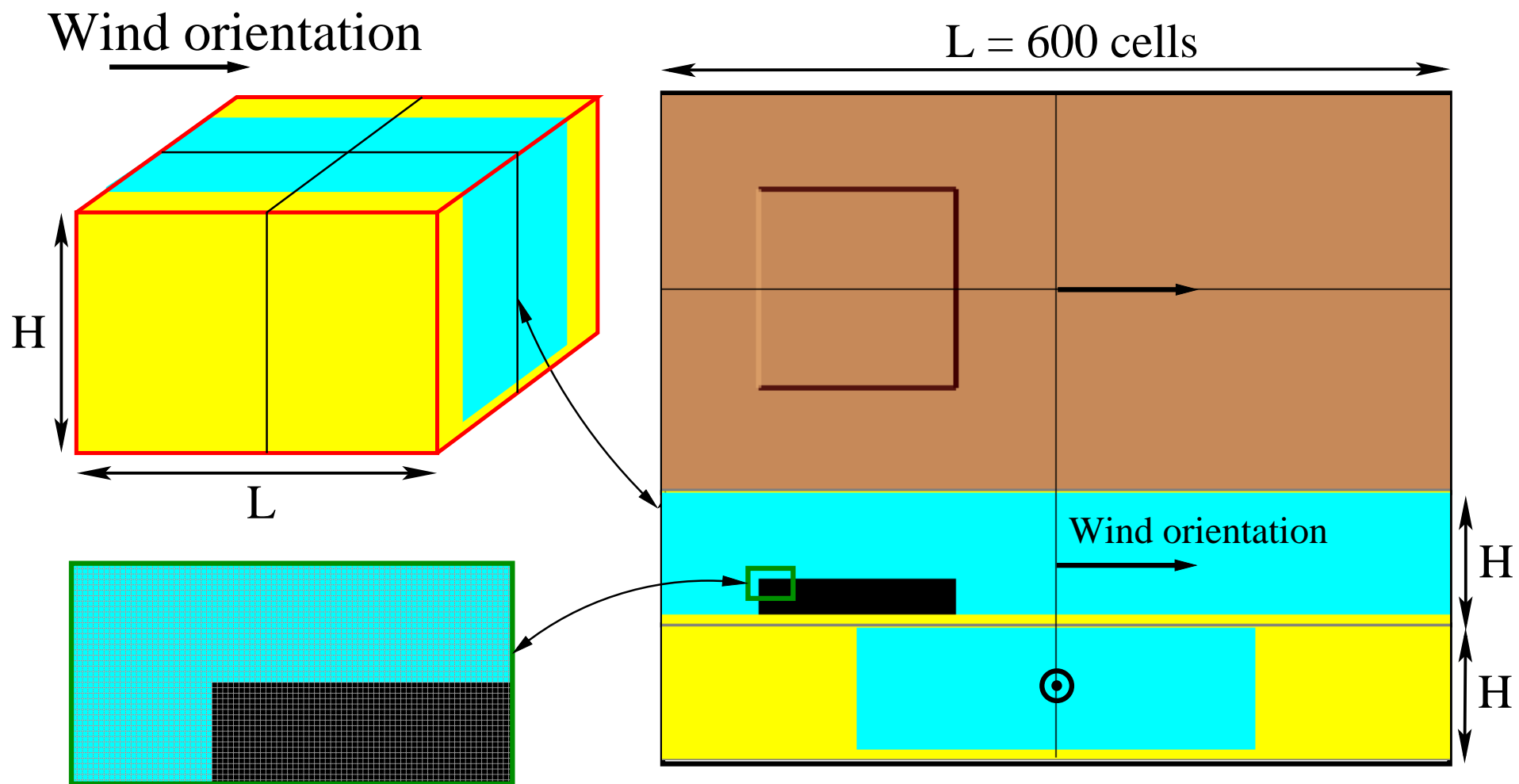


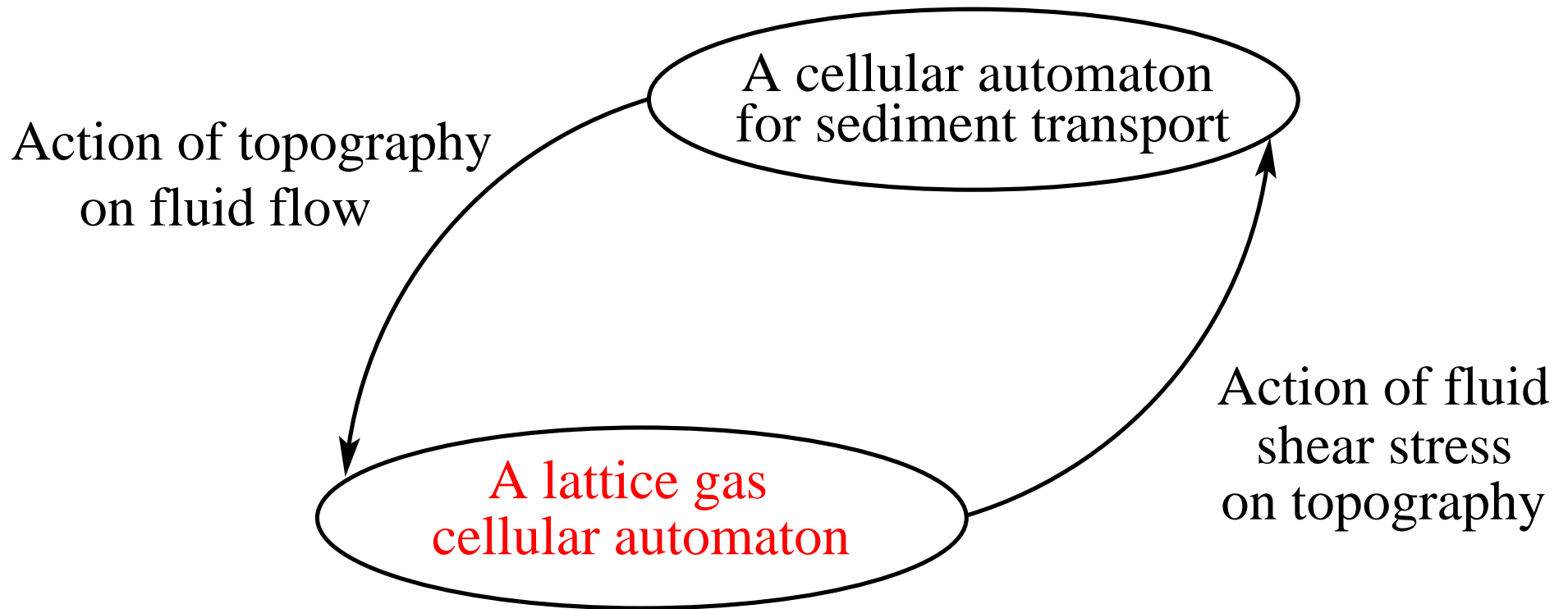
Final configuration



# *Boundary conditions*

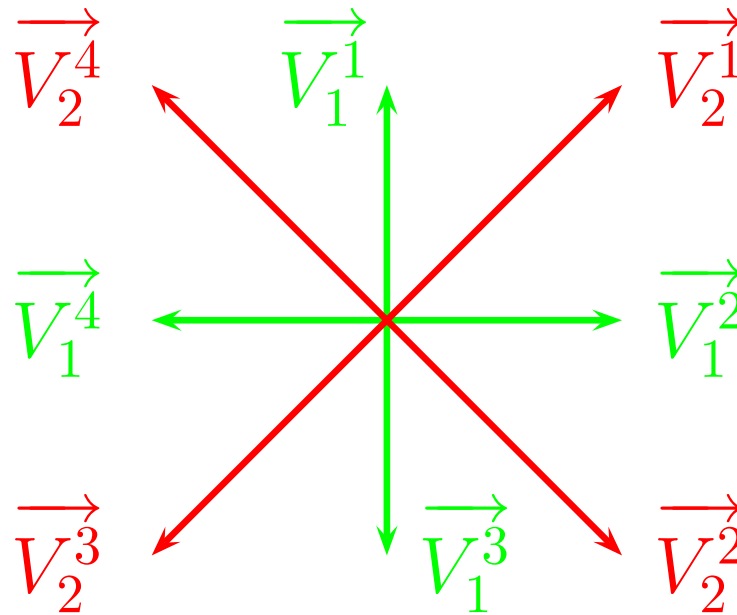
Neutral boundaries	 Solid
Removal boundaries	 Out
Injection boundaries	 In





# *A lattice gas model*

A lattice gas model is composed of a set of fluid particles flying from one lattice node to its neighbour in one unit of time. Possible velocity vectors are



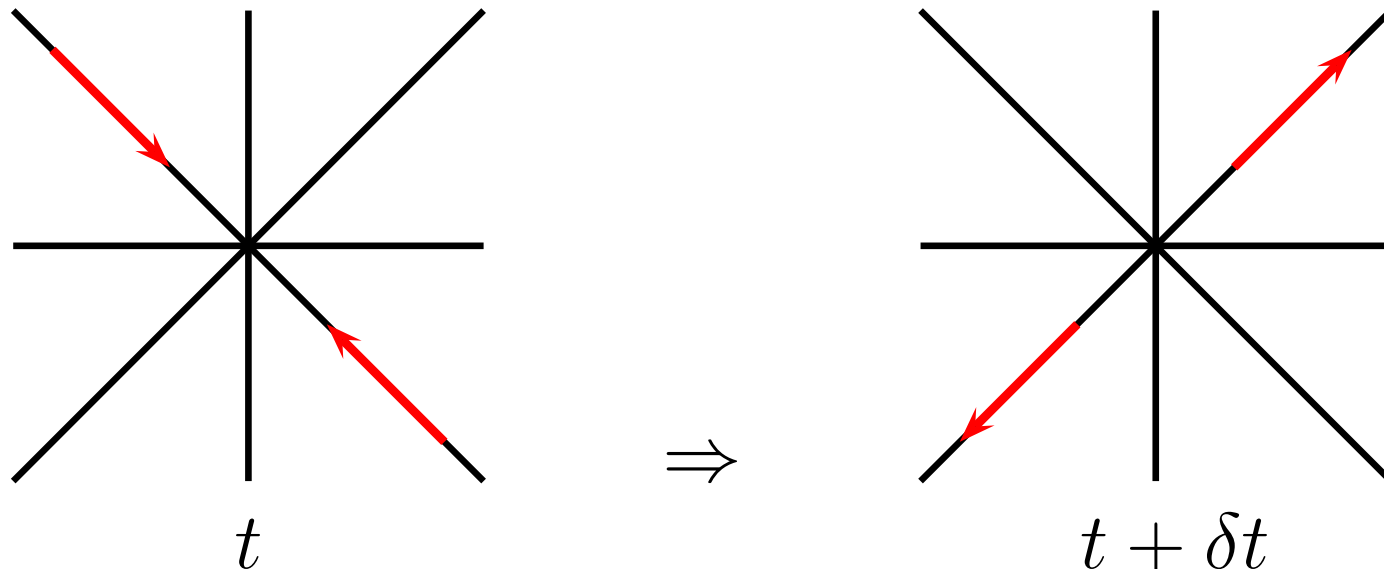
with

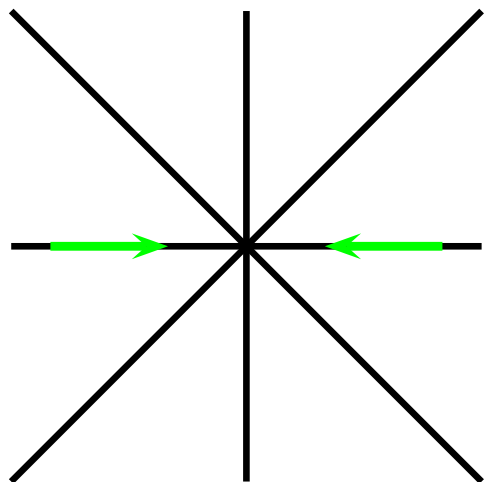
$$\|\vec{V}_2\| > \|\vec{V}_1\|.$$

# *A lattice gas model*

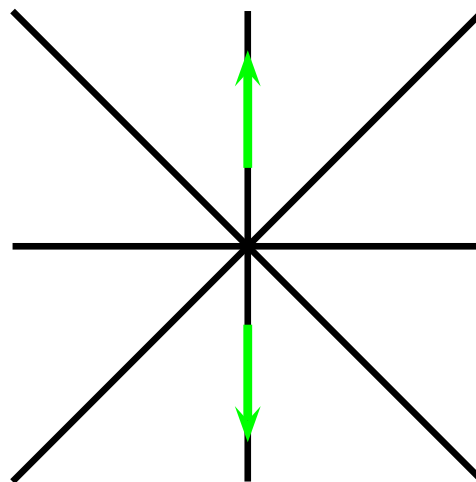
Two particles cannot sit simultaneously on the same node.

- Propagation: the particles move from their node to the nearest neighbour in the direction of their velocity vector.
- Collision: particles on the same node may exchange momentum according to the imposed collision rules.

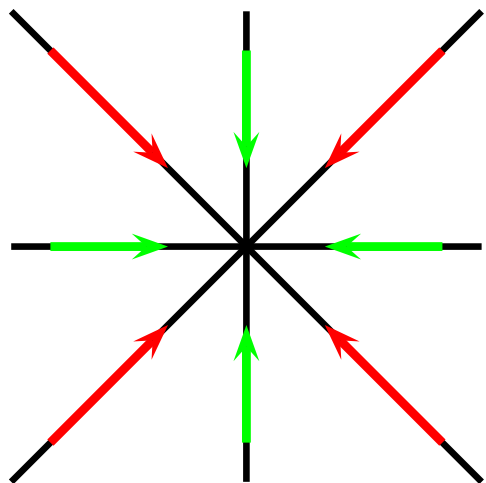




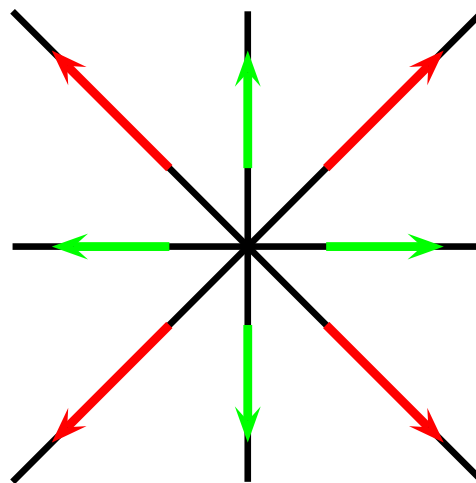
$t$



$t + \delta t$



$t$



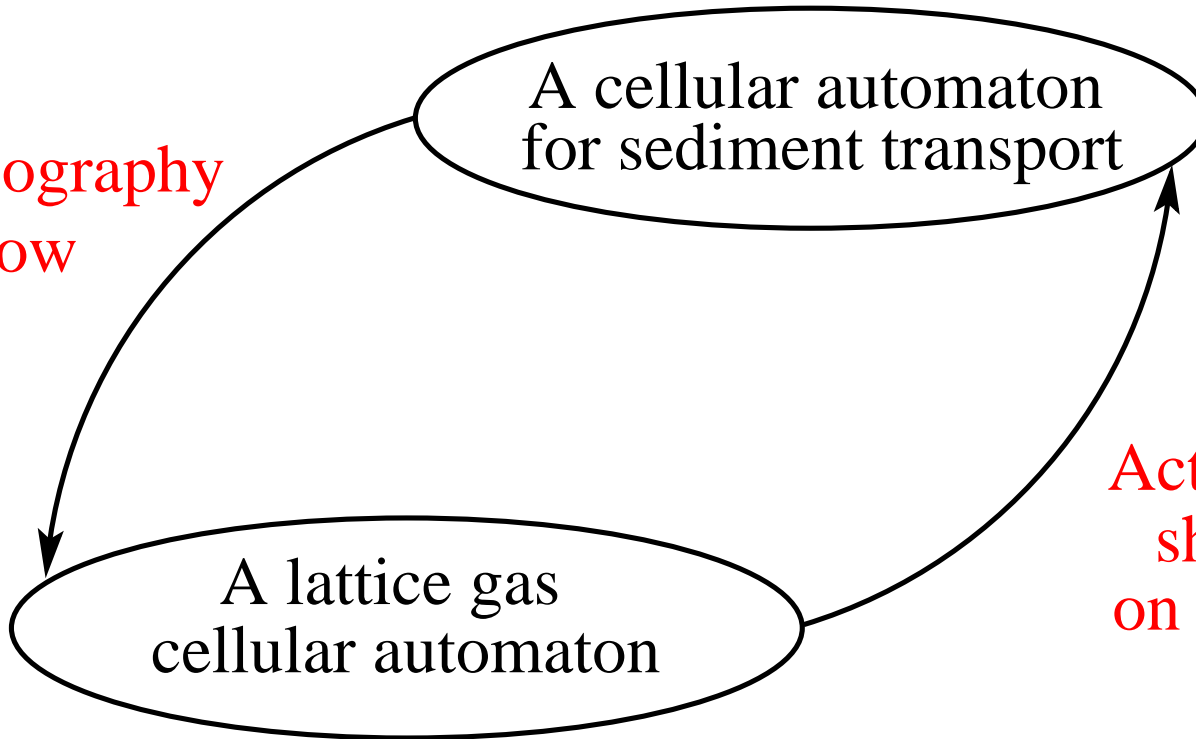
$t + \delta t$

Action of topography  
on fluid flow

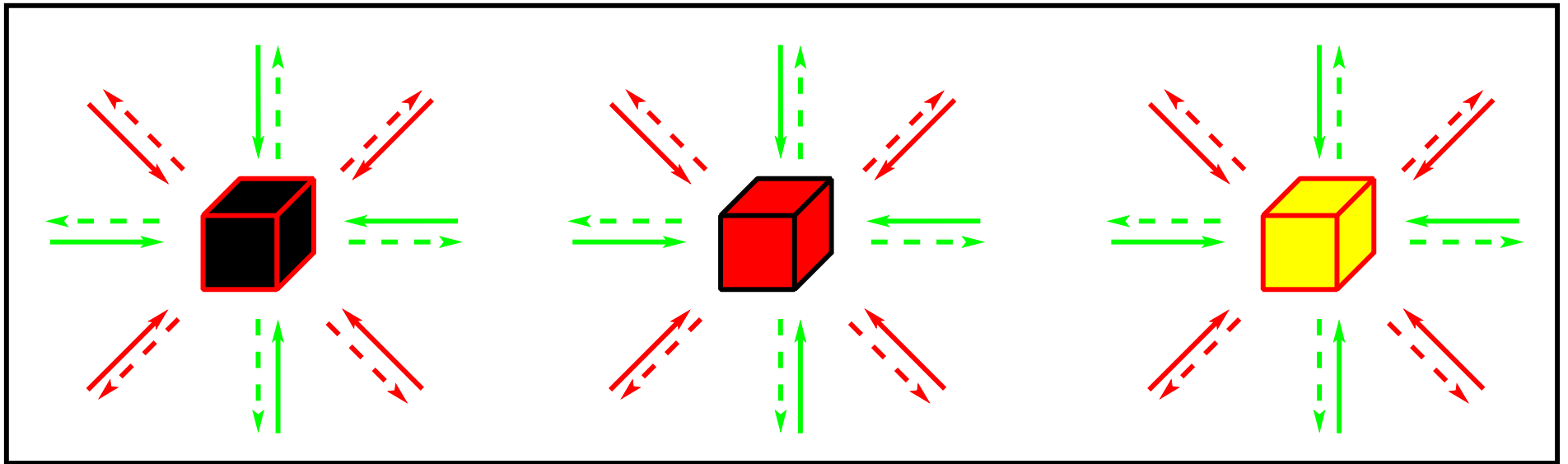
A cellular automaton  
for sediment transport

A lattice gas  
cellular automaton

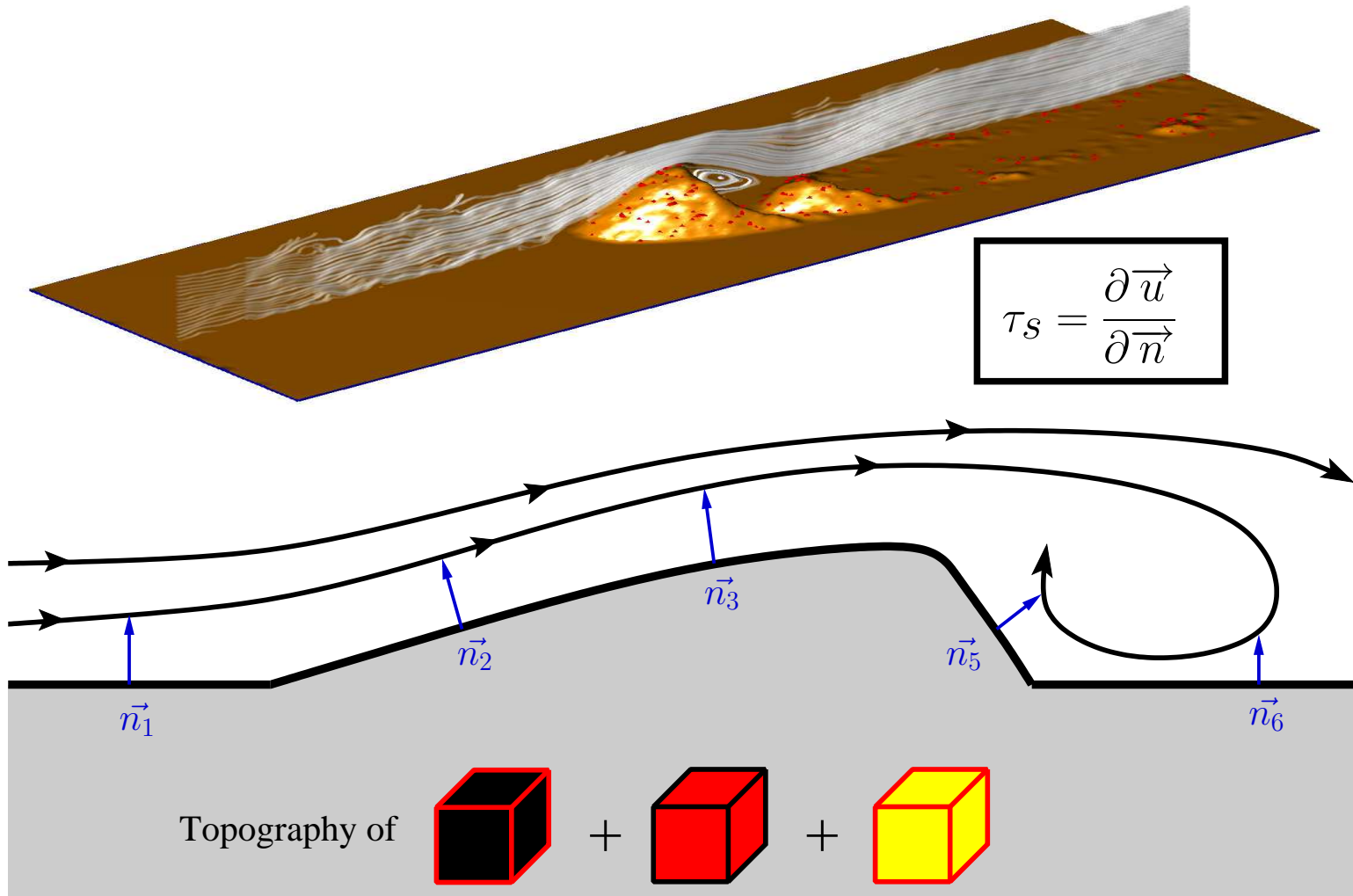
Action of fluid  
shear stress  
on topography



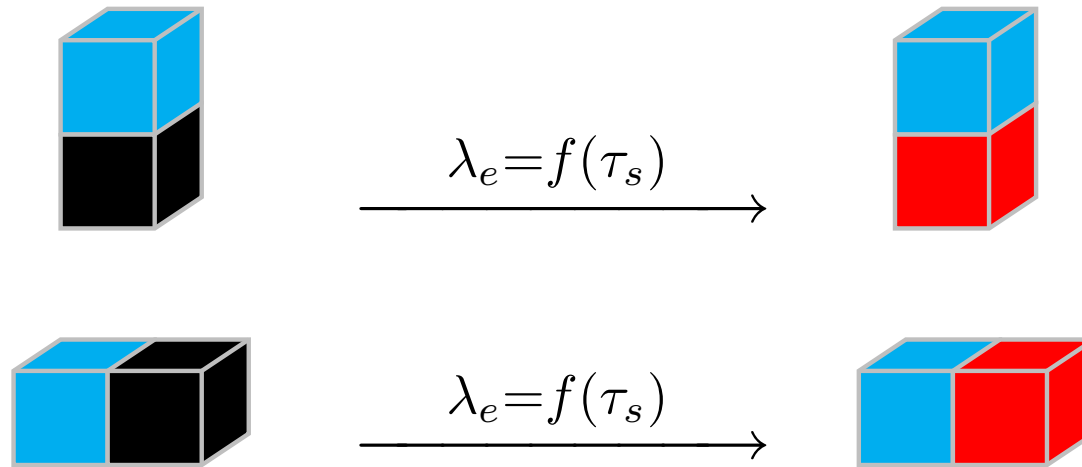
# *Boundary conditions*



# The bed shear stress

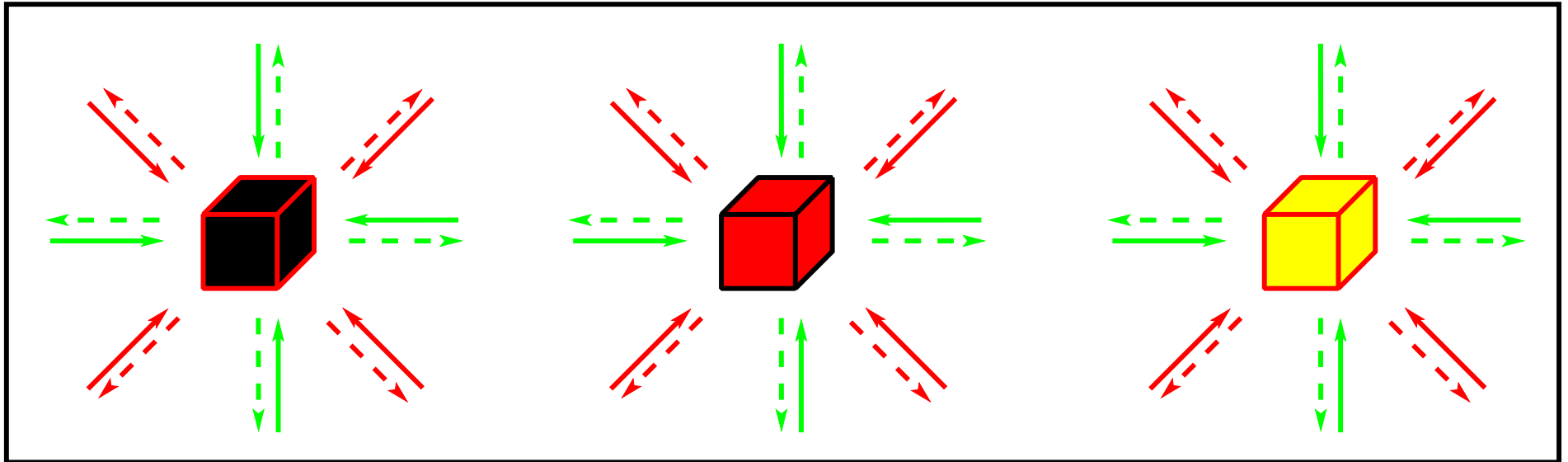


# Erosion



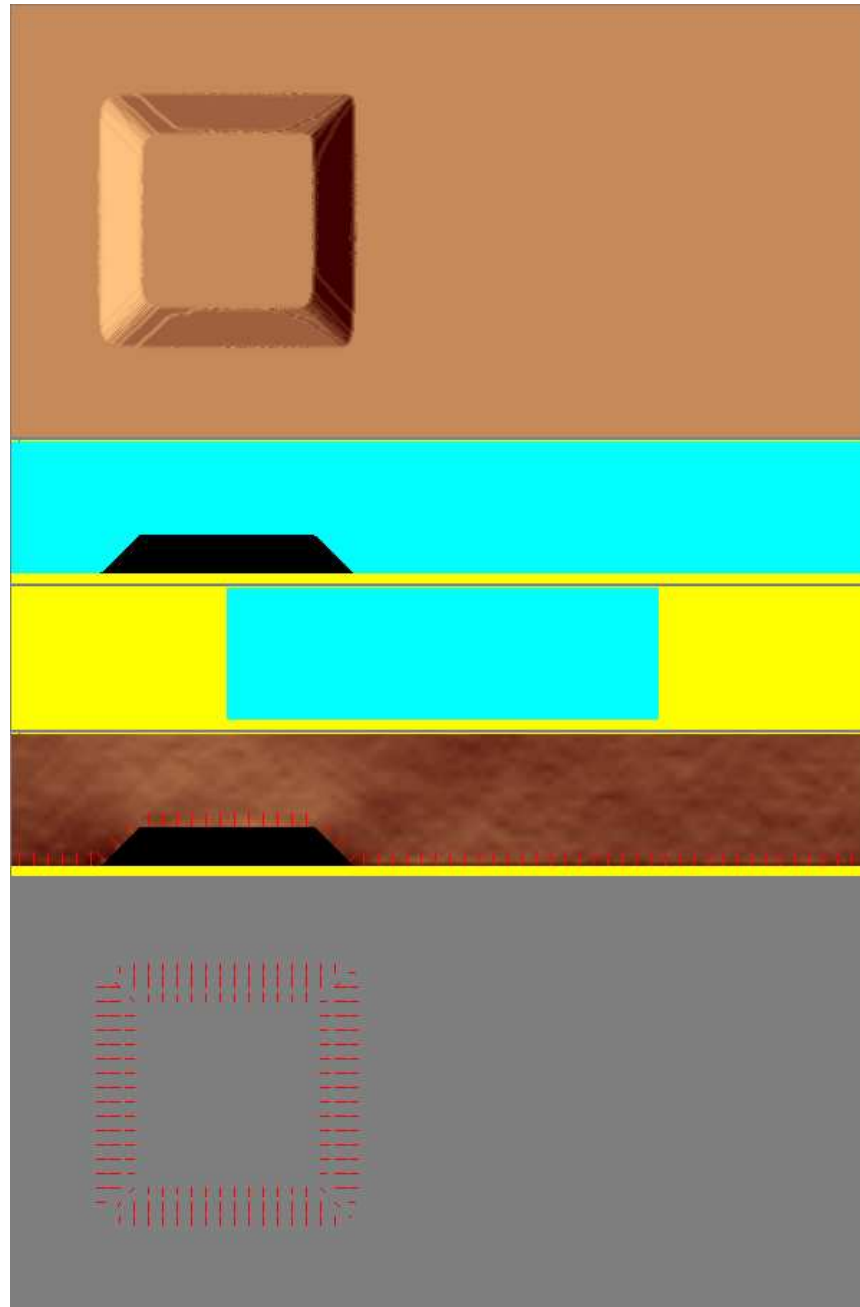
$$\lambda_e = \begin{cases} 0 & \text{for } \tau_s \leq \tau_{min}, \\ \lambda_0 \frac{\tau_s - \tau_{min}}{\tau_{max} - \tau_{min}} & \text{for } \tau_{min} \leq \tau_s \leq \tau_{max}, \\ \lambda_0 & \text{else.} \end{cases}$$

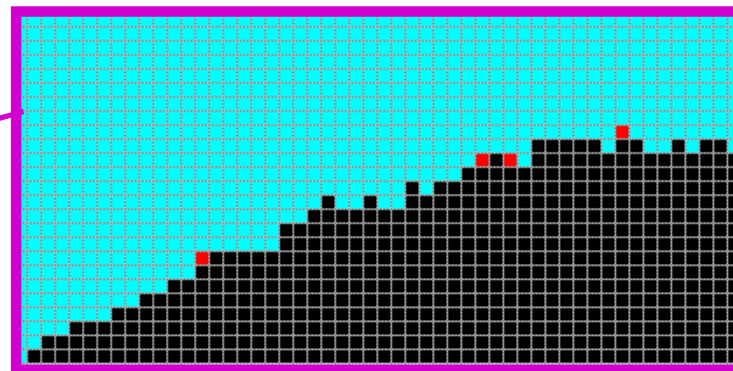
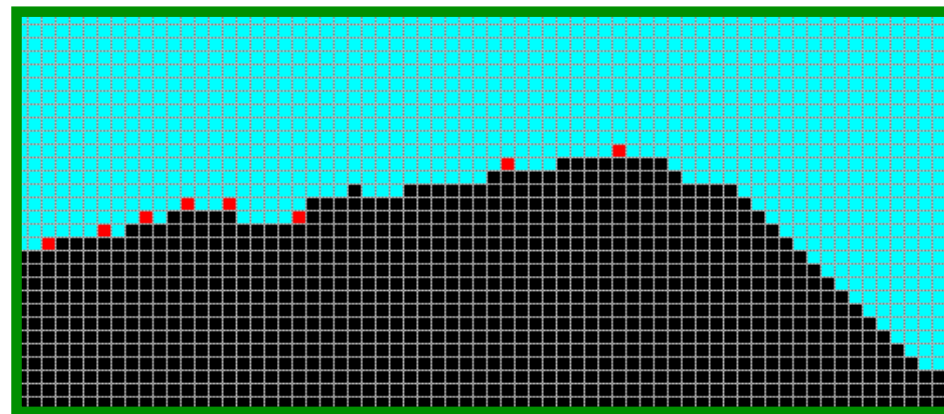
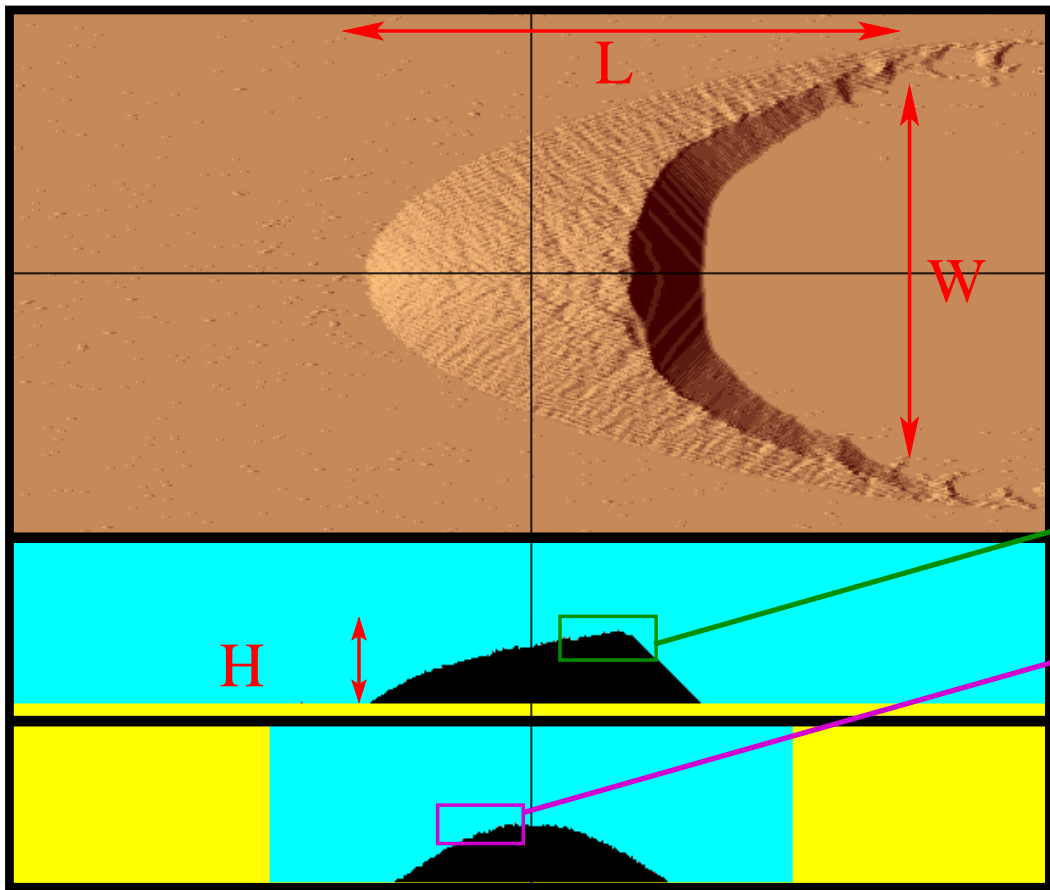
# A fully coupled system



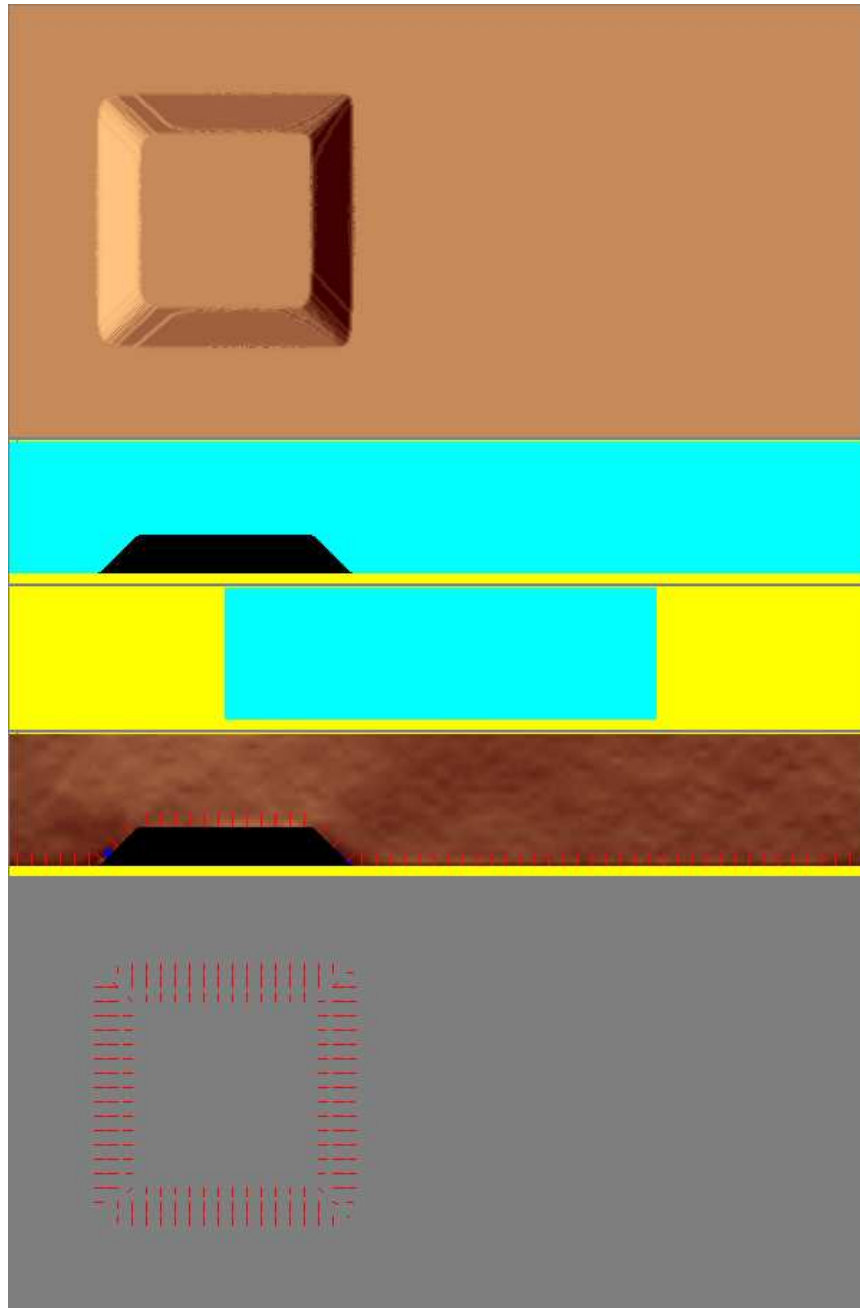
$$\lambda_e = \begin{cases} 0 & \text{for } \tau_s \leq \tau_{min}, \\ \lambda_0 \frac{\tau_s - \tau_{min}}{\tau_{max} - \tau_{min}} & \text{for } \tau_{min} \leq \tau_s \leq \tau_{max}, \\ \lambda_0 & \text{else.} \end{cases}$$

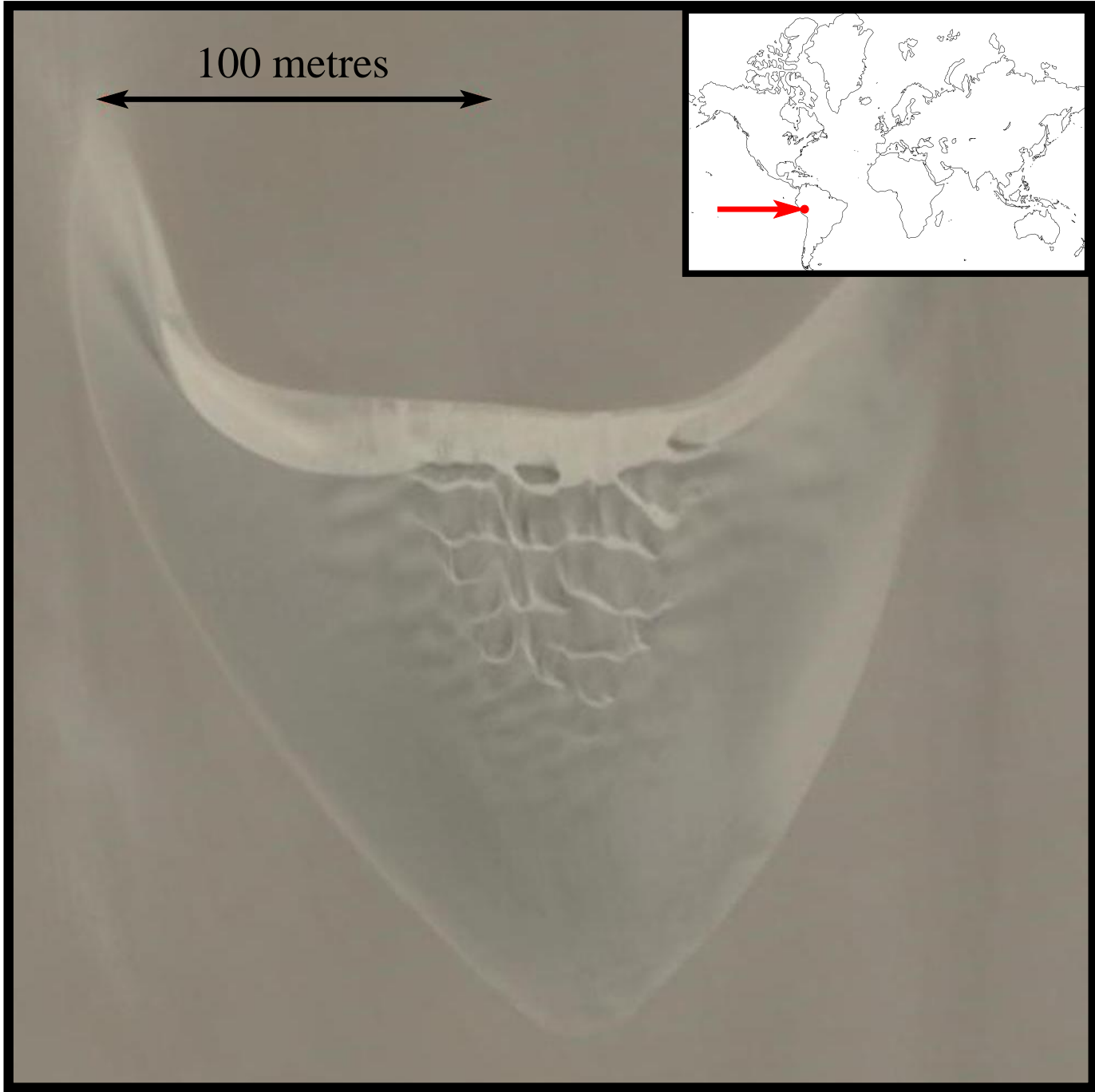
High wind speed  $\iff$  low  $\tau_{min}$ -value



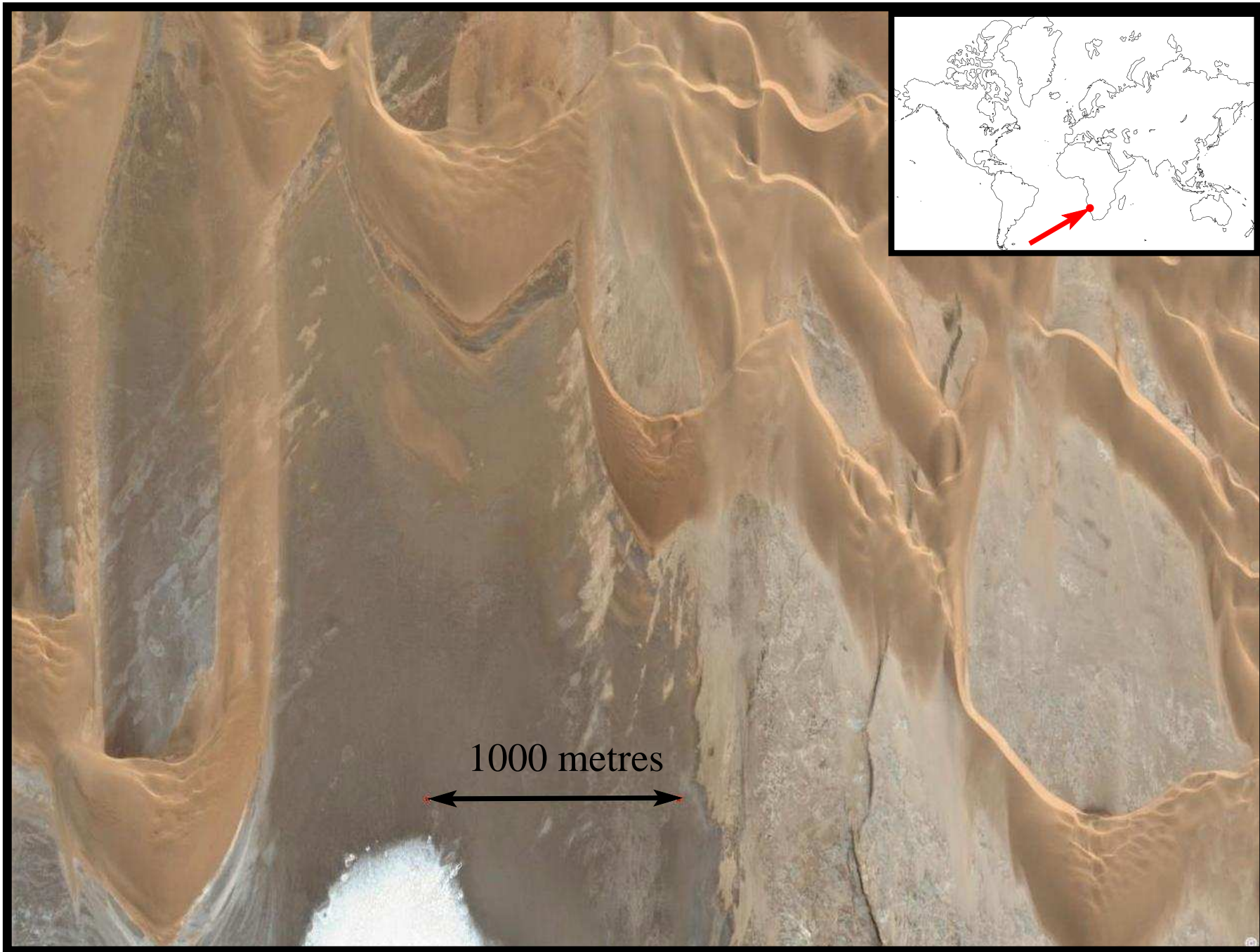


Low wind speed  $\iff$  high  $\tau_{min}$ -value

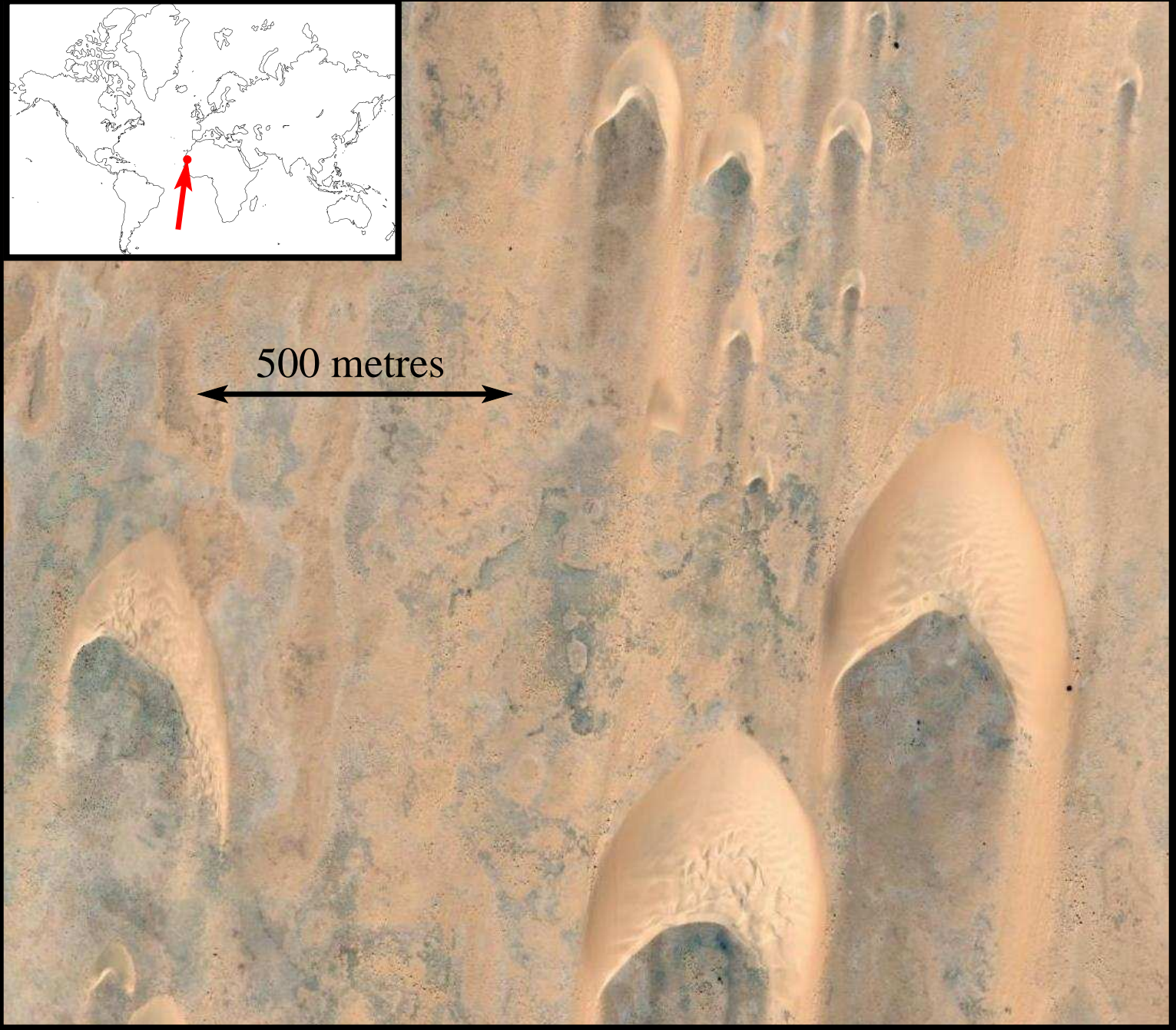




100 metres

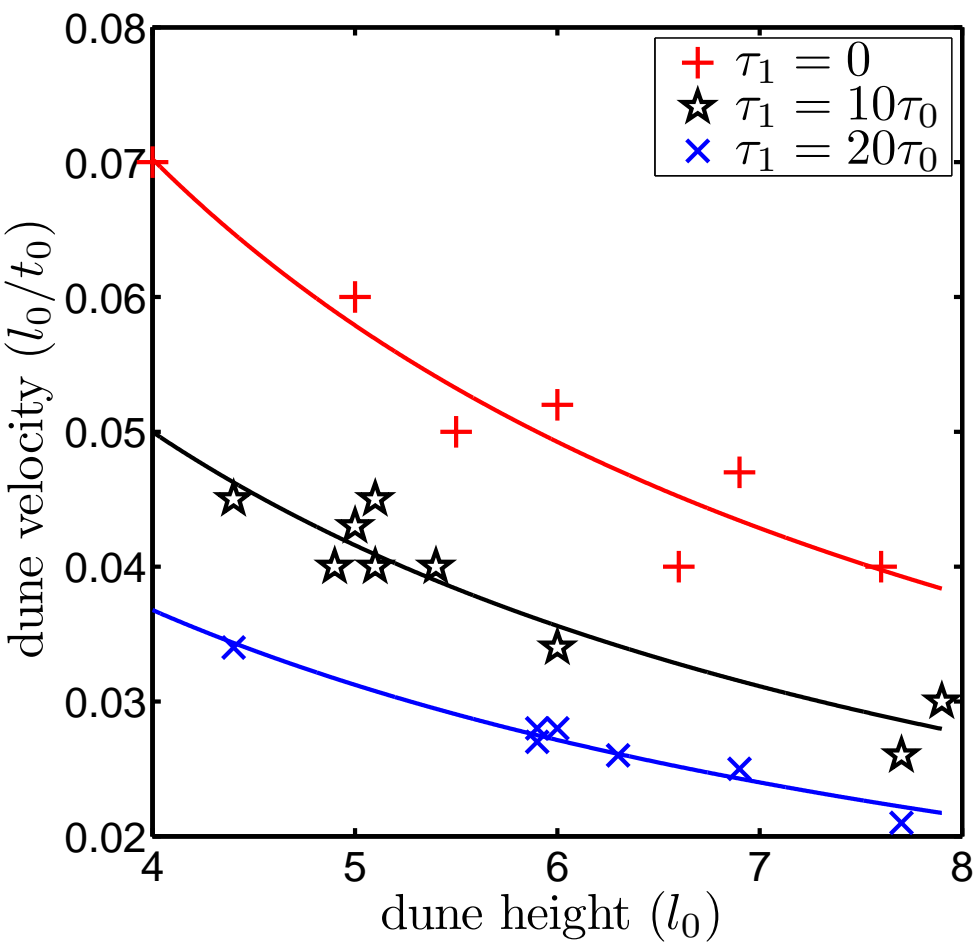
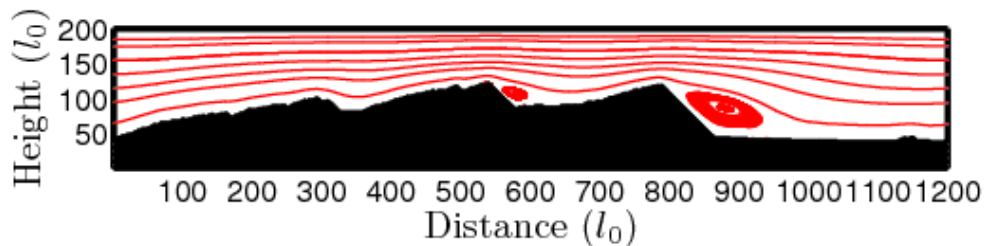


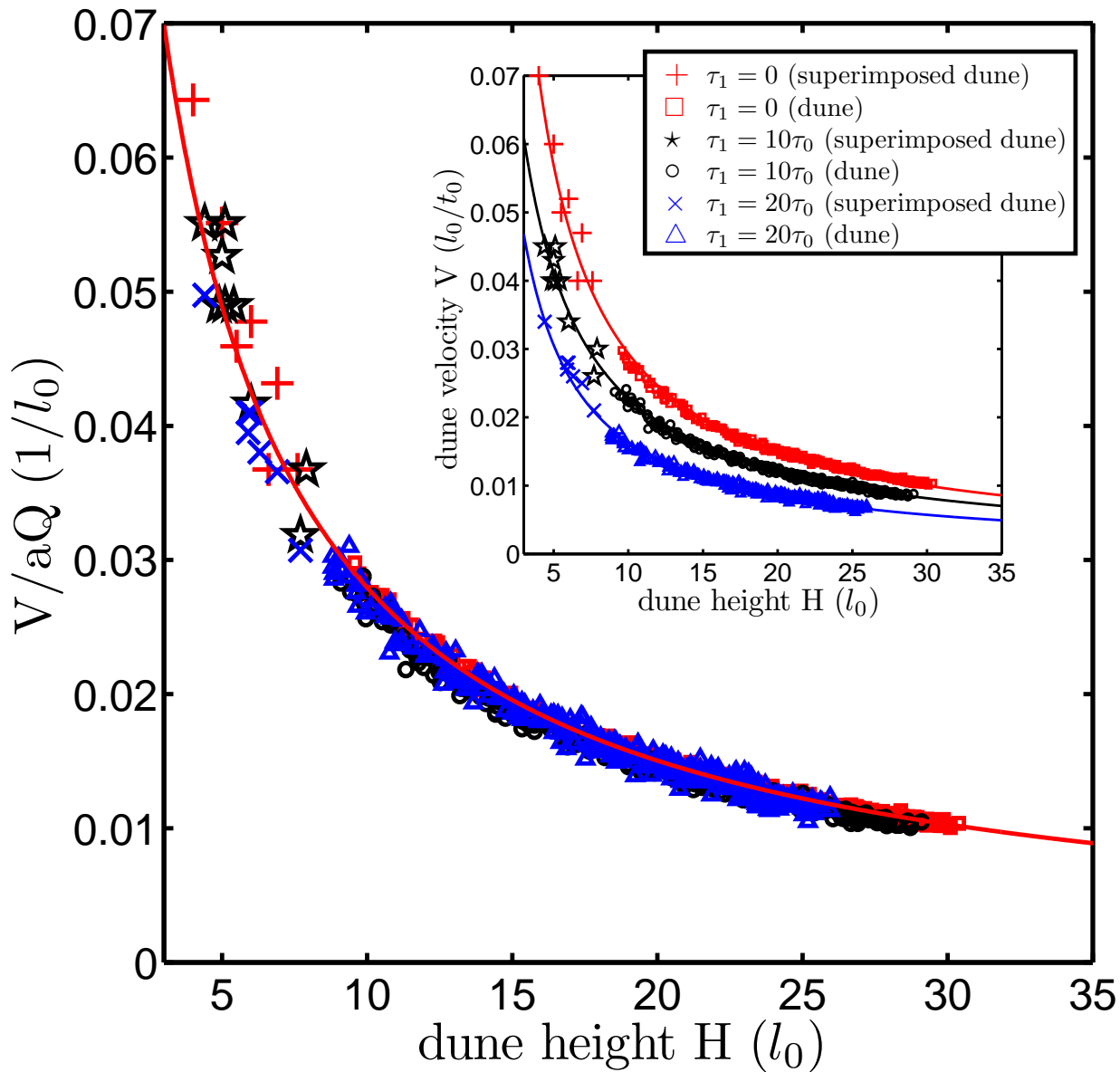
1000 metres



500 metres

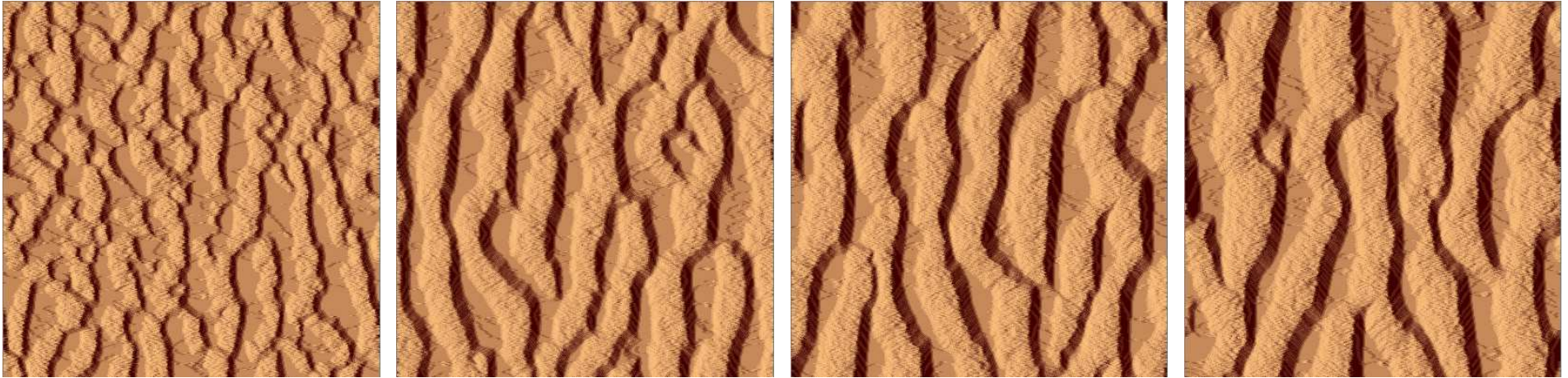




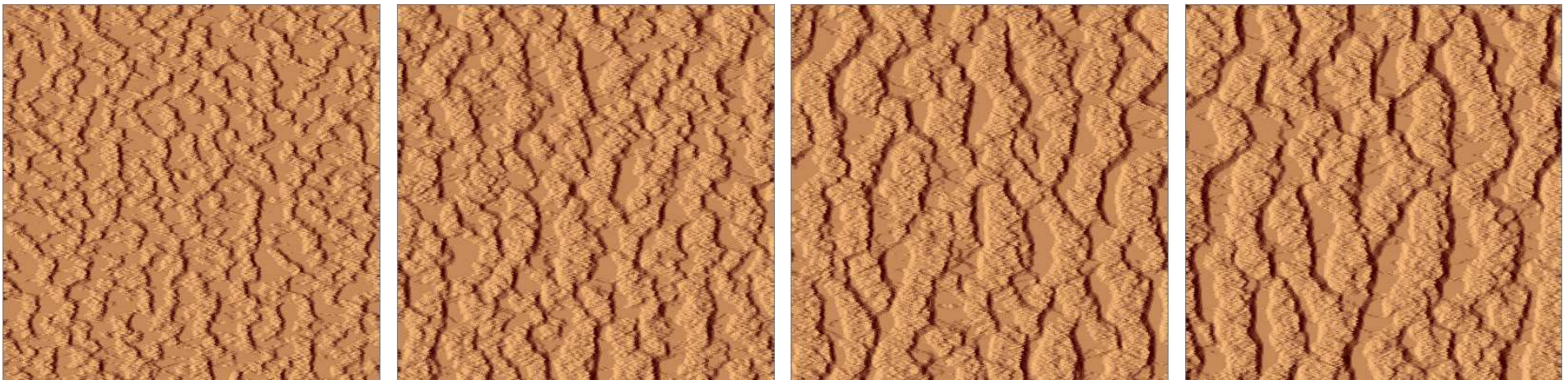


# *Transverse dunes*

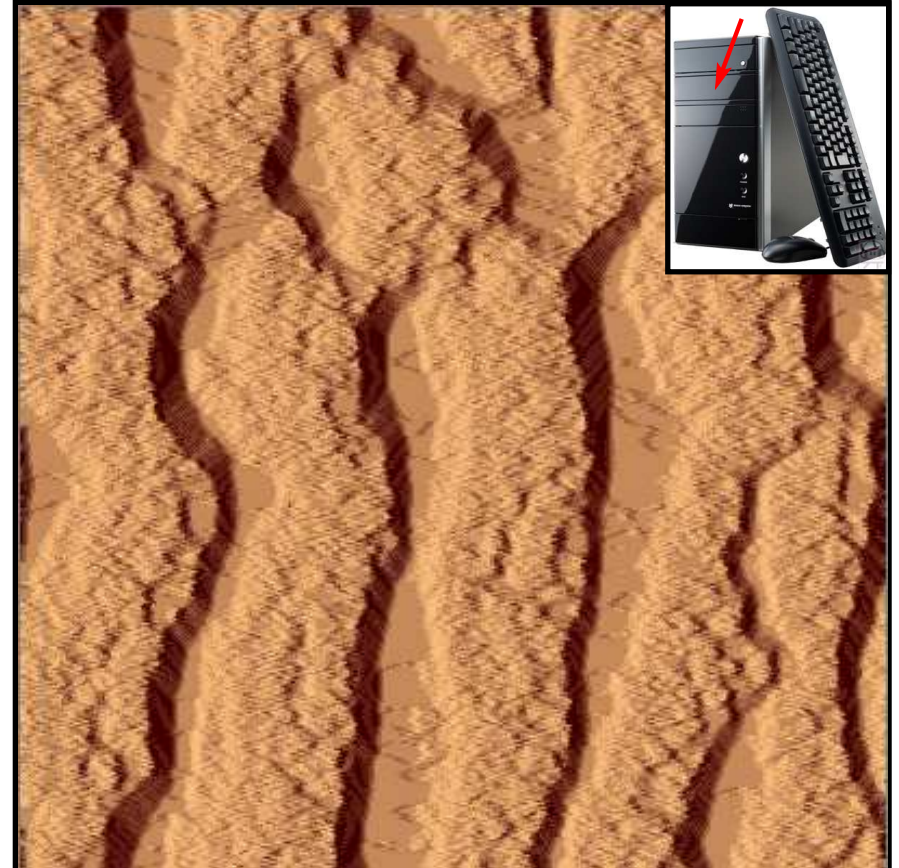
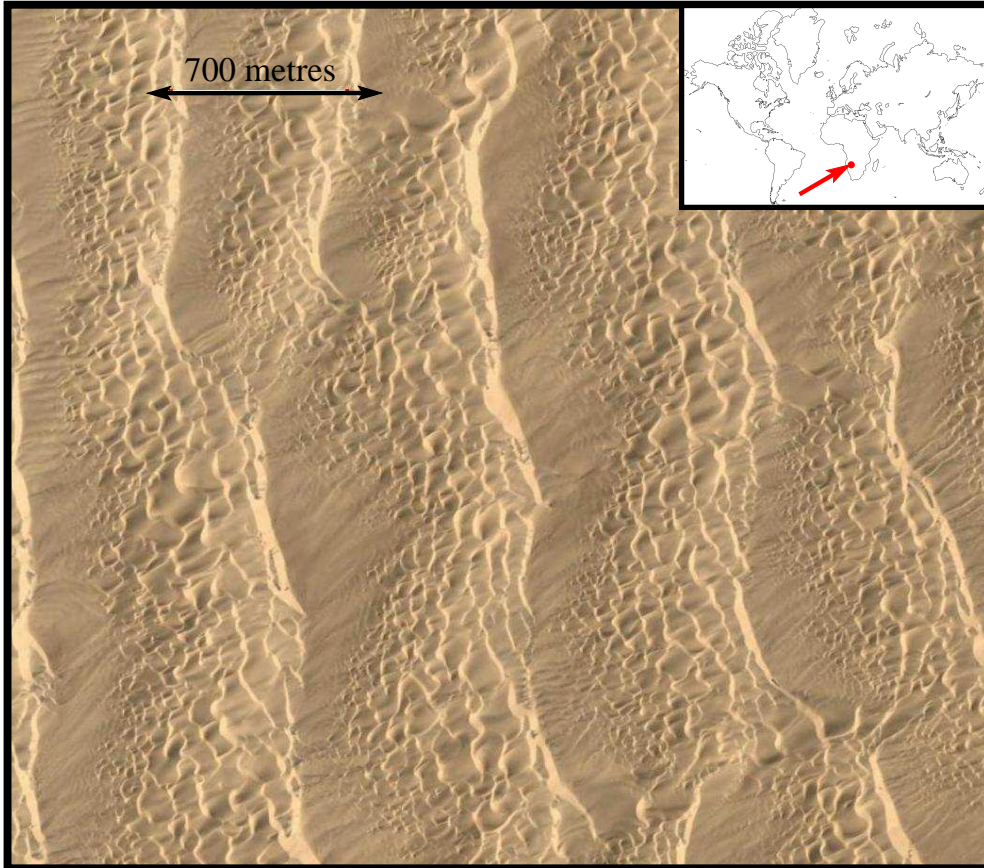
Thick sand layer under high wind speed conditions (low  $\tau_{min}$ -value)



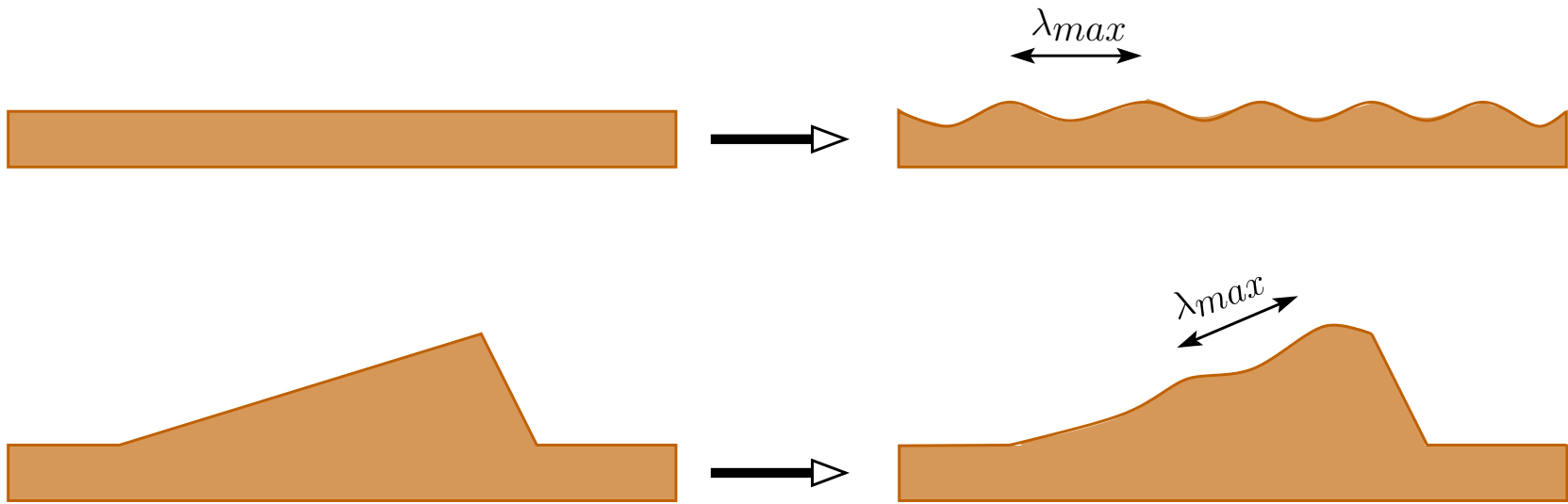
Thick sand layer under low wind speed conditions (high  $\tau_{min}$ -value)



# *Transverse dunes*



# *Nucleation of dunes patterns in the model*

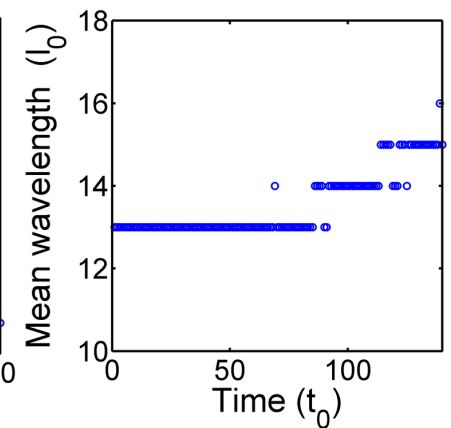
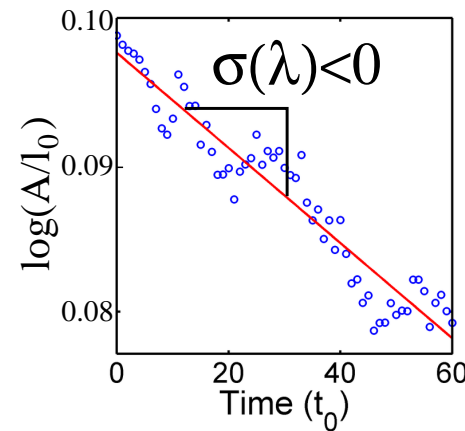
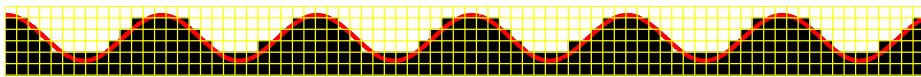


What is the characteristic length scale for the nucleation of dunes in the model ?

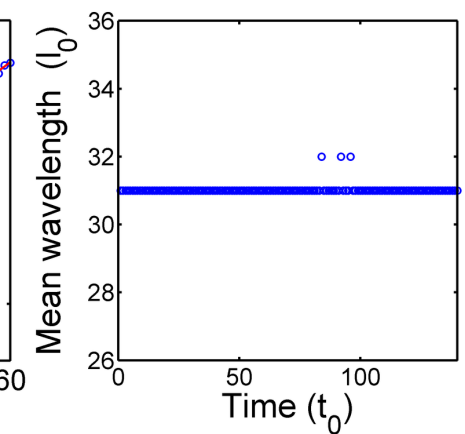
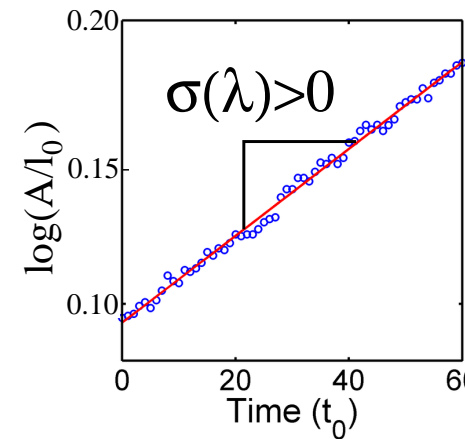
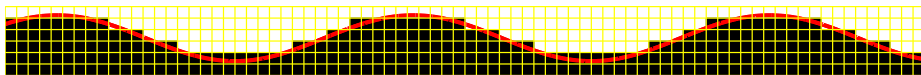
$$\lambda_{max} = ?? l_0$$

# Linear stability analysis of the sand waves instability

Stable wavelength

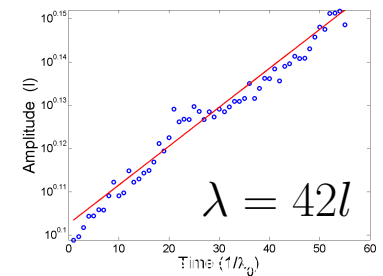
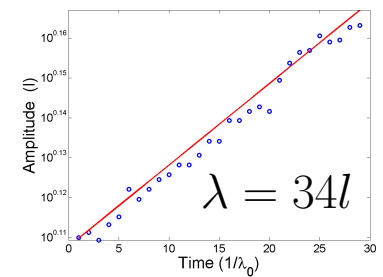
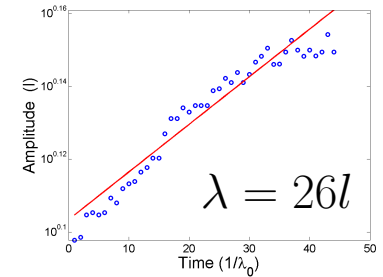
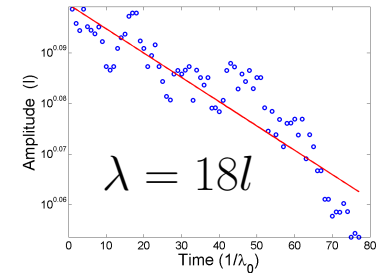
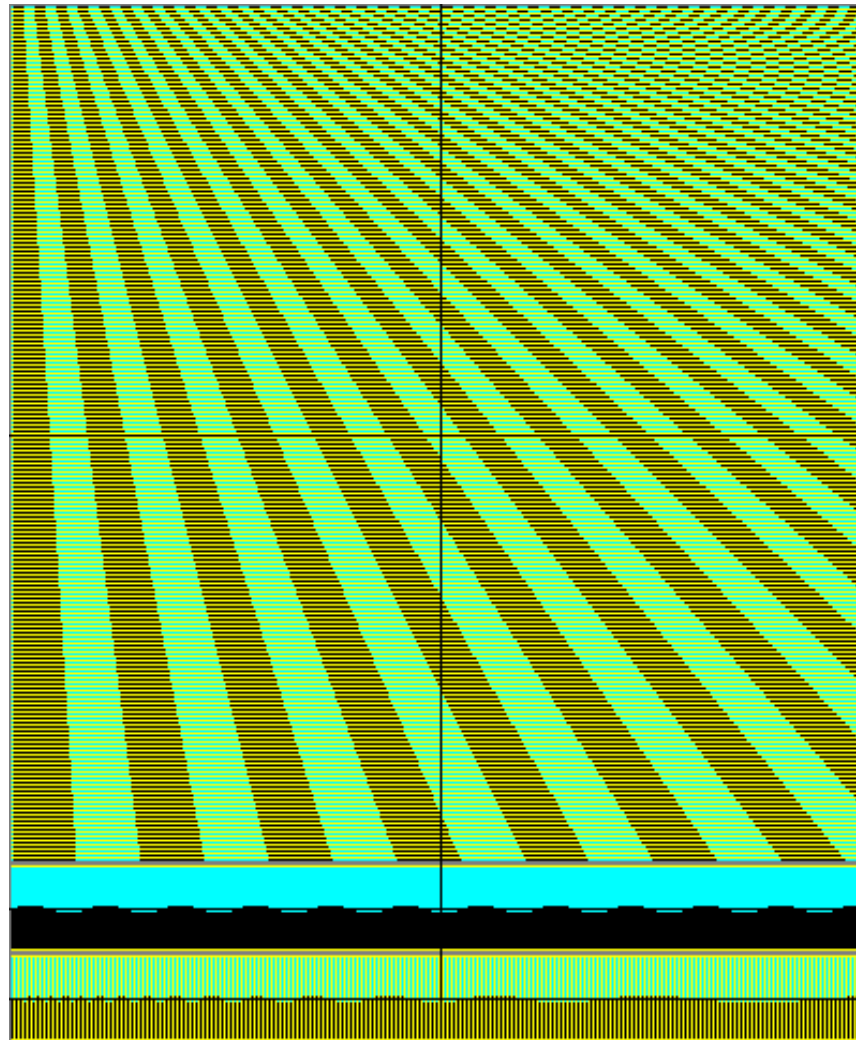
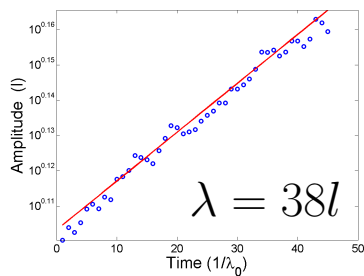
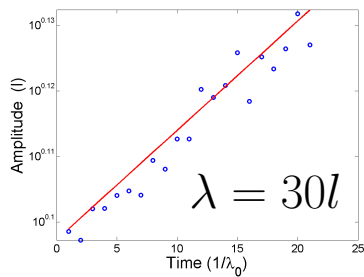
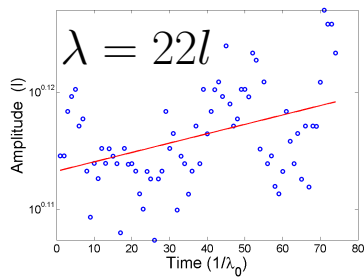
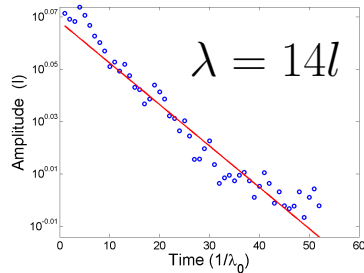


Unstable wavelength

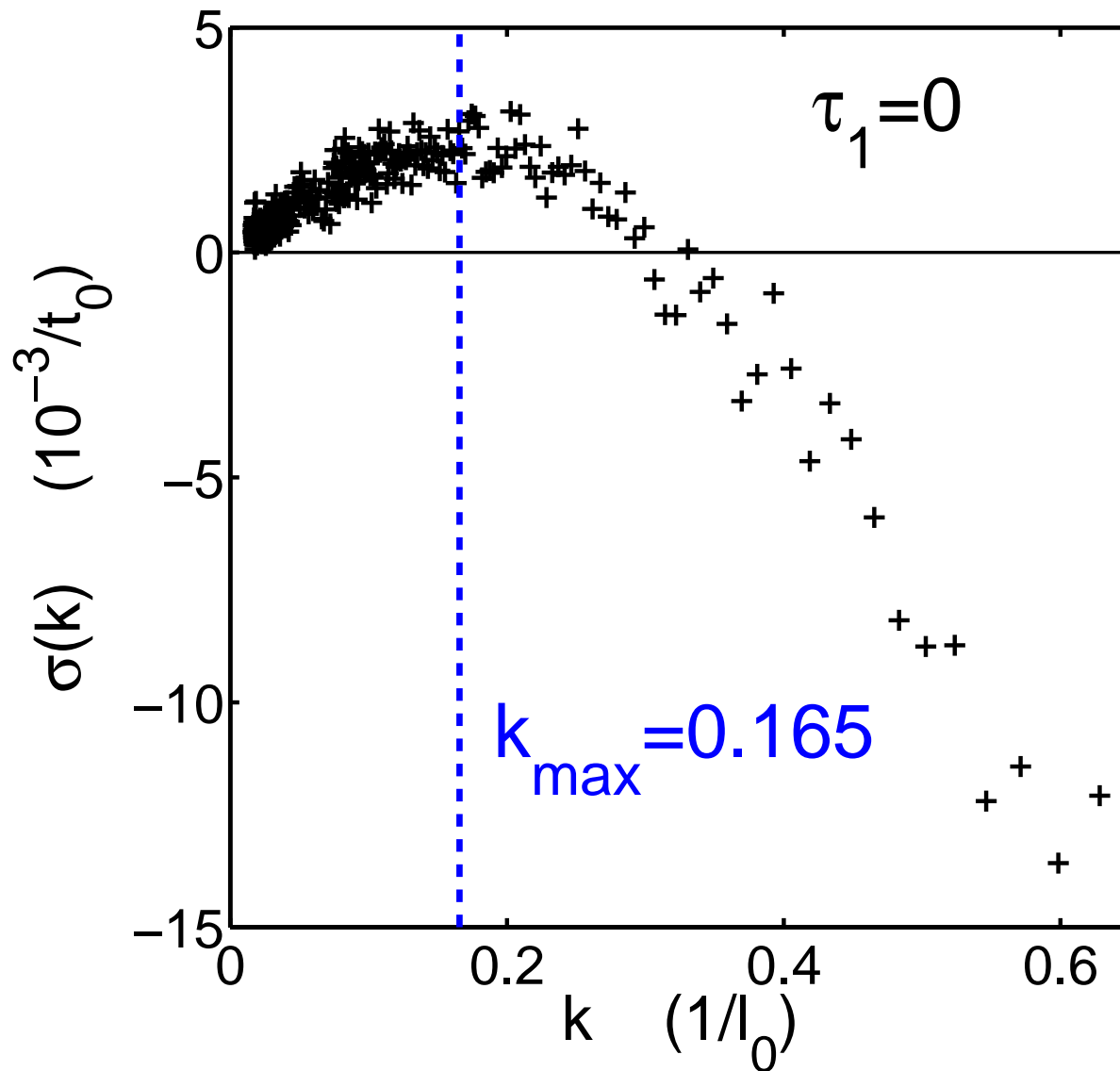


# Linear stability analysis of the sand waves instability

$$A(\lambda, t) \sim \exp(\sigma(\lambda)t)$$



# Linear stability analysis of the sand waves instability



# *Linear stability analysis of the sand waves instability*

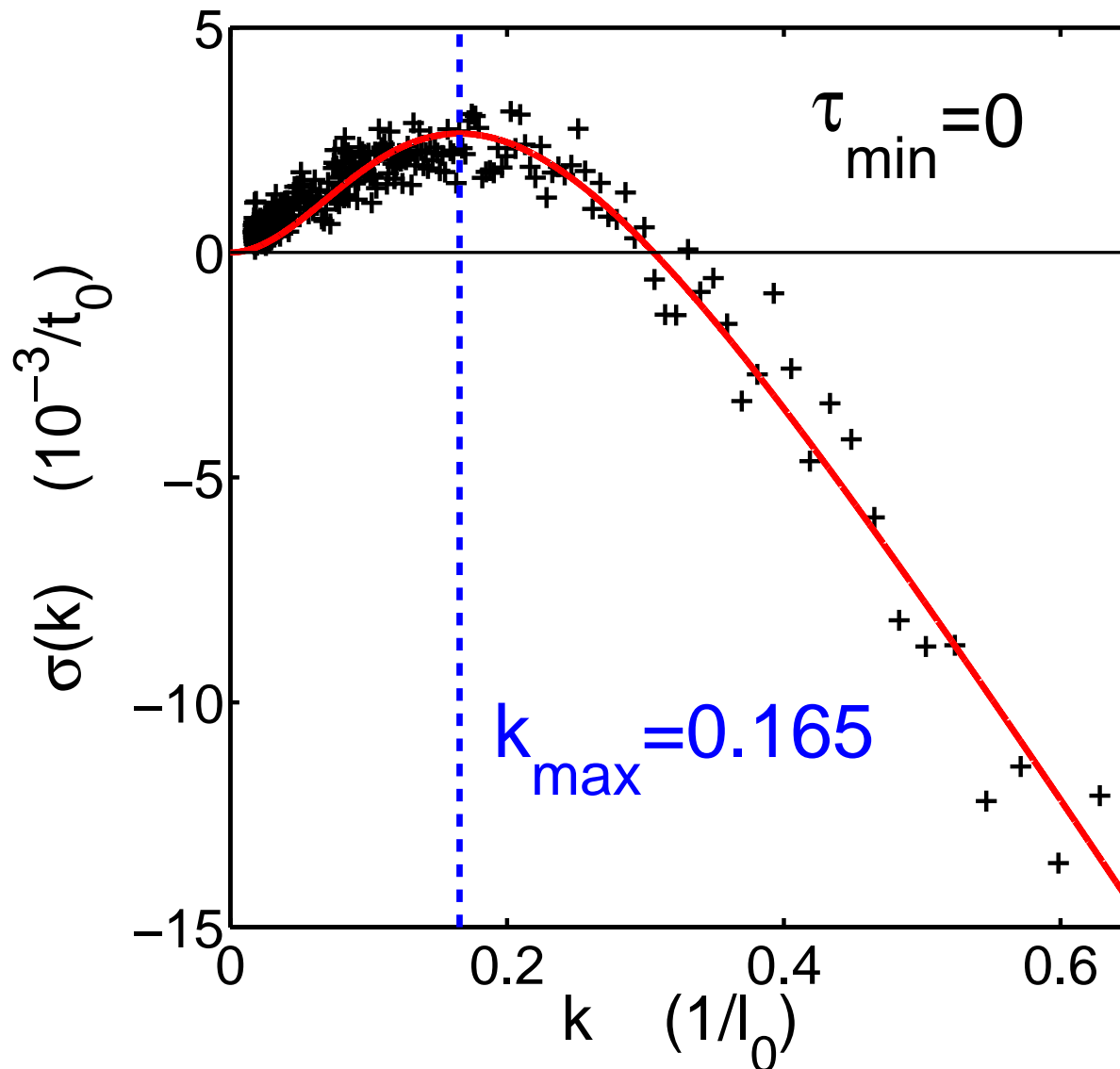
To quantify this fastest growing mode, we fit our data points to the function

$$\sigma(k) = \sigma_0(\alpha k)^2 \frac{1 - \beta(\alpha k)}{1 + (\alpha k)^2},$$

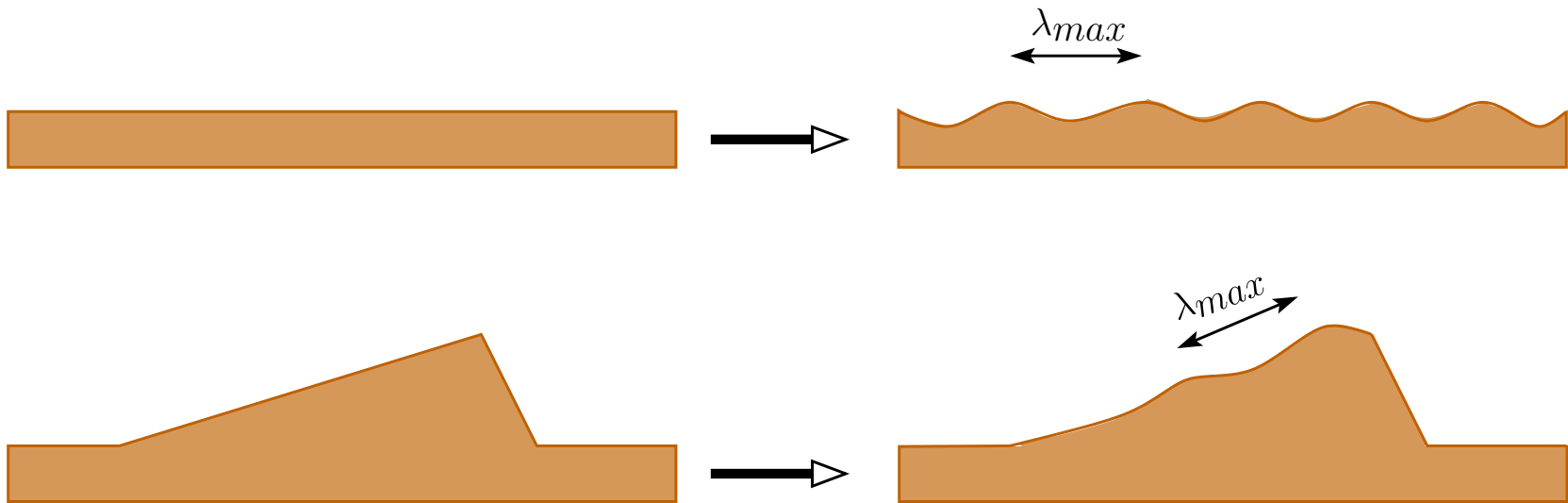
where the three fitting parameters are  $\{\sigma_0, \alpha, \beta\}$ .

This is the analytical expression of the growth rate proposed by *Andreotti et al. (2002)*.

# Linear stability analysis of the sand waves instability



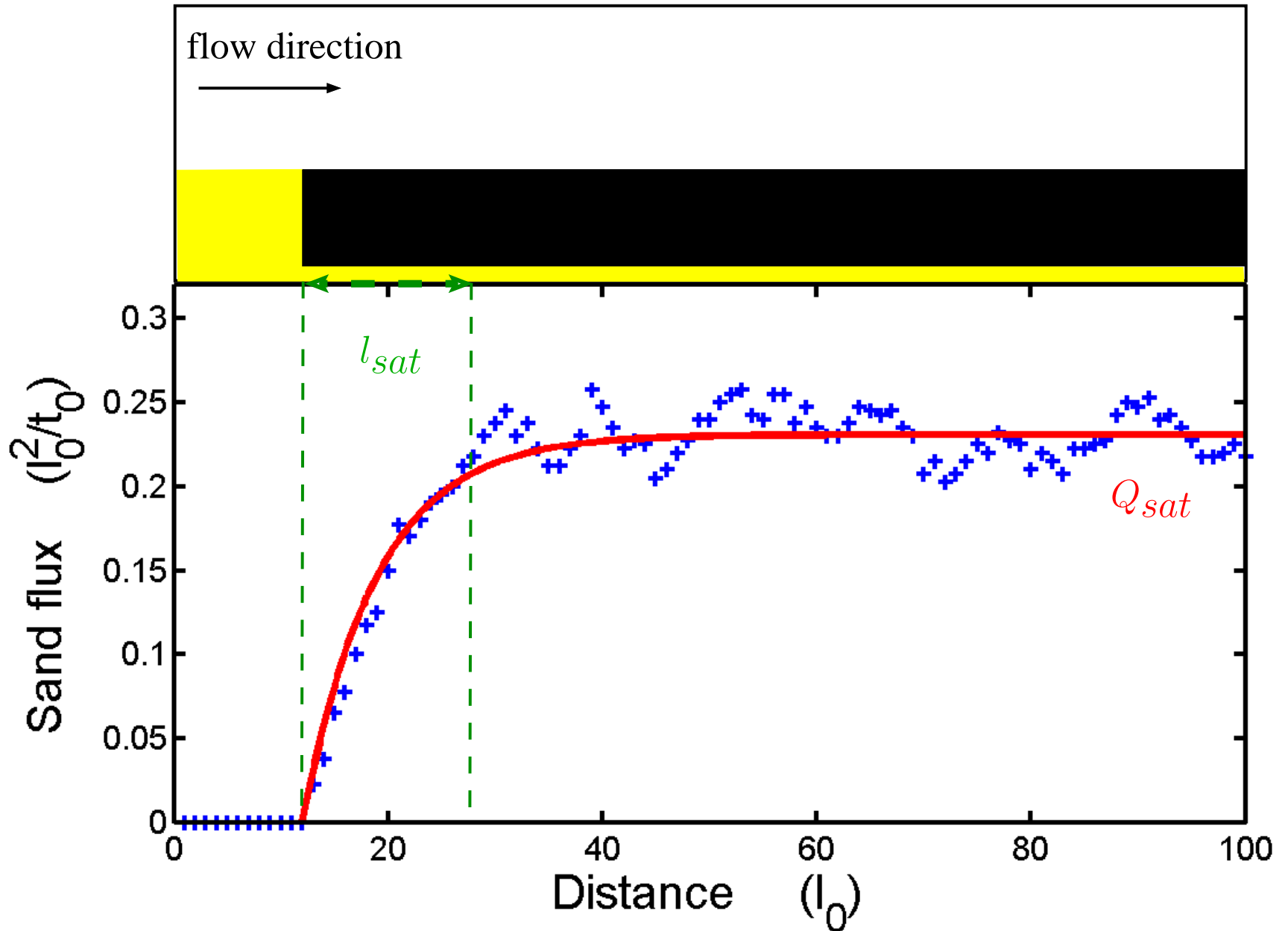
# Nucleation of dunes patterns in the model



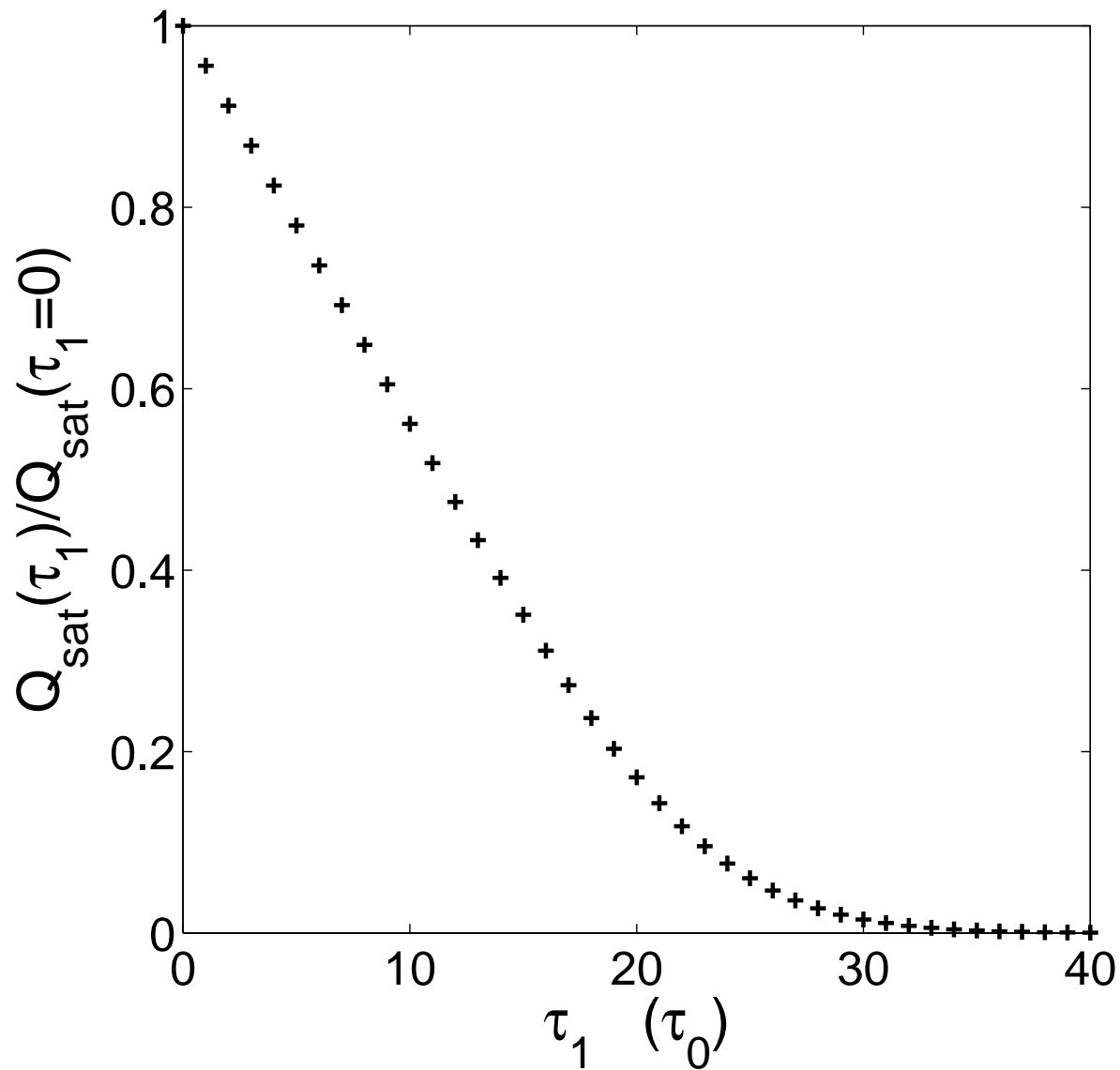
$$\lambda_{max} \approx 40 l_0$$

How does this length scale relate to the saturated flux  $Q_{sat}$  and the saturation length  $l_{sat}$ ?

# Saturation length



# *Saturated flux*



# Characteristic scales

$$Q_{sat} = \begin{cases} 0 & \text{if } \tau_s \leq \tau_{th}, \\ \tau_s^\gamma (\tau_s - \tau_{th}) & \text{if } \tau_s \geq \tau_{th}. \end{cases}$$

$\implies$

$$\frac{Q_{sat}}{Q_{sat}^0} = 1 - \left( \frac{u_{th}}{u_*} \right)^2.$$

$\implies$

$$\langle Q_{sat} \rangle = Q_{sat}(u_*)$$

# Characteristic scales

$$l_{sat} \approx 6 l_0$$

$$\lambda_{max} \approx 40 l_0$$

$$\lambda_{max} \approx 7 l_{sat}$$

A characteristic length scale:

$$l_0 = 0.5 \text{ m}$$

A characteristic time scale:

$$t_0 = \frac{Q_{sat}}{\langle Q_{sat} \rangle} l_0^2$$

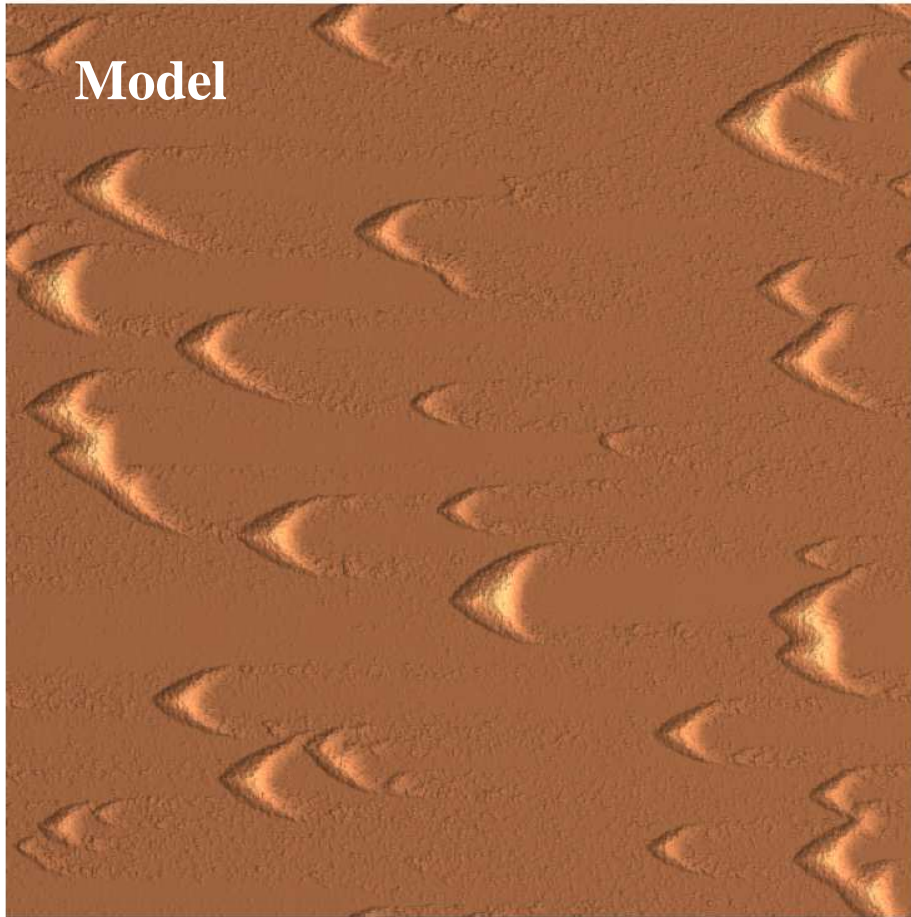
# Conclusion

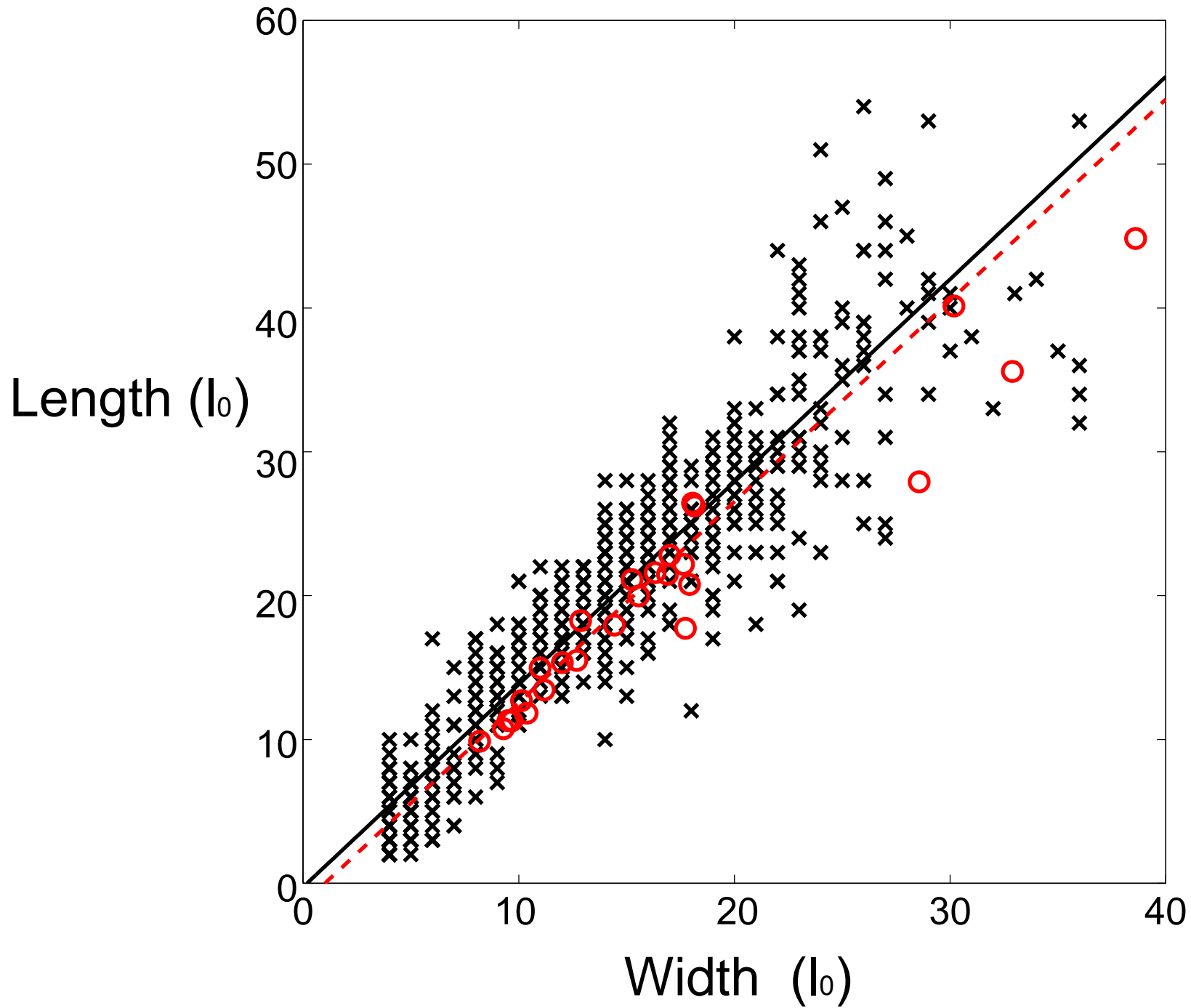
The model displays

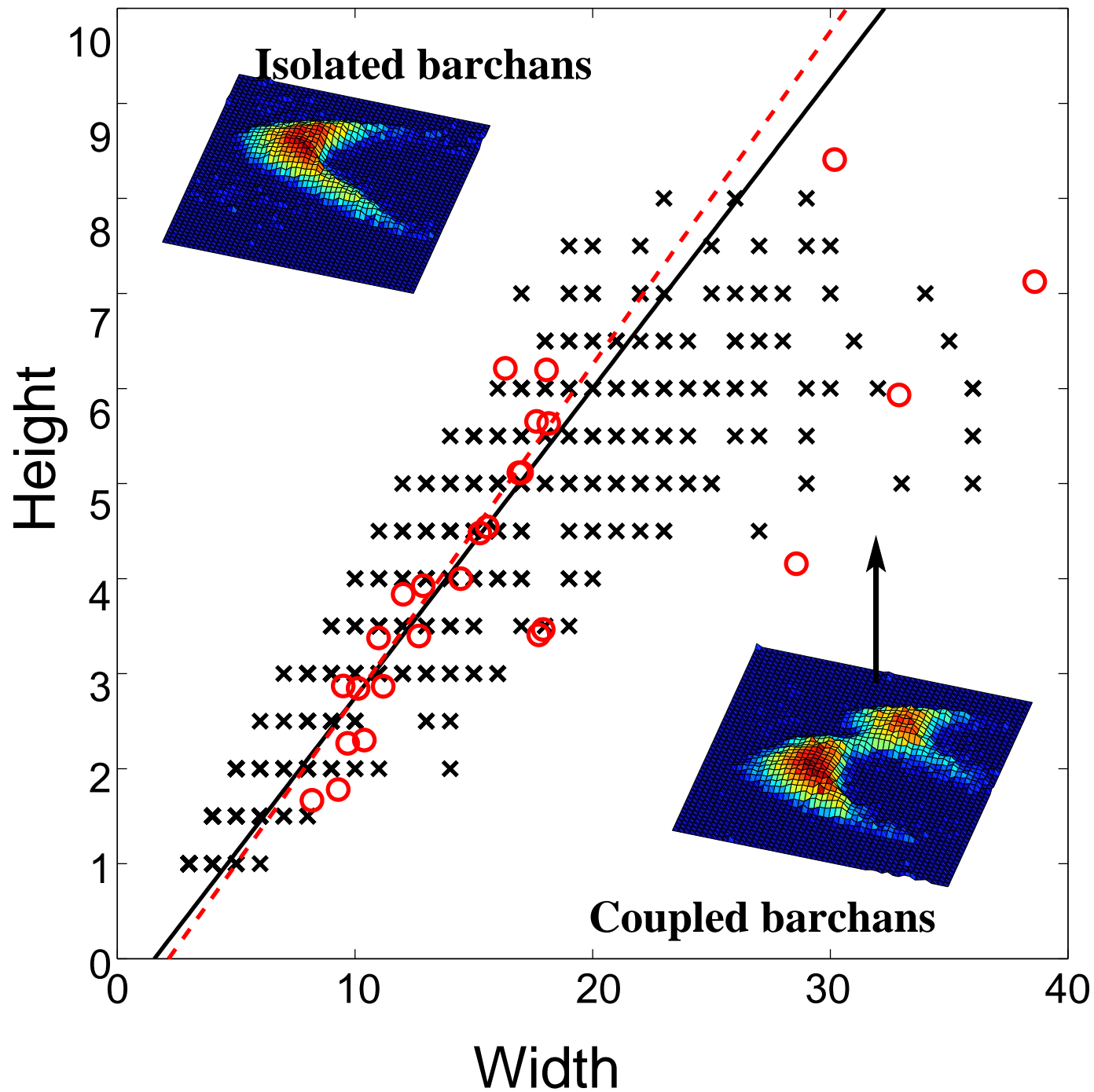
- many types of dune morphologies.
- waves on the surface of dunes.
- $l_{sat}$  and  $Q_{sat}$ .
- $\lambda_{max}$ .

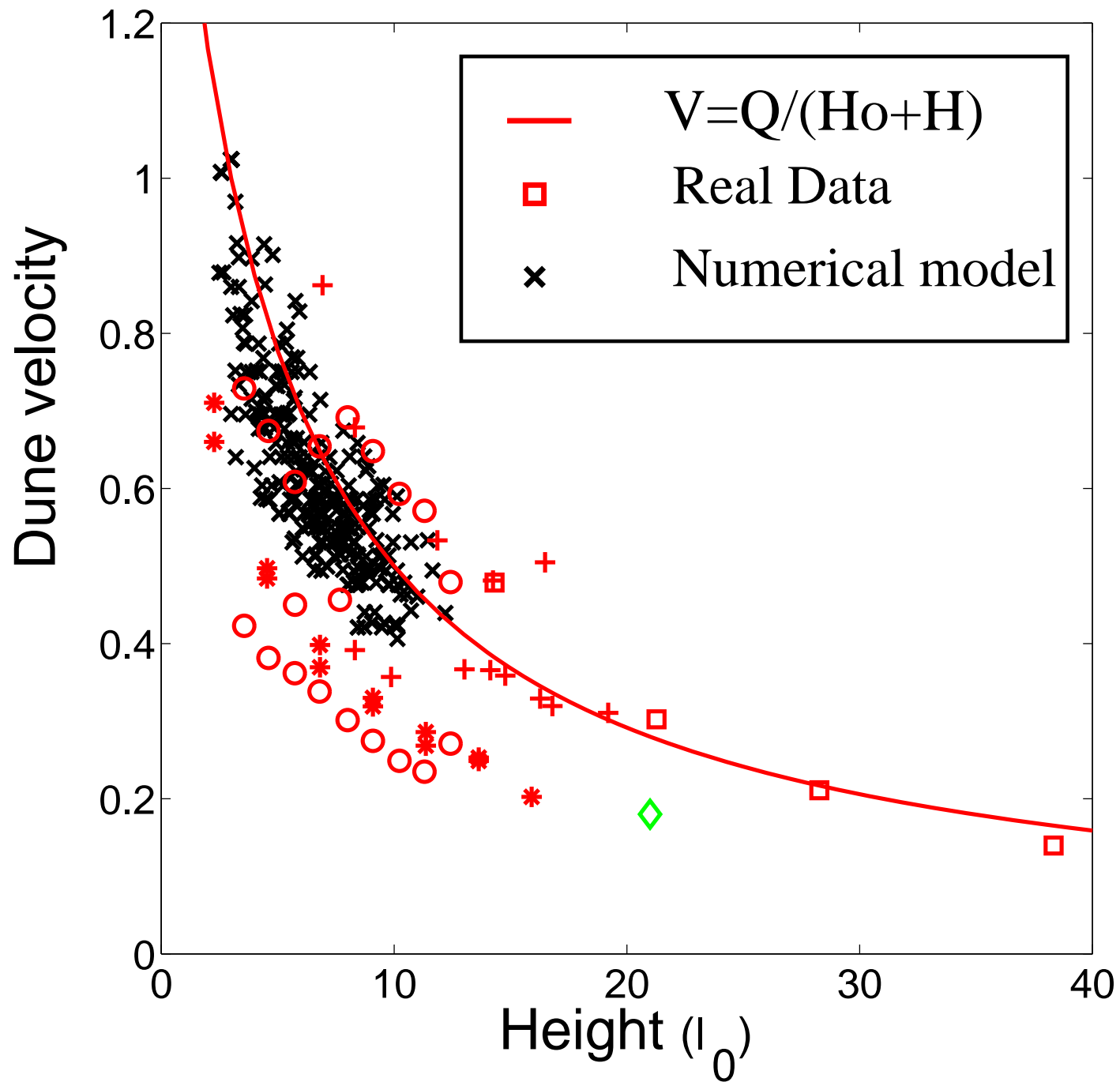
It can be used for systematic quantitative analysis of dune patterns in all physical environments.

# *Population of dunes*

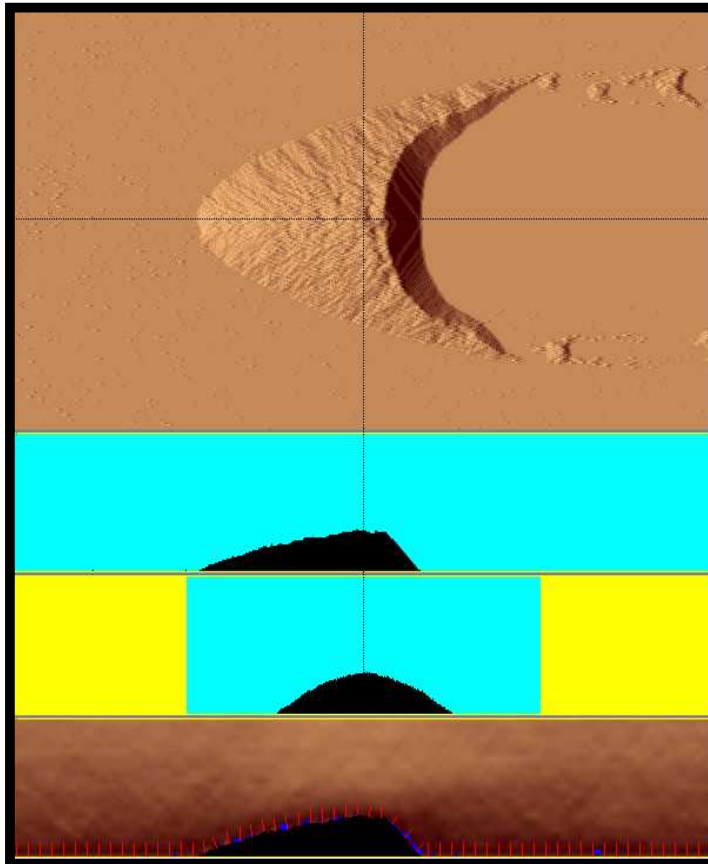




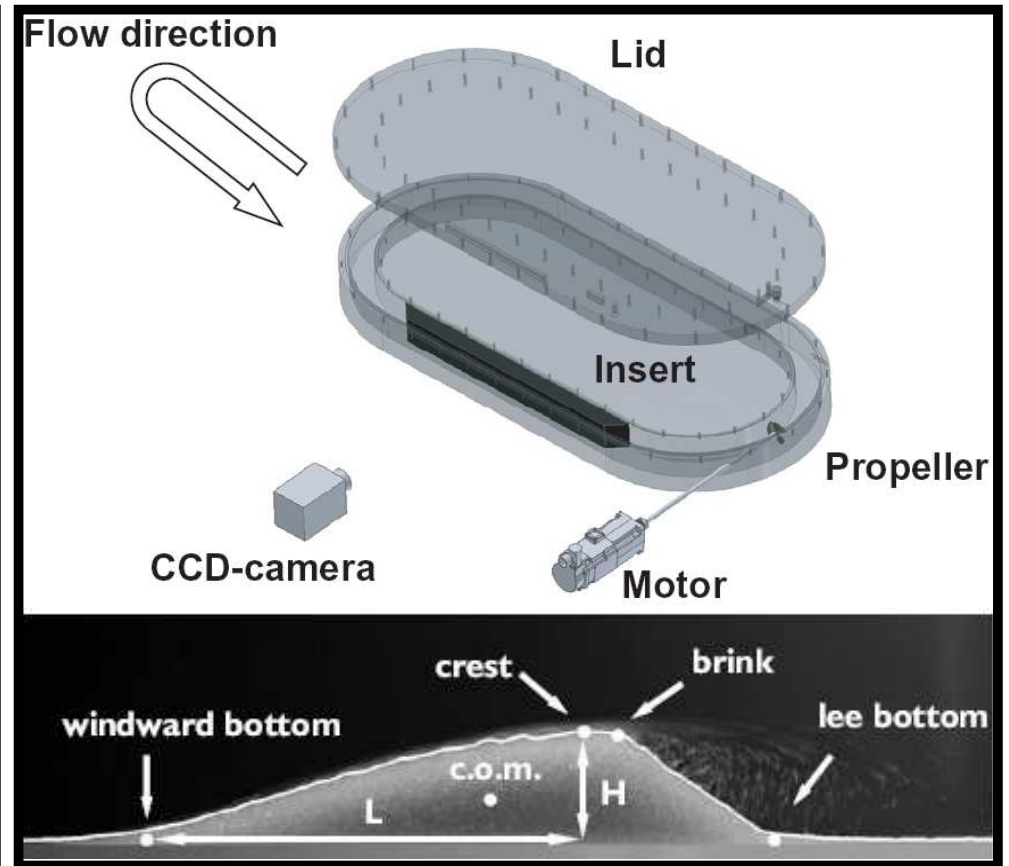




# Comparisons between numerical and experimental data

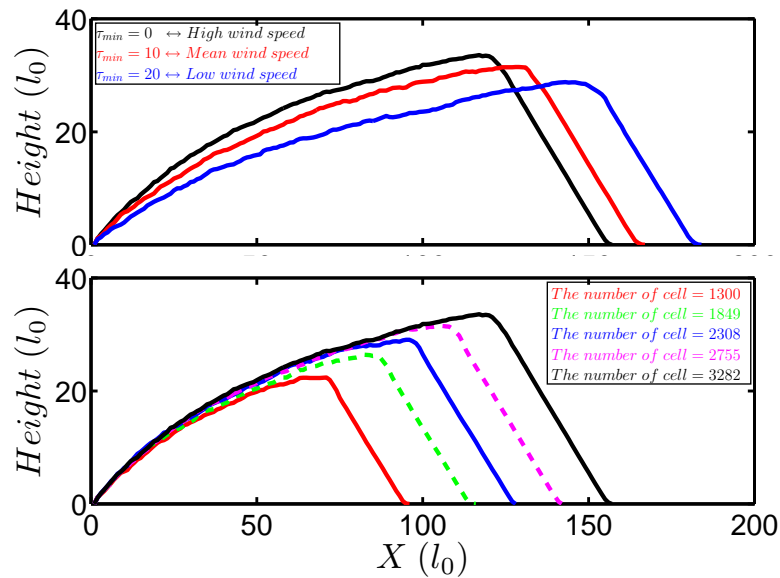


Numerical results

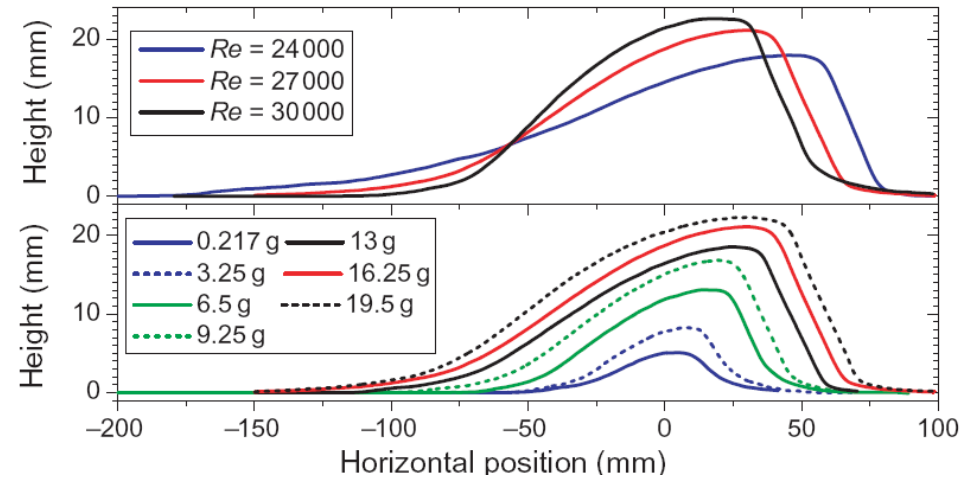


Laboratory experiments (Germany)

# Comparisons between numerical and experimental data

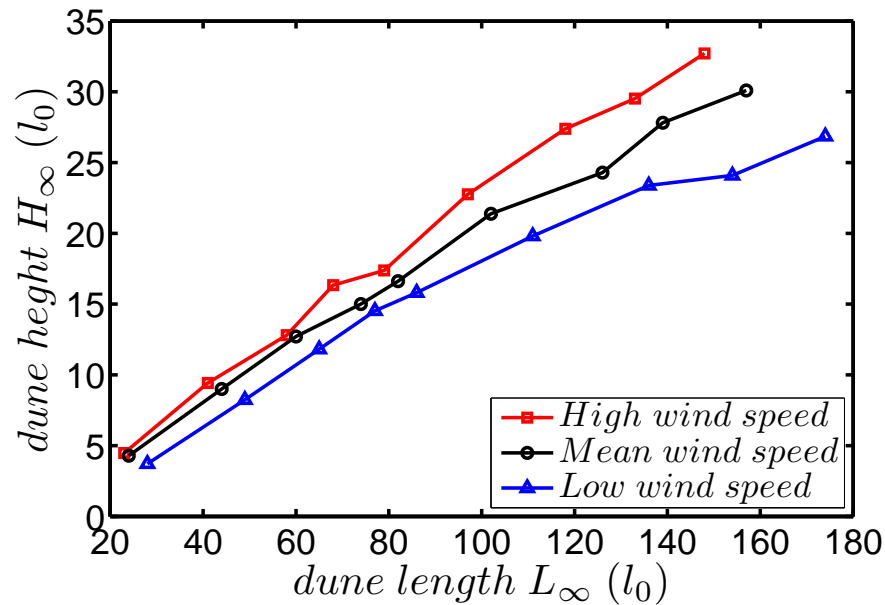


Numerical data

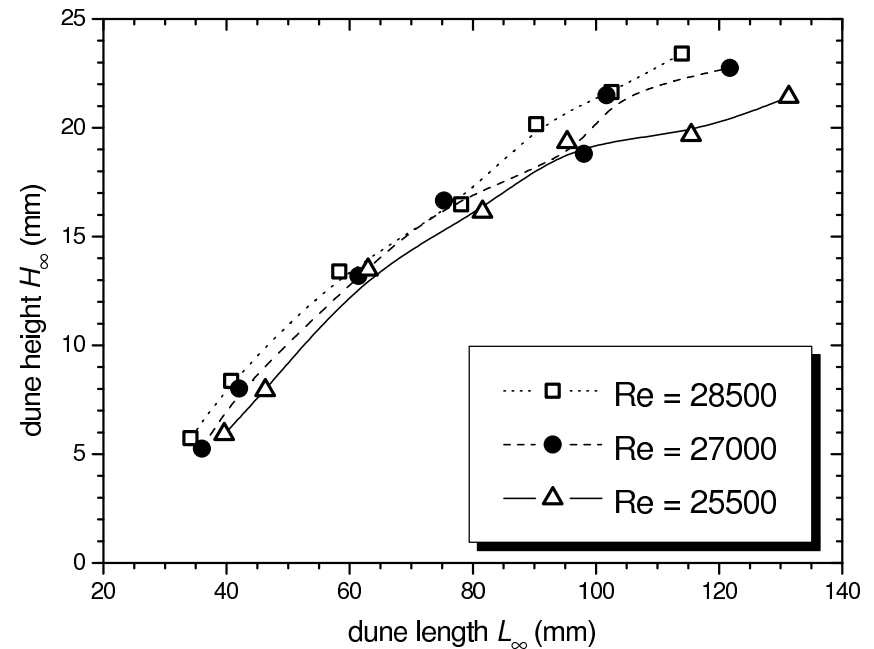


Experimental data

# Comparisons between numerical and experimental data

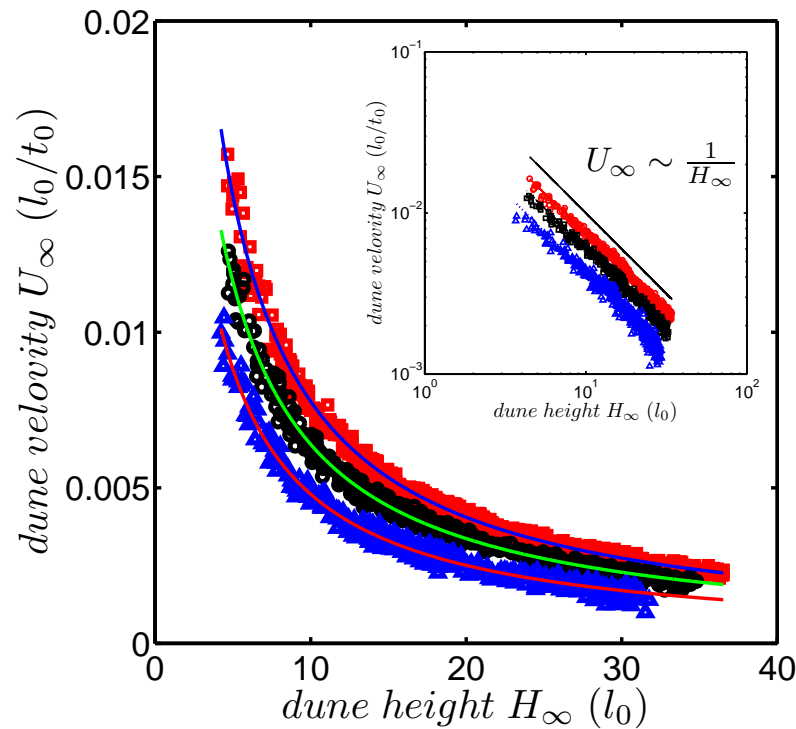


Numerical data

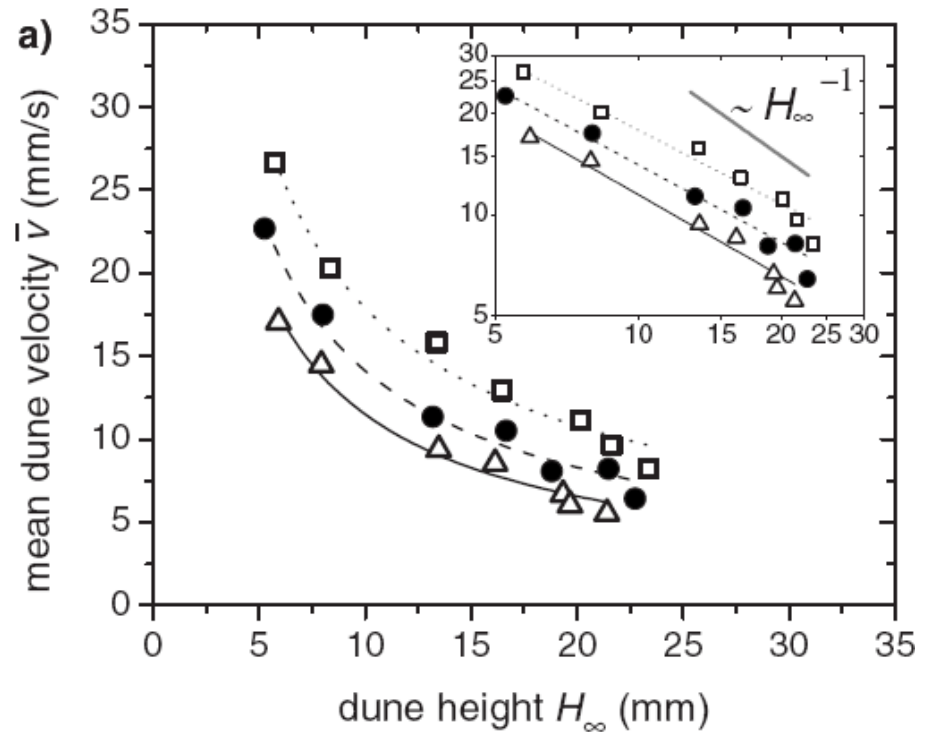


Experimental data

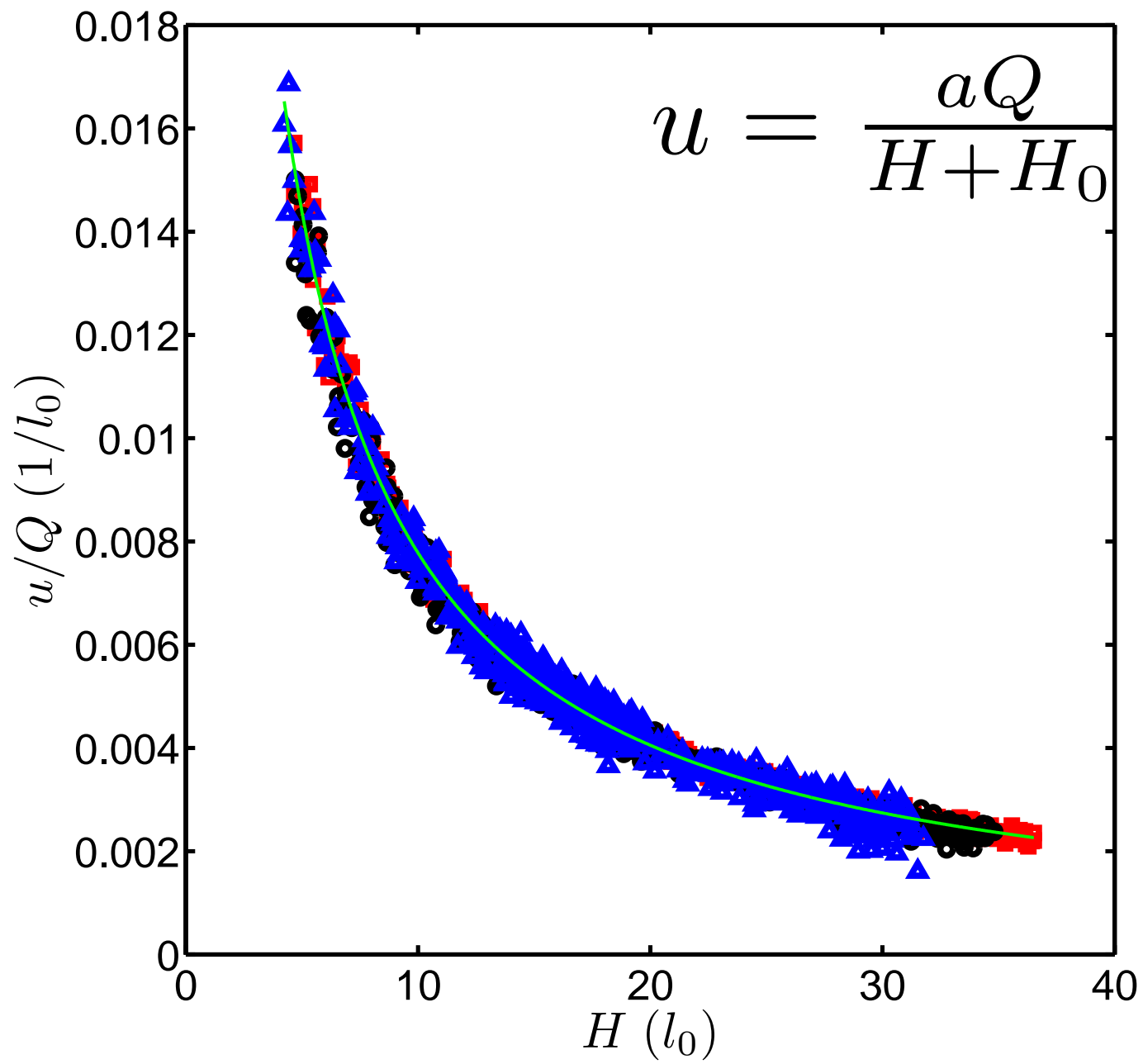
# Comparisons between numerical and experimental data



Numerical data

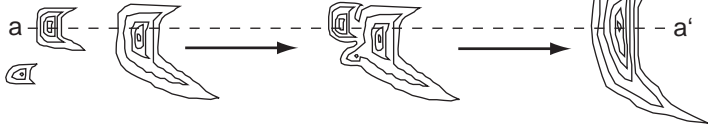


Experimental data

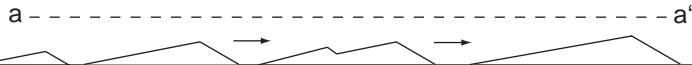


# Merger

plan-view



cross-section

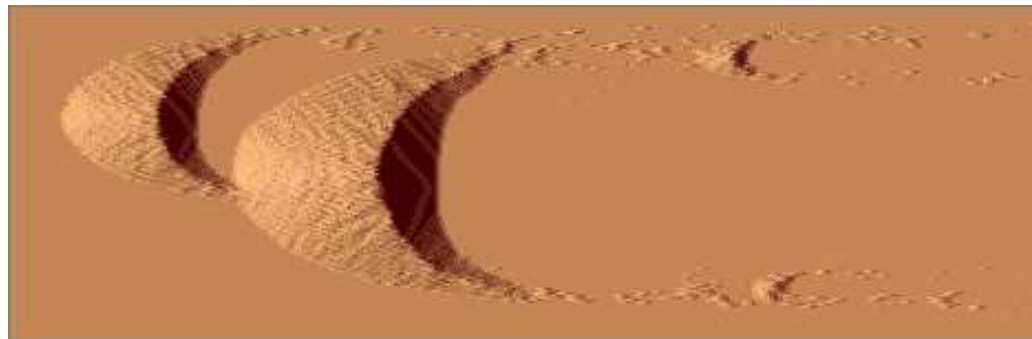
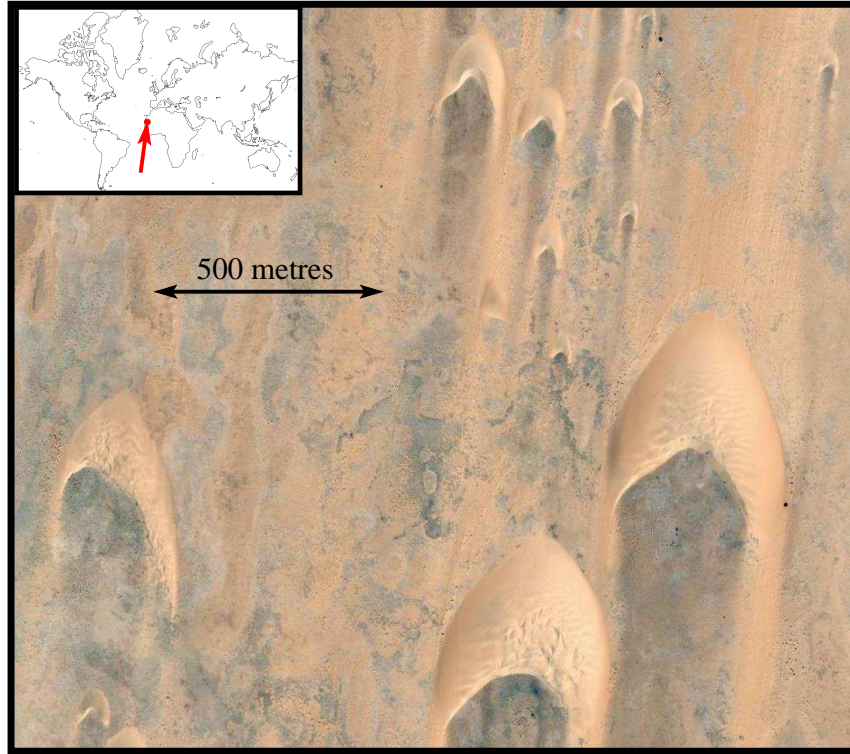


# Lateral-linking

plan-view



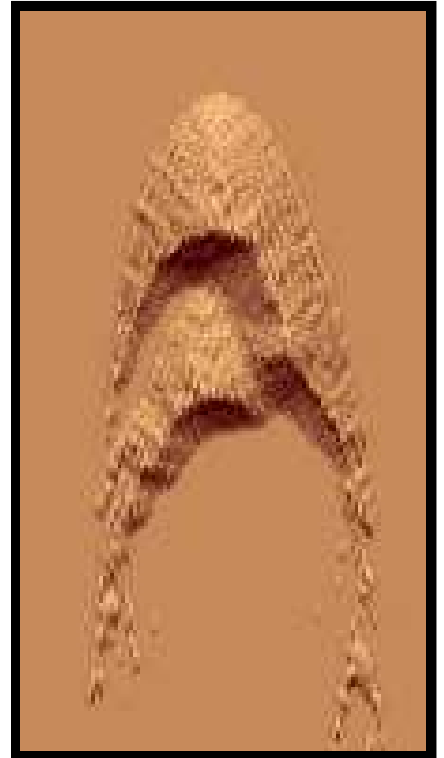
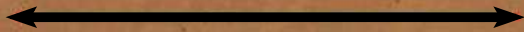
# Collision of dunes

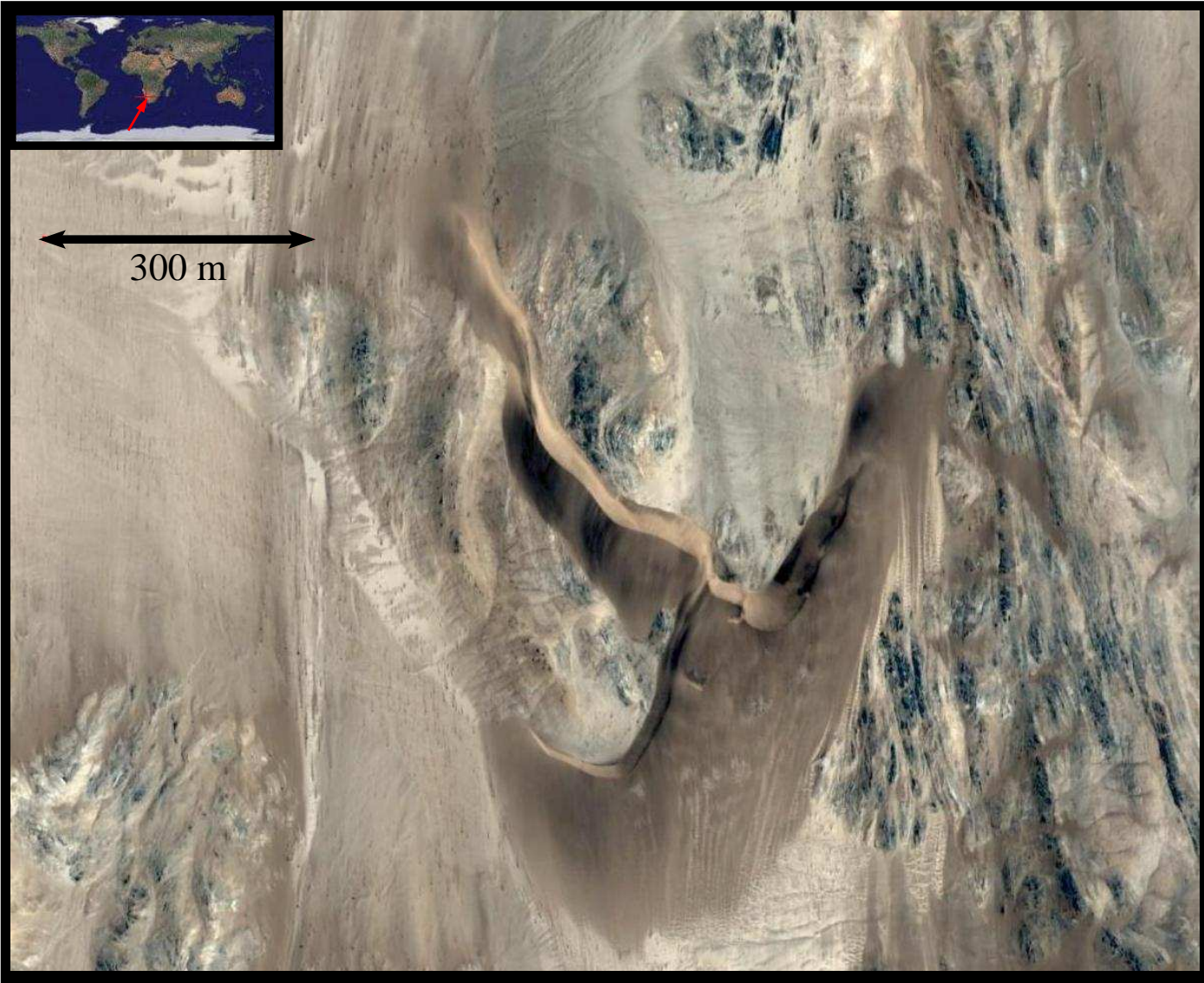




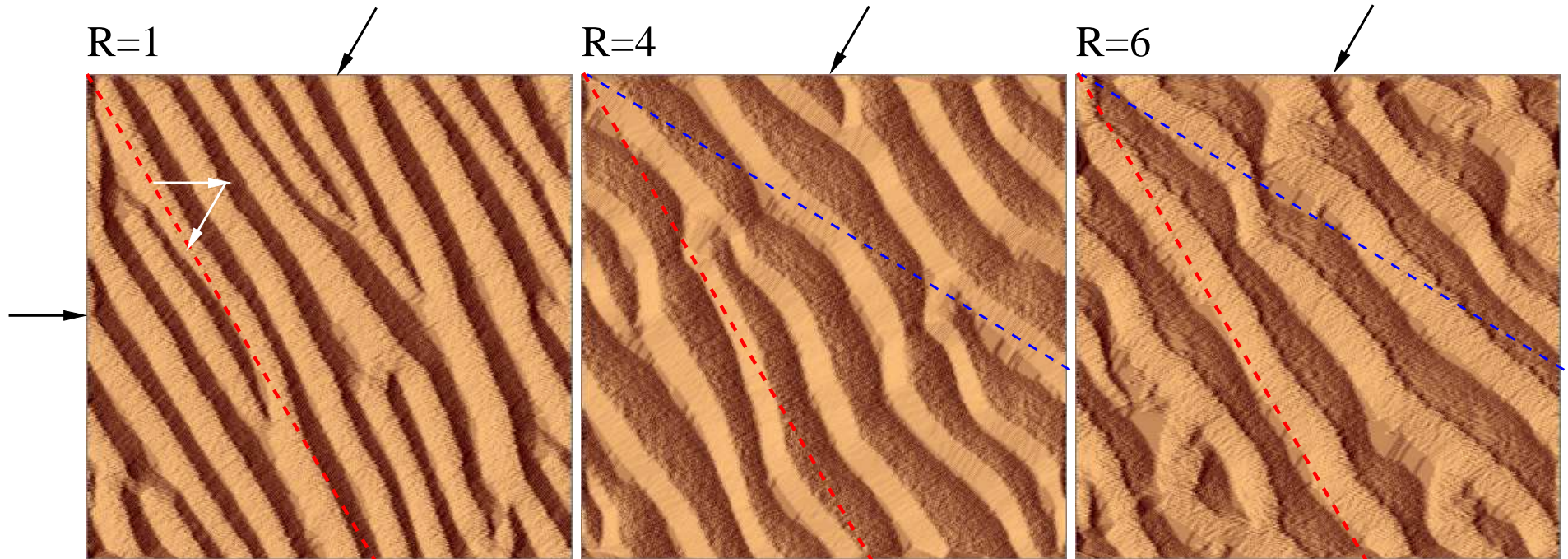


200 m





# Longitudinal dunes

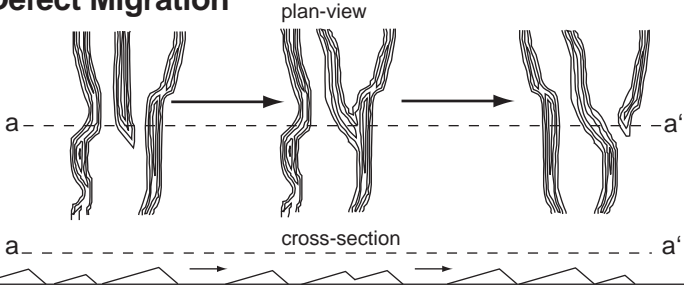


..... Longitudinal

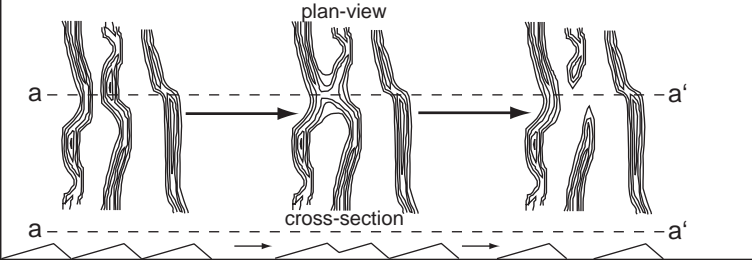
..... Transverse



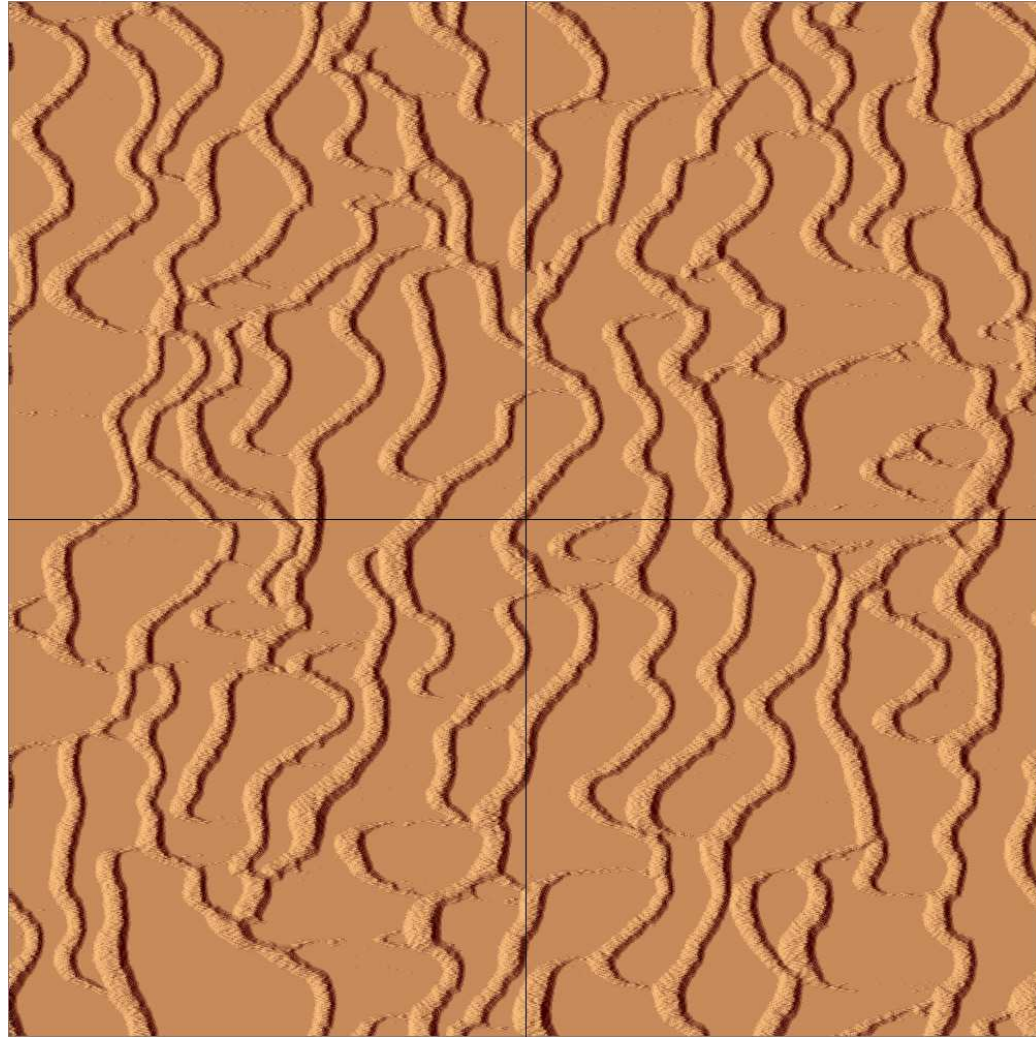
# Defect Migration



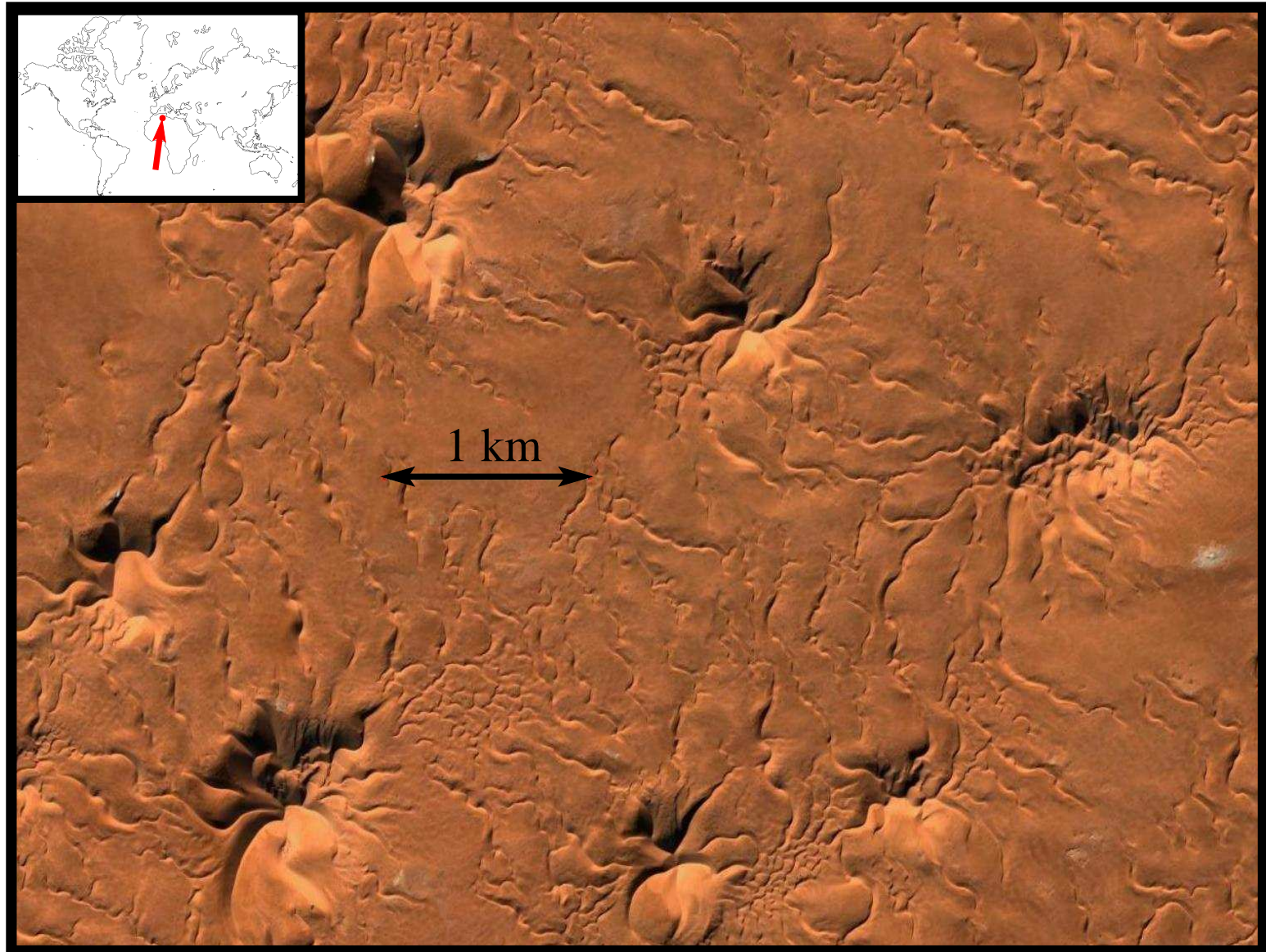
# Termination Creation

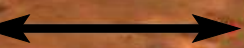
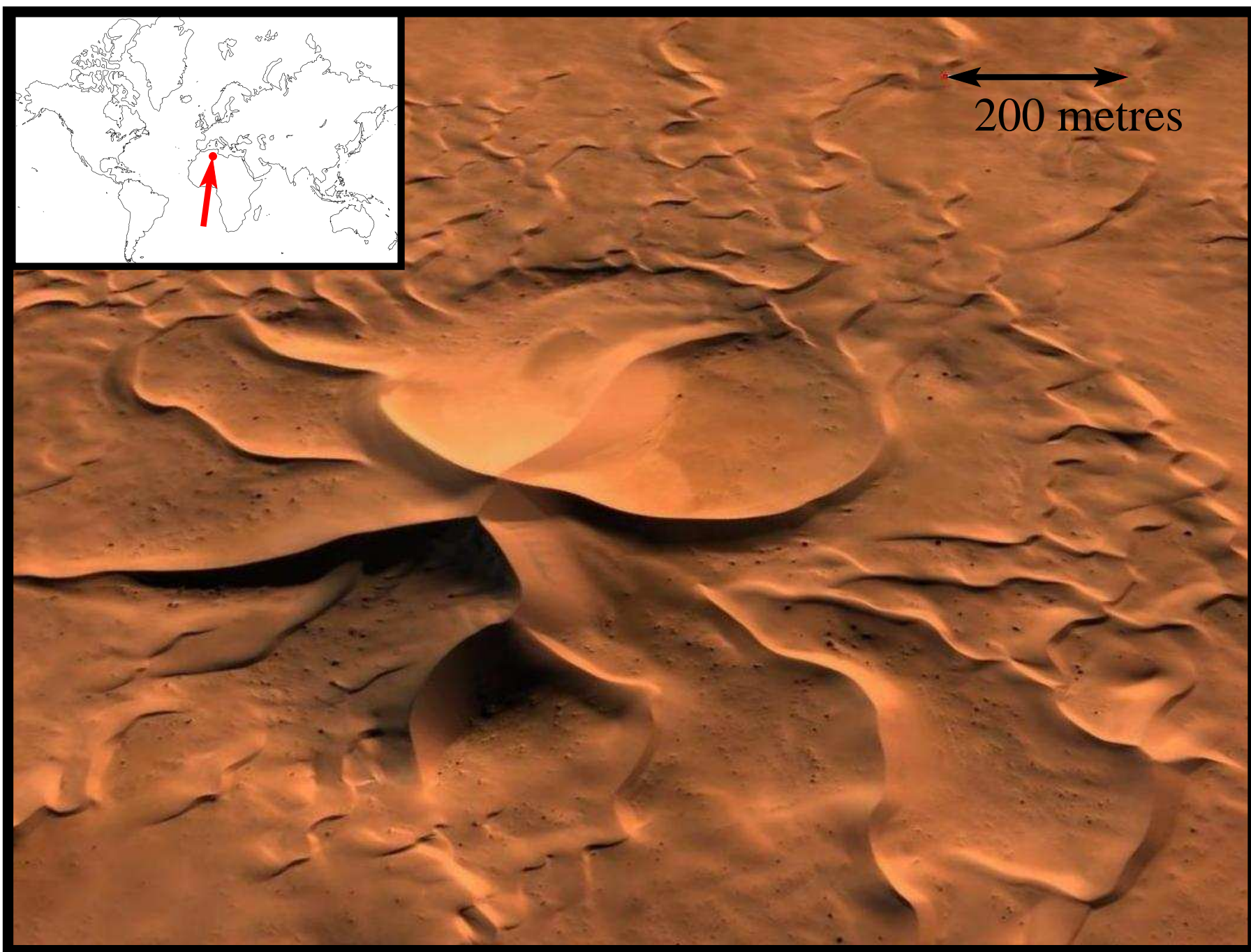


# *From transverse to barchan dunes*

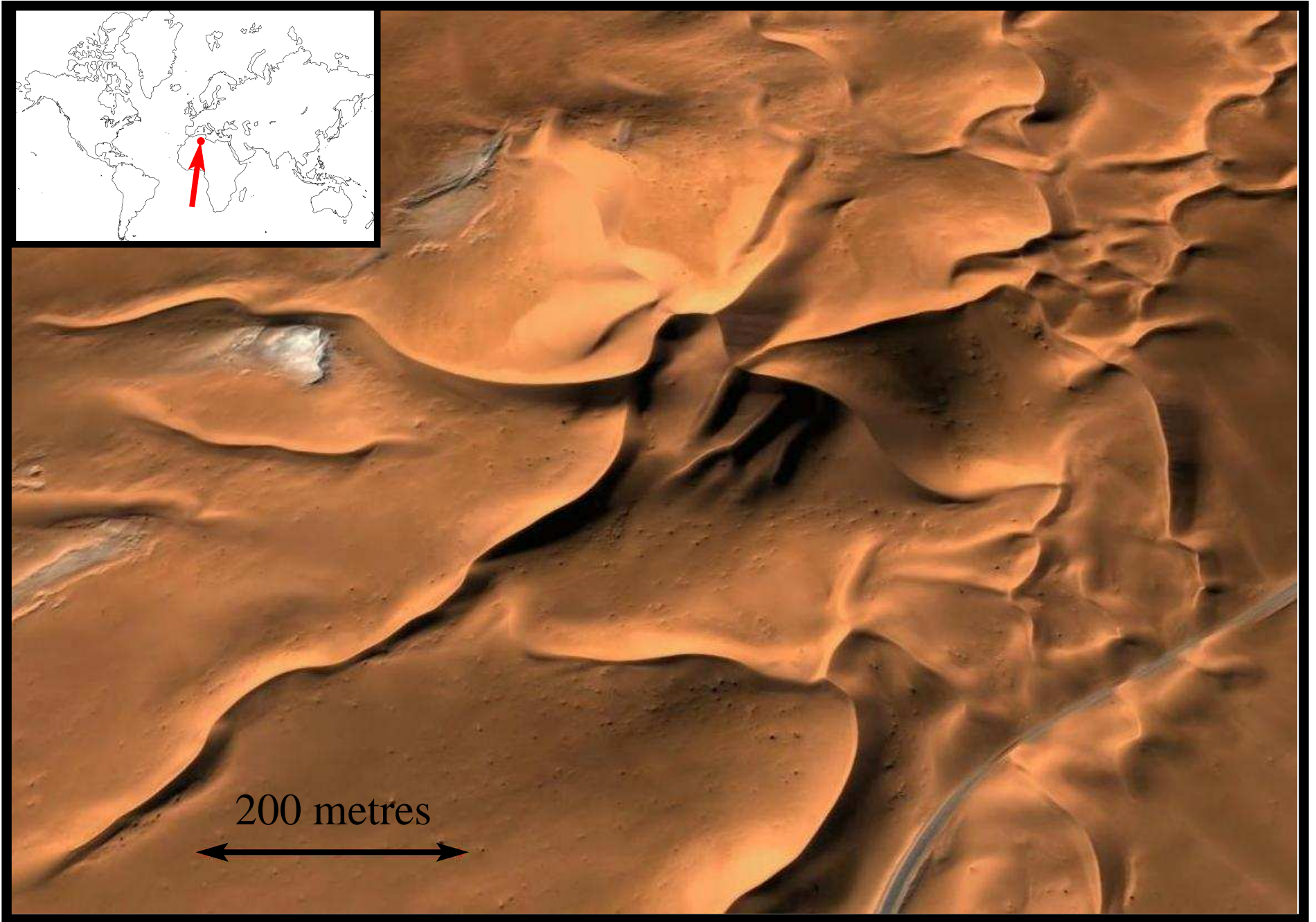


# *Star dunes*



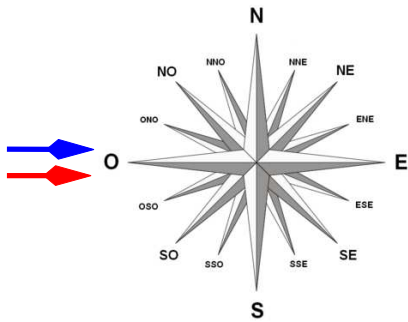


200 metres

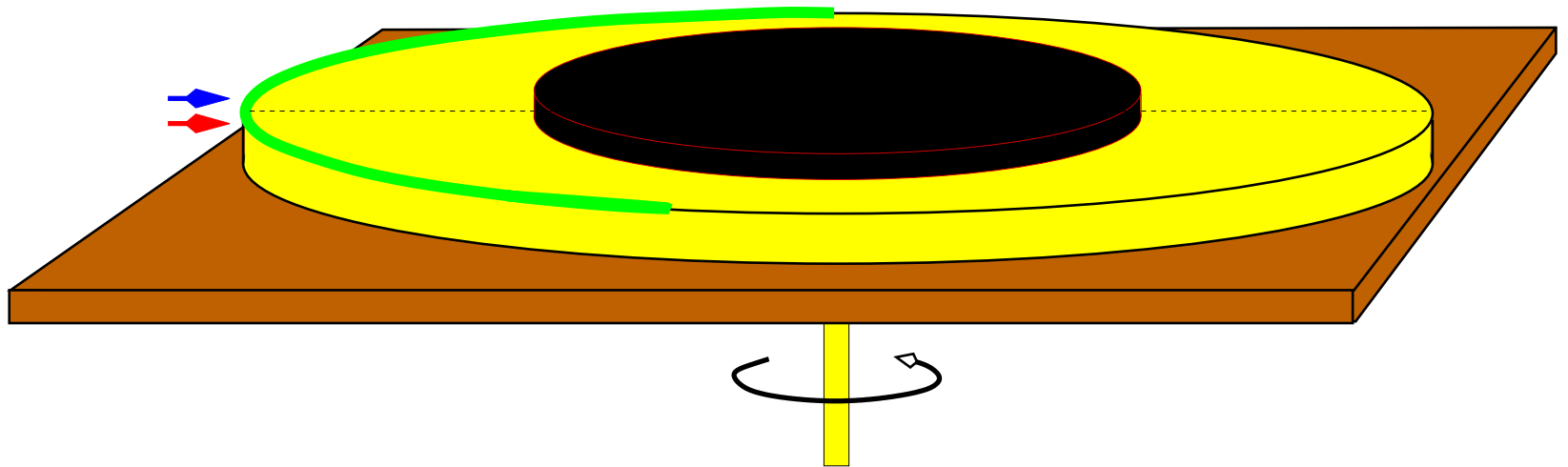


200 metres

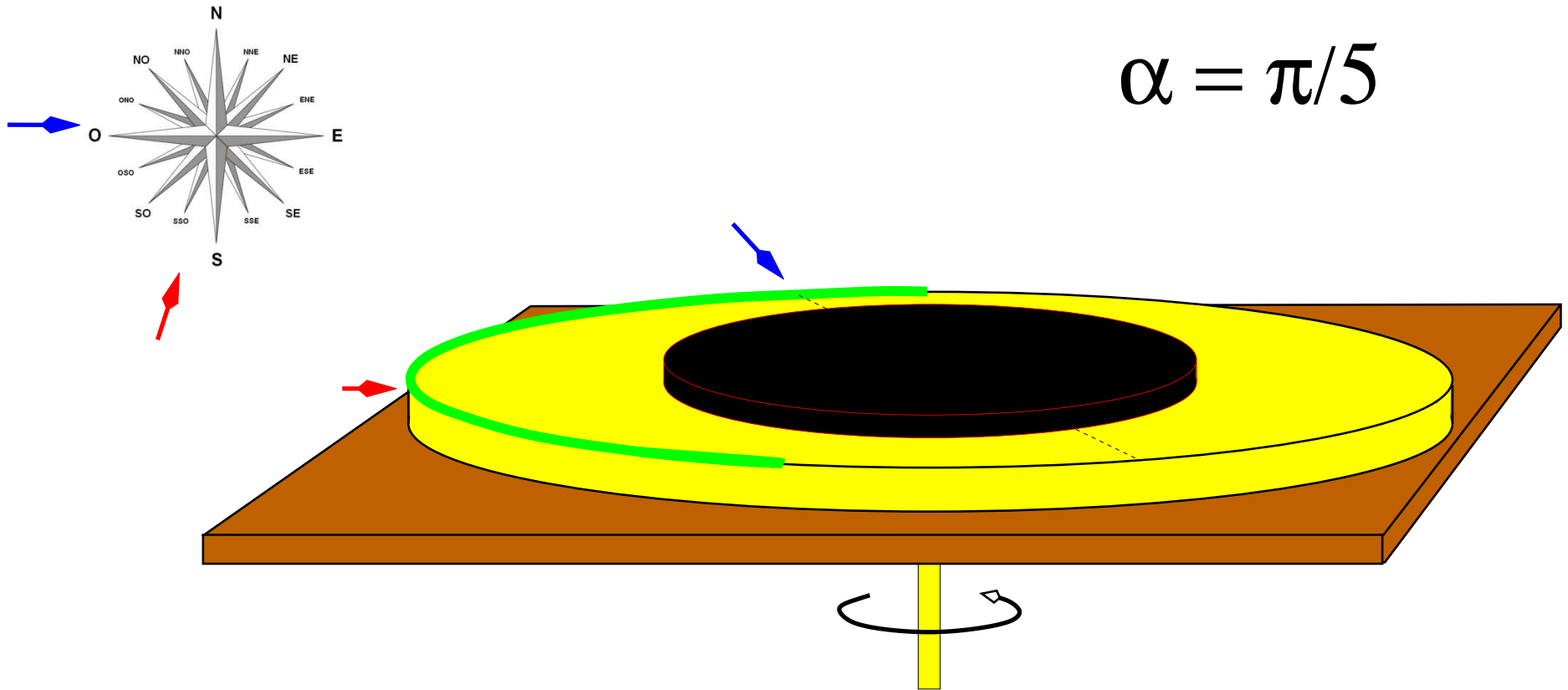
# Rotating table for variable wind orientations



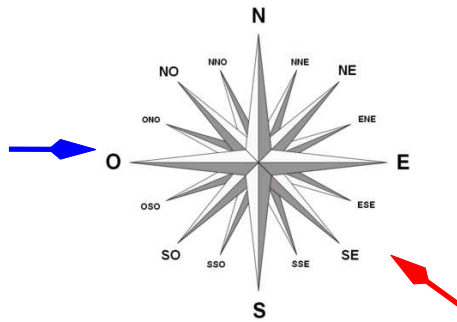
$$\alpha = 0^\circ$$



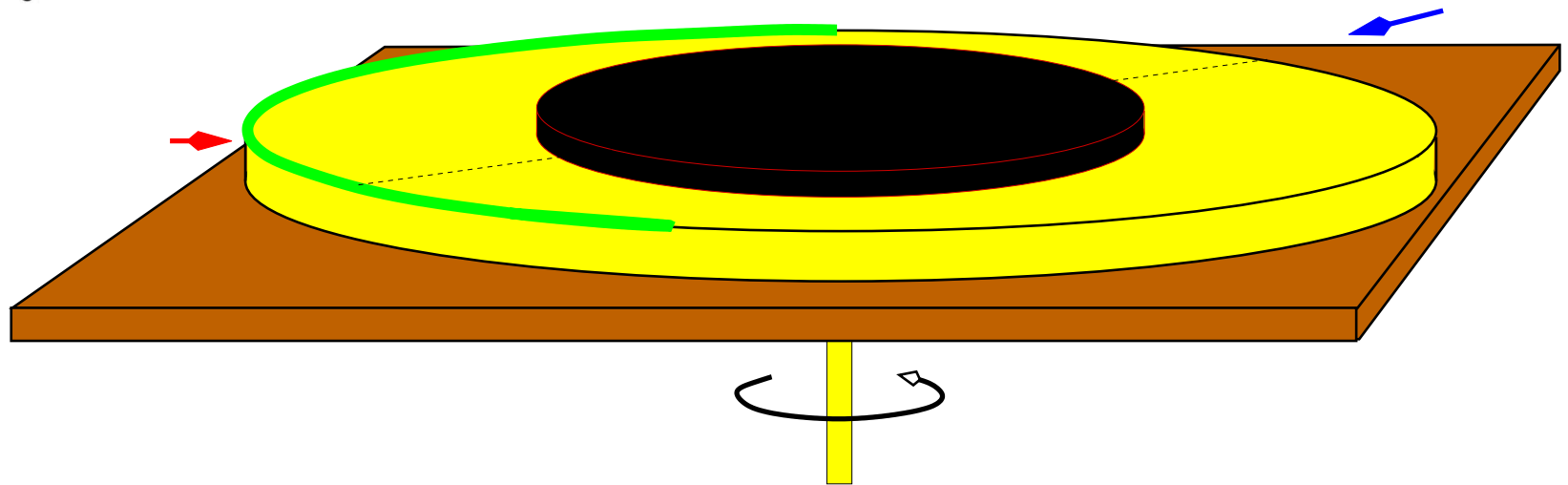
# Rotating table for variable wind orientations



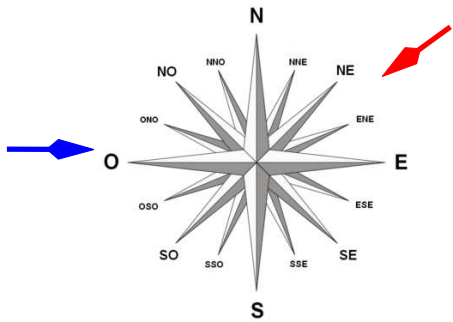
# Rotating table for variable wind orientations



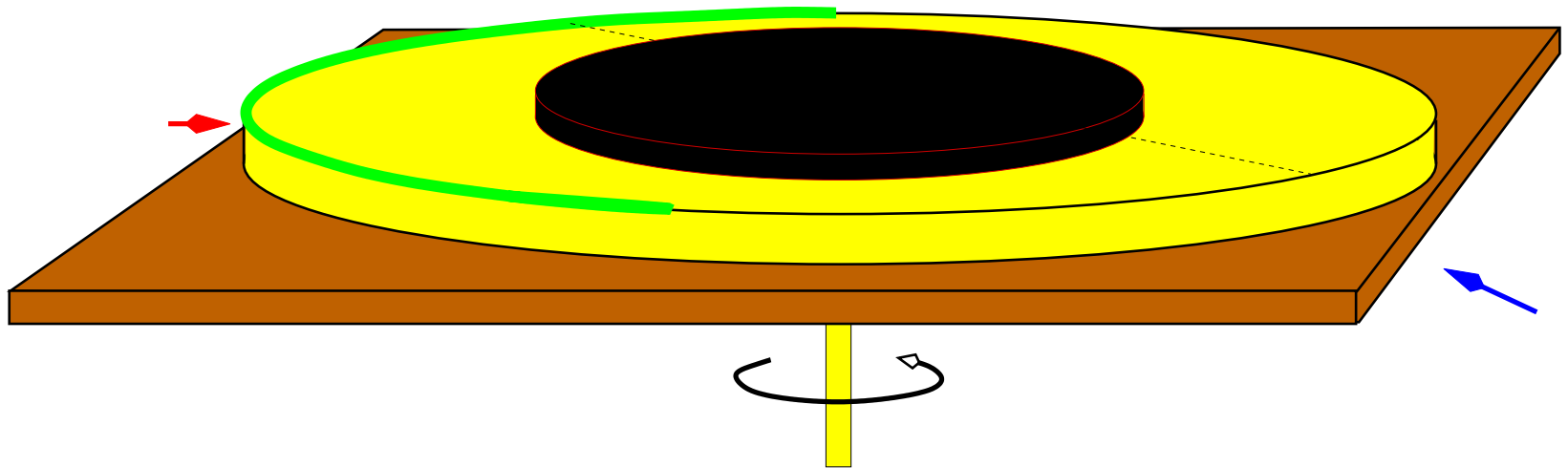
$$\alpha = 2\pi/5$$



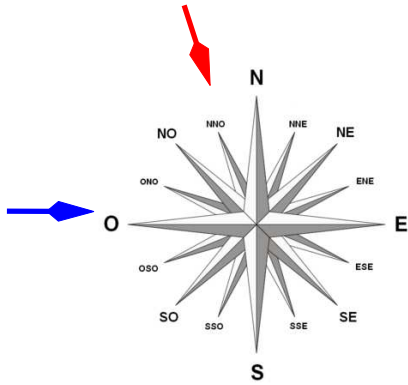
# Rotating table for variable wind orientations



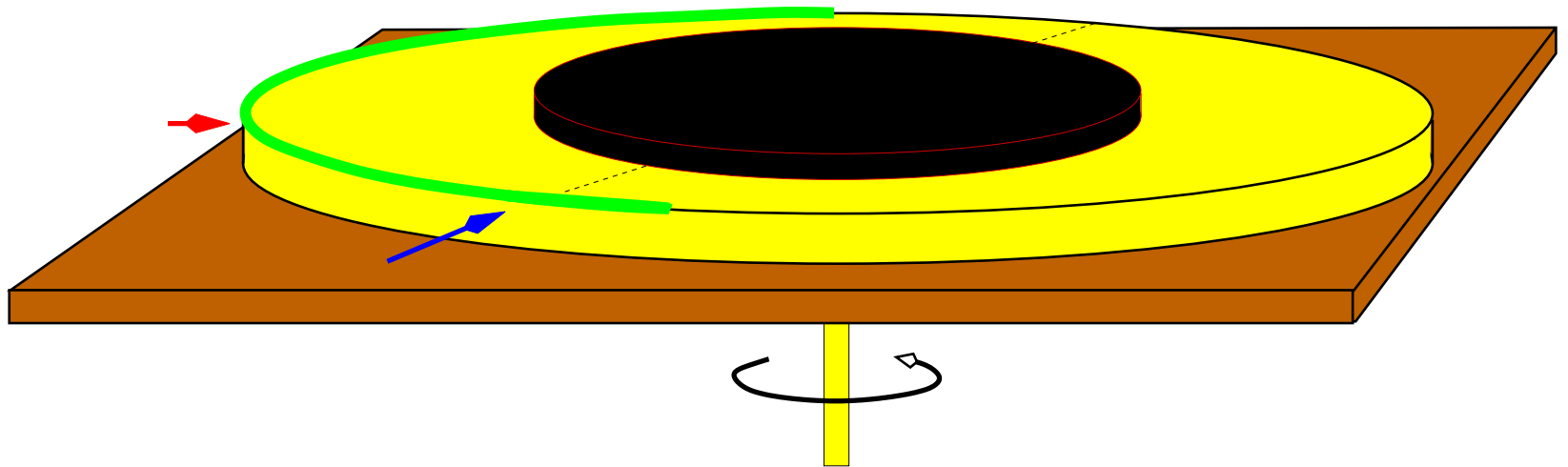
$$\alpha = 3\pi/5$$



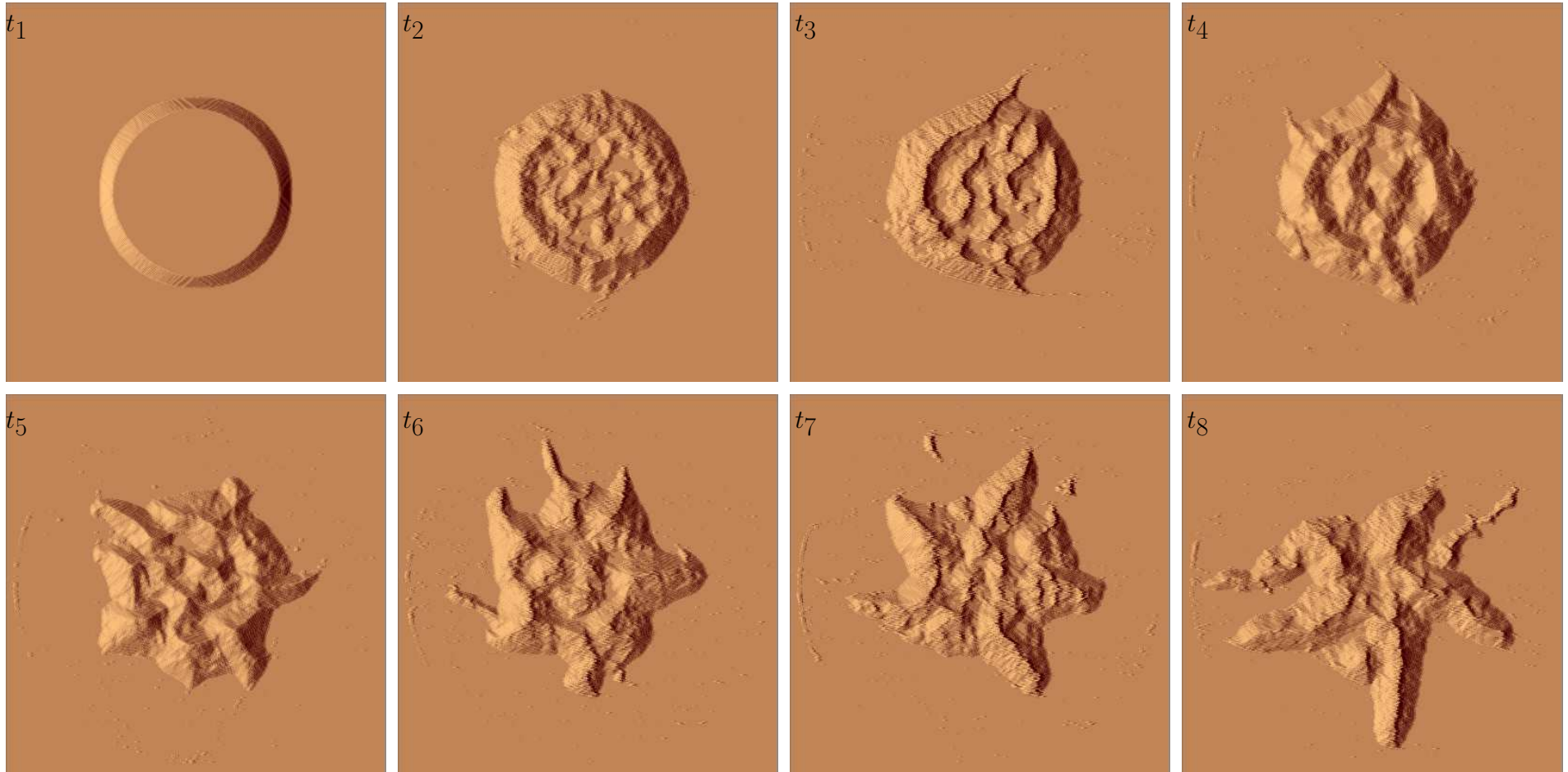
# Rotating table for variable wind orientations



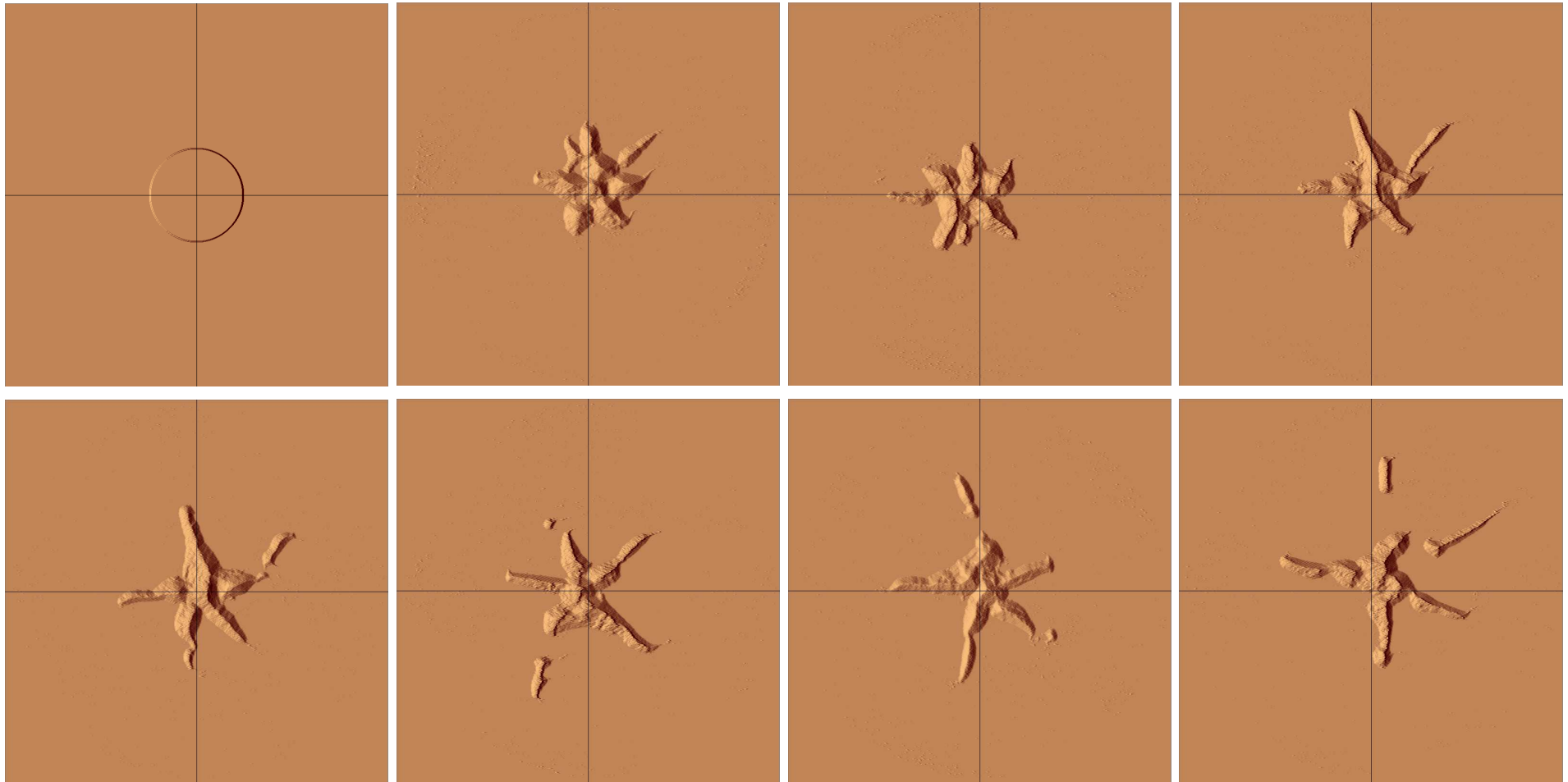
$$\alpha = 4\pi/5$$



# *Star dunes*



# *Star dunes*





A large set of observations

Qualitative descriptions of dune shapes

Elegant physical formalisms

Pattern selection

Population dynamics

A quantitative analysis of sediment transport



We can use dunes patterns  
to constrain climatic variations