

Windblown Sand Modelling and Mitigation

MAFD - TCS

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January 28th, 2021



**von KARMAN INSTITUTE
FOR FLUID DYNAMICS**

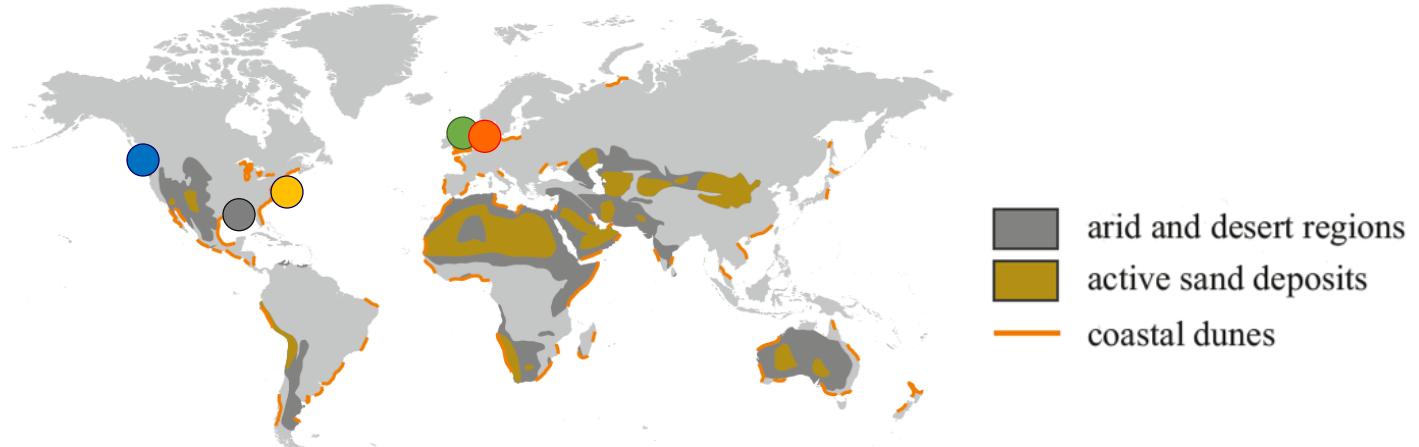


OPTIFLOW

WSMM



Industrial Motivation: coastal zones



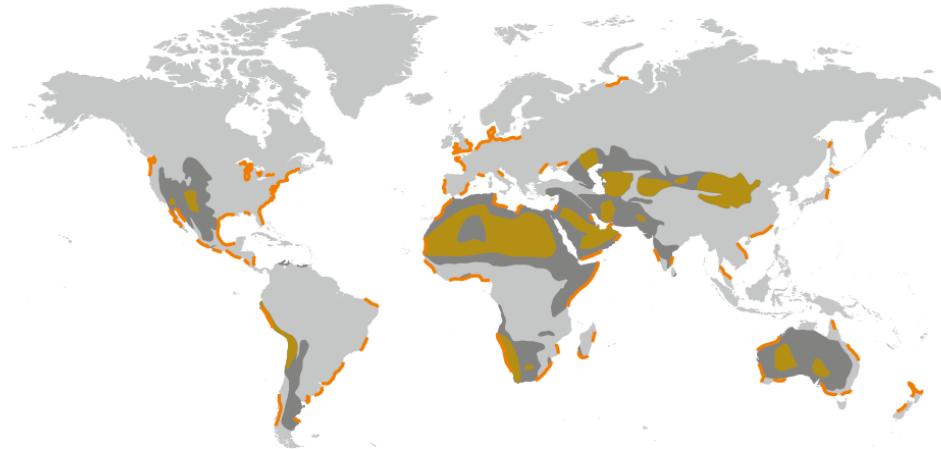
US

EU

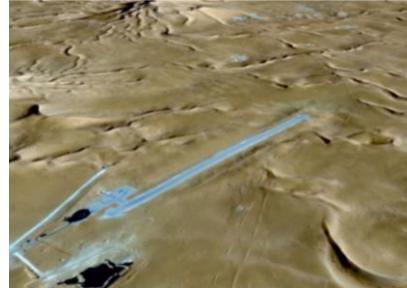
Windstorm frequency +44%

Windstorm intensity +96%

Industrial Motivation: desert regions



■ arid and desert regions
■ active sand deposits
— coastal dunes



Structure scale

Urban scale

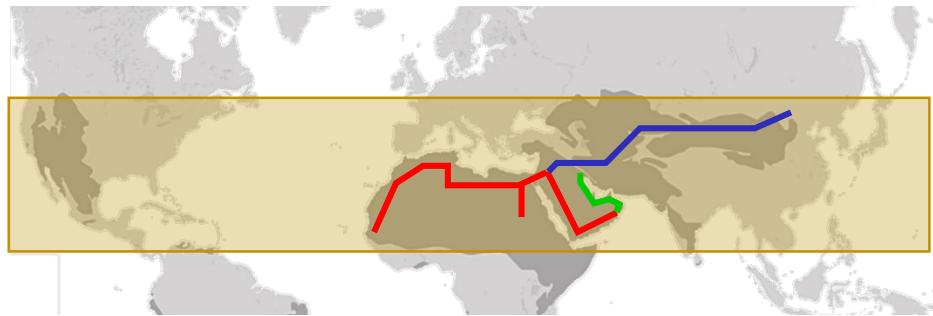
Infrastructure scale

Industrial Motivation: railway megaprojects



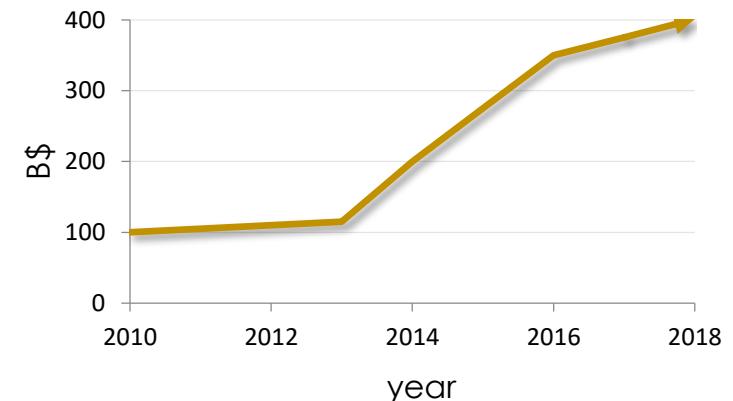
Railway megaprojects

- Iron Silk Road
- Gulf Cooperation Council Network
- Arab League Network



■ arid regions

■ northern desert belt



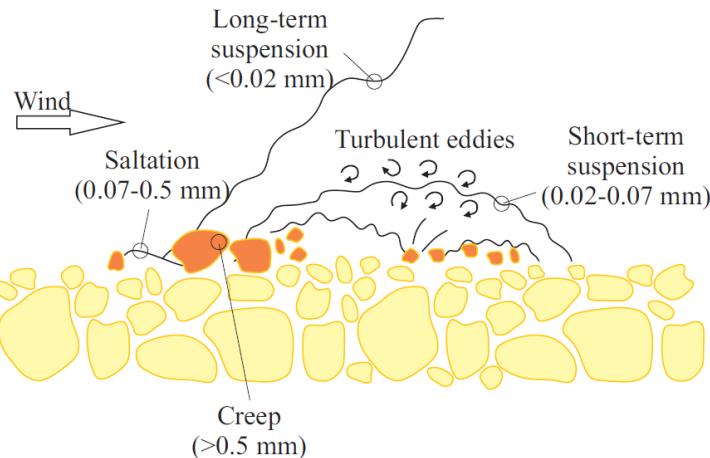
Market potential

• **000** B\$

Railway length

• **00000** Km

Phenomenology



Dust $d < 0.063$ mm

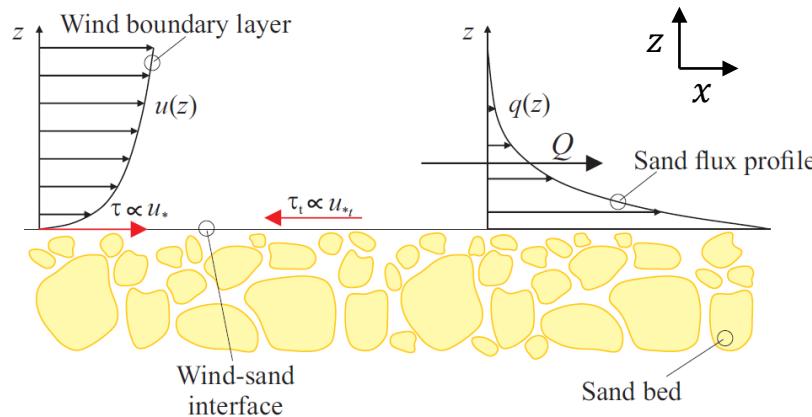
- long-term suspension
- short-term suspension

Sand $d \in [0.063, 2]$ mm

- creep
- saltation

Engineering interest

Saltation



$$q(z) > 0 \iff$$

$$u_* = \sqrt{\tau / \rho_a}$$

$$\tau > \tau_t$$

WbS saltation condition

Threshold shear velocity

Sand transport rate

$$[kg\ m^{-1}s^{-1}]$$

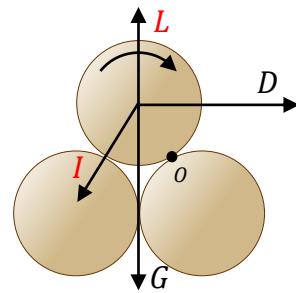
$$Q = \int_0^{+\infty} q(z) dz$$

Modelling: u_{*t}

Deterministic models

Microscopic models

- Equilibrium of the moments
Entrainment aerodynamic forces VS Stabilizing forces



Macroscopic models

- Semi-empirical (free parameters)
- Trend VS d

$$u_{*t} = A \sqrt{\frac{\rho_p - \rho_a}{\rho_a} gd}$$

Bagnold (1941)

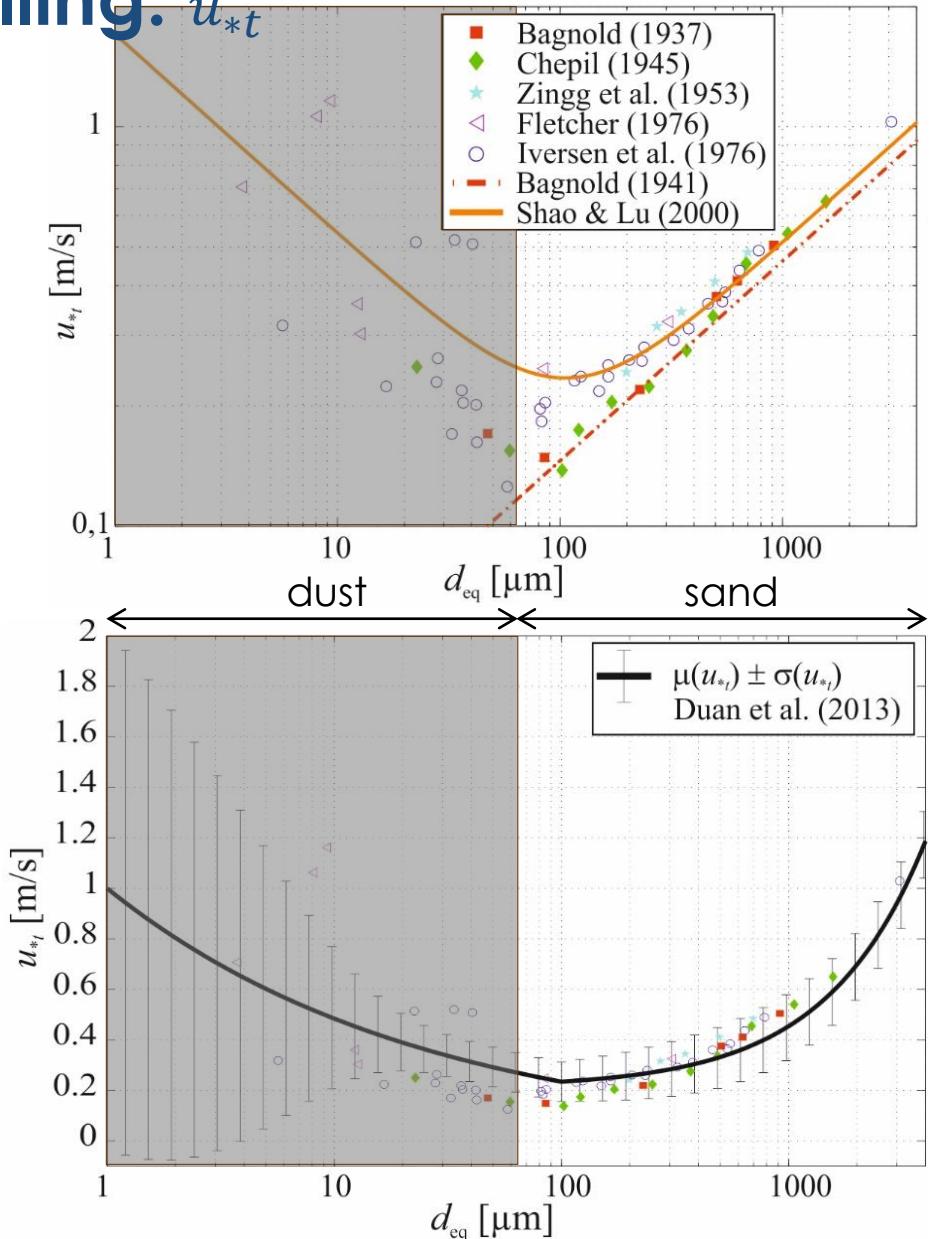
Probabilistic models

- Scatter of experimental data
- Random turbulent wind flow, bed grain geometry, interparticle forces Zimon (1982)



Duan et al. (2013)

4 microscopic r.v.s
Modelling and technical difficulties



Modelling: Q

Semi-empirical models

Bagnold type

$$Q \sim u_*^3$$

Modified Bagnold type

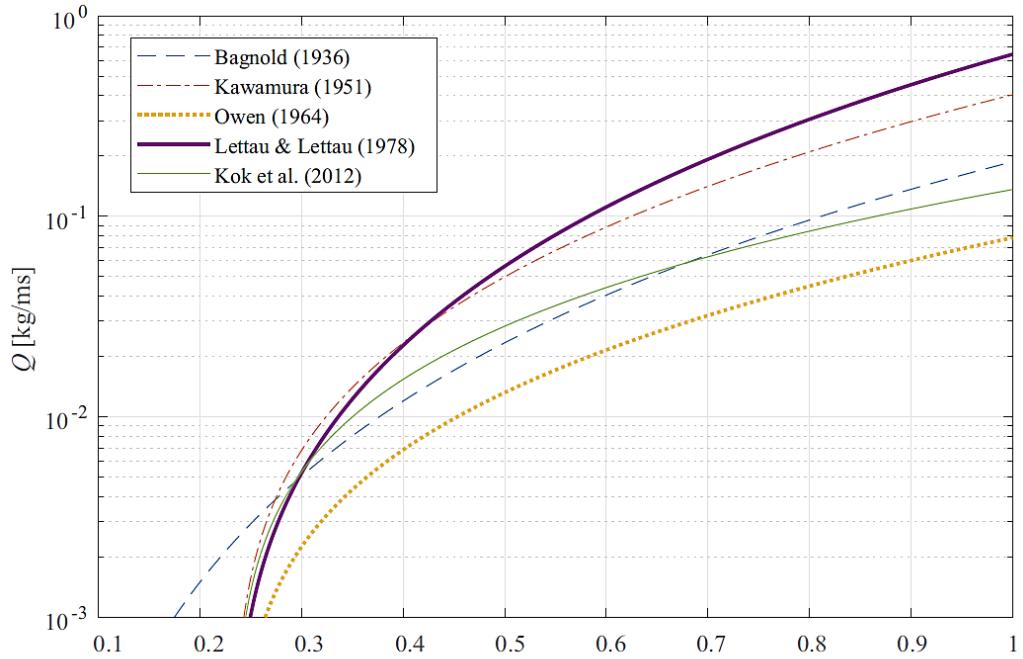
$$Q \sim u_{*,eff}^3(u_*, u_{*t})$$

O' Brien-Rindlaub type

$$Q \sim u$$

Dong et al. (2003)

Complex



$$Q = 2.78 \frac{\rho_a}{g} u_*^3 \left(1 - \frac{u_{*t}^2}{u_*^2}\right) \left(1 + \frac{u_{*t}}{u_*}\right) \quad \text{Kawamura (1951)}$$

$$Q = \left(0.25 + \frac{\omega_s}{3u_*}\right) \frac{\rho_a}{g} u_*^3 \left(1 - \frac{u_{*t}^2}{u_*^2}\right) \quad \text{Owen (1964)}$$

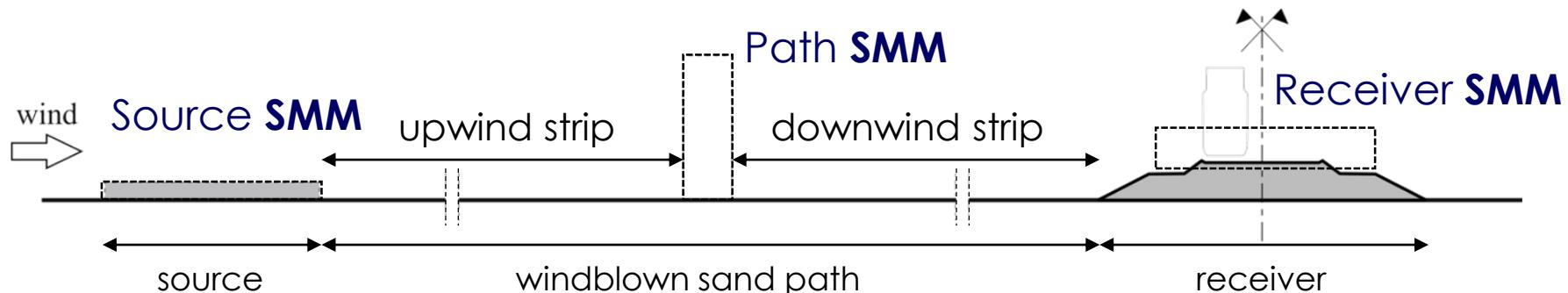
$$Q = 6.7 \sqrt{\frac{d}{d_r}} \frac{\rho_a}{g} u_*^3 \left(1 - \frac{u_{*t}}{u_*}\right) \quad \text{Lettau & Lettau (1978)}$$

$$Q = 5 \frac{\rho_a}{g} u_{*t} u_*^2 \left(1 - \frac{u_{*t}^2}{u_*^2}\right) \quad \text{Kok et al. (2012)}$$

Large discrepancies due to:

- large randomness of physical phenomenon
- debated scaling

Sand Mitigation Measures: Source



- Layer system



asphalt-latex mixture



natural crusting

$$Q \propto u_{*,eff} \propto \boxed{u_*^n} - \boxed{u_{*t}^n}$$

↓ ↓

Hedge system Layer system

- Hedge system



straw checkerboar

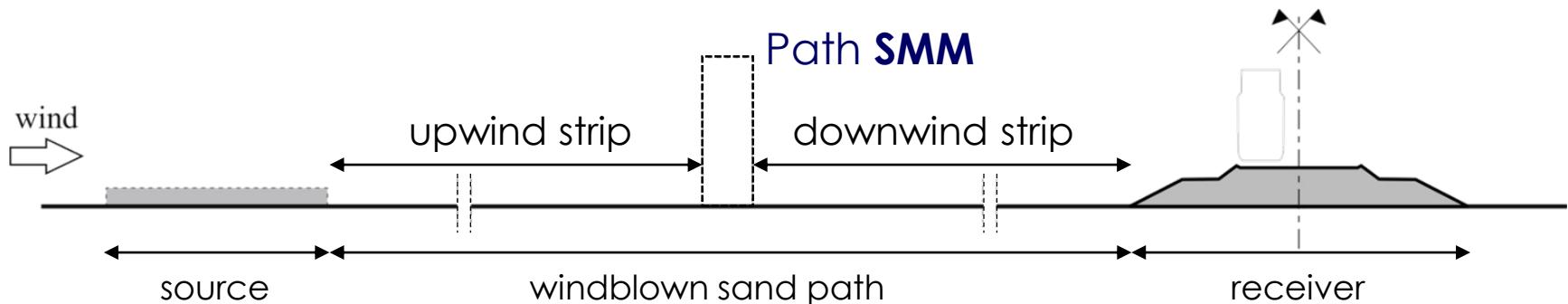


array line-like obstacles



gravel surface

Sand Mitigation Measures: Path



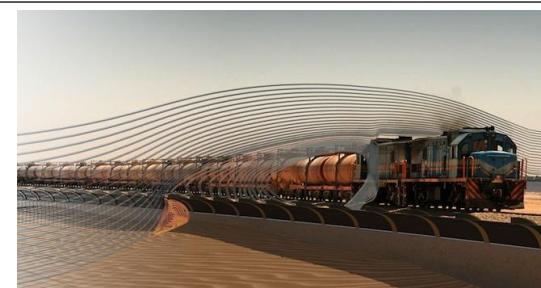
- Surface-like porous



porous fence



Straight Vertical Wall (SVW)



Shield for Sand (S4S)
WO 2016/181417 A1

- Volume-like

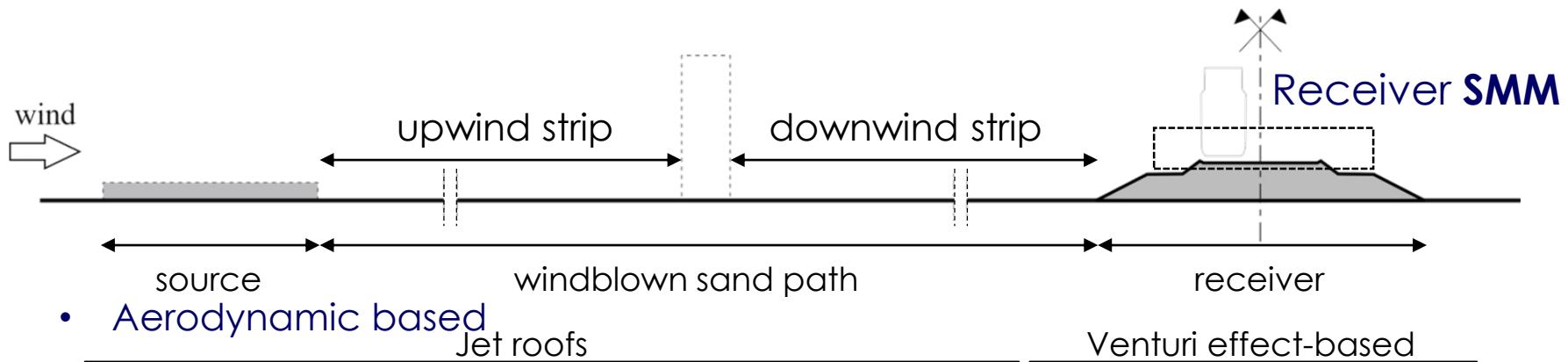


dyke

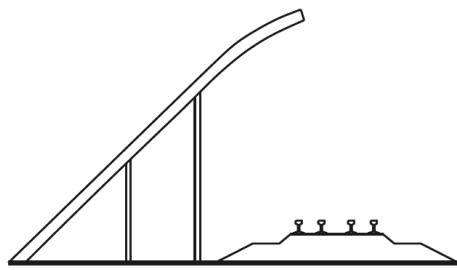


ditch

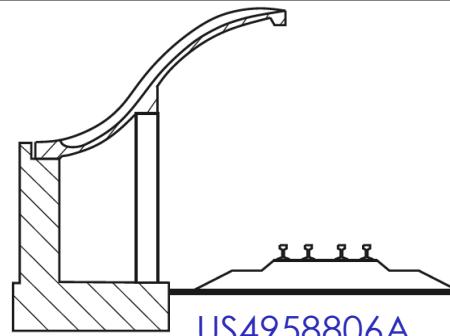
Sand Mitigation Measures: Receiver



- Aerodynamic based
Jet roofs



CN/102002916



US4958806A



Humped sleepers

- Sand-resistant



T-Track system



Continuous slab



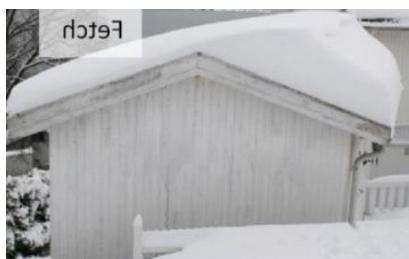
Lubricant free turnout



an uncharted territory for modern engineering...

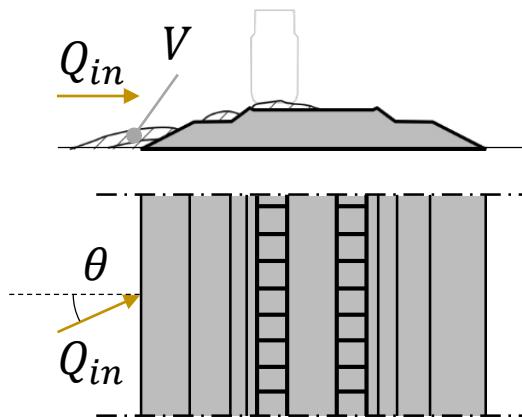


Windblown Sand Action: categorization

Environmental	Free	Variable		
<ul style="list-style-type: none">• site-dependent• inborn randomness	<ul style="list-style-type: none">• wind-dependent accumulation	<ul style="list-style-type: none">• long-term varying accumulation process	<ul style="list-style-type: none">• non monotonic (periodic sand removal)	
		 		
				
\sim wind	\sim windblown snow	\sim snow	\sim/\neq snow	
modelling fallout	probabilistic modelling	Wind and sand modelling	Time-variant reliability analysis	Evaluation of sand removal period

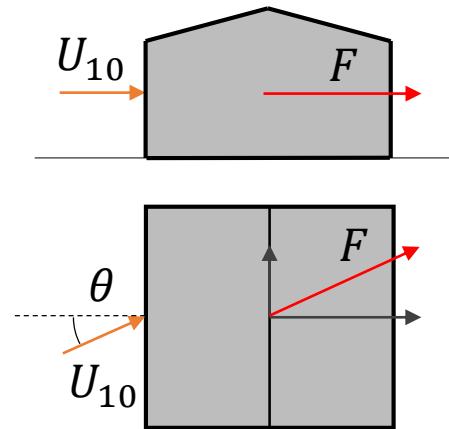
Windblown Sand Action: modelling chain

Windblown sand action



VS

Wind action



Site analysis

1 Incoming Windblown Sand

- $Q_{in}(U_{10}, d)$

2 Aerodynamics / Morphodynamics

- $C_s(\theta, \Gamma_0, V)$
aerodyn. morphodyn.

3 Windblown sand action

- $V \rightarrow F \rightarrow \dots$

Assessment

Incoming Wind

- U_{10}

Aerodynamics

- $C_f(\theta, \Gamma_0)$

Wind action

- F

Incoming Windblown Sand

$$Q_{in}(u_{*t}, \omega_s, u_*)$$

Uncertainty

“Lack of exact knowledge, regardless of what is the cause of this deficiency” Refsgaard et al. (2007)

Aleatory

- Sand uncertainties: grain size, shape, relative position, surface cleanliness, grain size distribution.
- Wind uncertainties: turbulent flow inborn variability, uncontrolled environmental conditions, e.g. temperature, humidity.

Epistemic

- Model uncertainty: simplified representation of the real physical behaviour, identification of relevant variables, hypothesis, interactions left out. Lack of a shared definition of u_{*t} Shao (2008)
- Measurement uncertainty: errors and/or different procedures.
- Parameter uncertainty: values of model parameters.

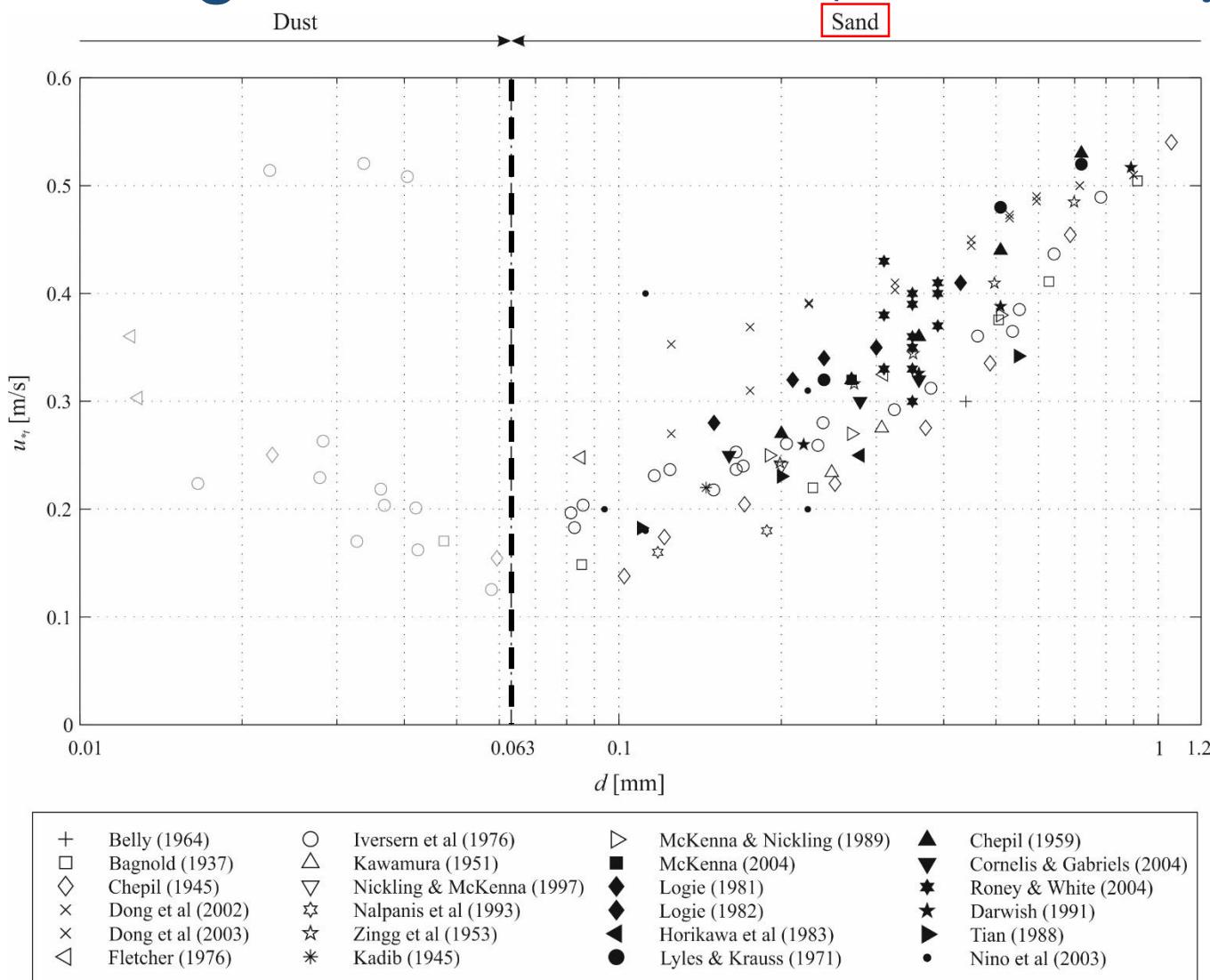


Statistical approach

- Nonlinear regression
- Copula-based regression



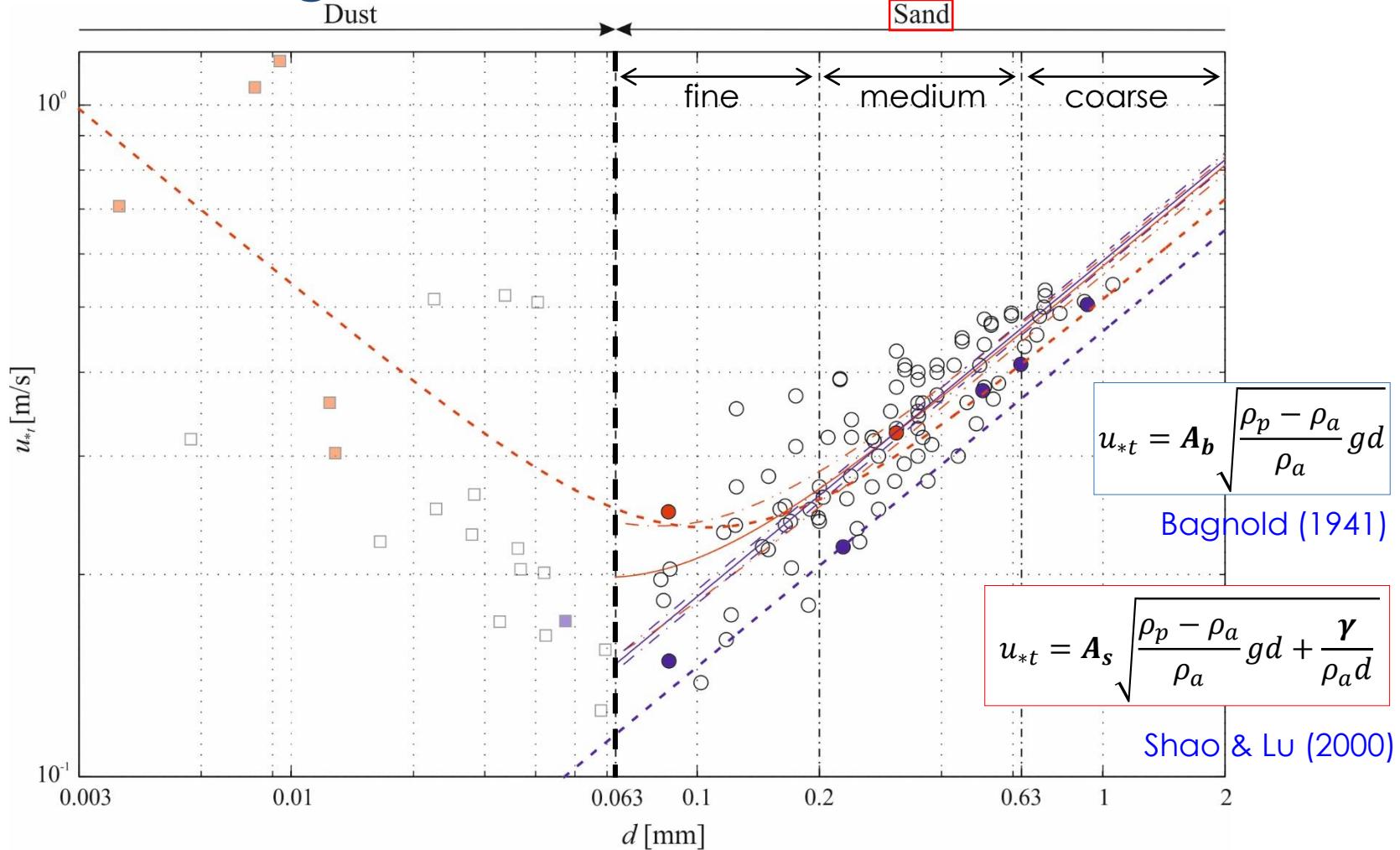
Incoming Windblown Sand: probabilistic u_{*t}



- Collected studies range from 1937 to 2004.
- # = 133 # = 109

from in [L. Raffaele, L. Bruno, F. Pellerey, L. Preziosi \(2016\), Aeolian Res.](#)

Incoming Windblown Sand: probabilistic u_{*t}



Shao & Lu:
 - - - Original law
  Original fitting data
 — Refitted law
 - - - Refitted CI

Bagnold:
 - - - Original law
■ ● Original fitting data
 — Refitted law
 - - - Refitted CI

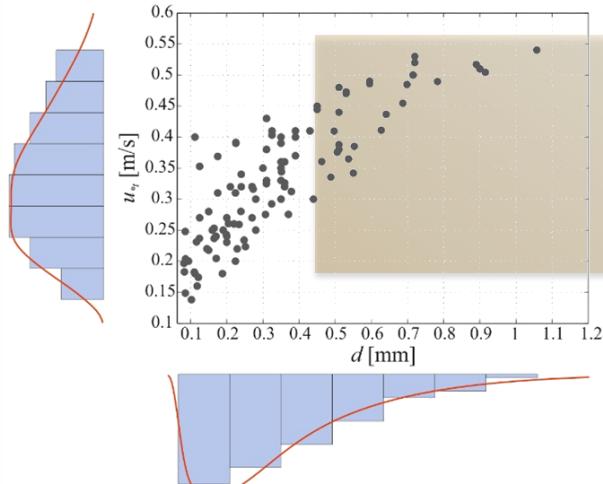
- Refitting sand experimental data
- Dust experimental data

$$R^2 \approx 0.75$$

Incoming Windblown Sand: probabilistic u_{*t}

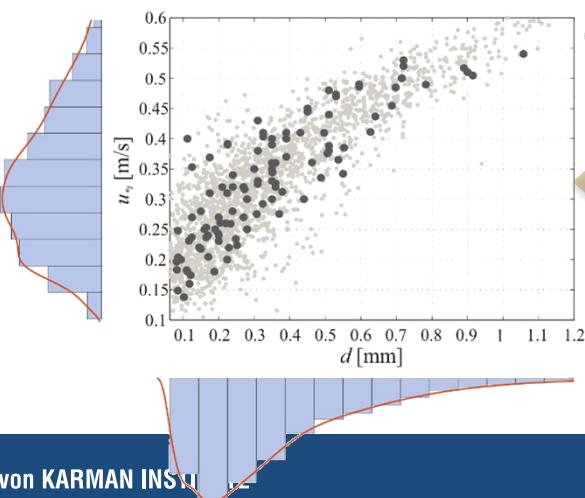
1 Fitting of marginal distributions

$$F(d), F(u_{*t}), \quad d, u_{*t} \in \mathbb{R}$$



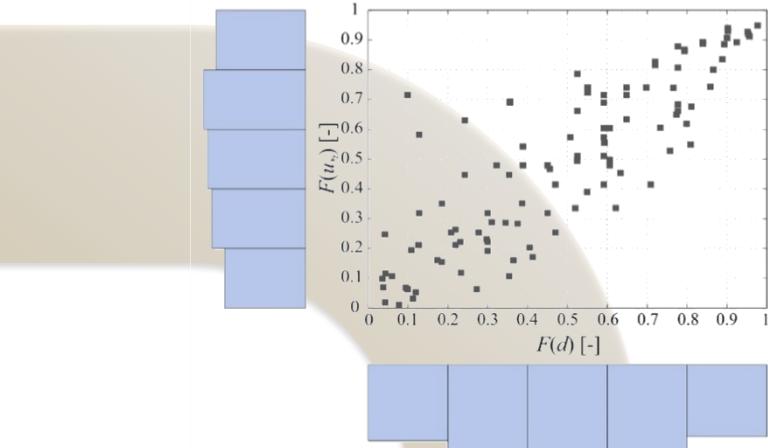
4 From copula to original scale

$$(d, u_{*t}) = (F^{-1}(u), F^{-1}(v))$$



2 From original to copula scale

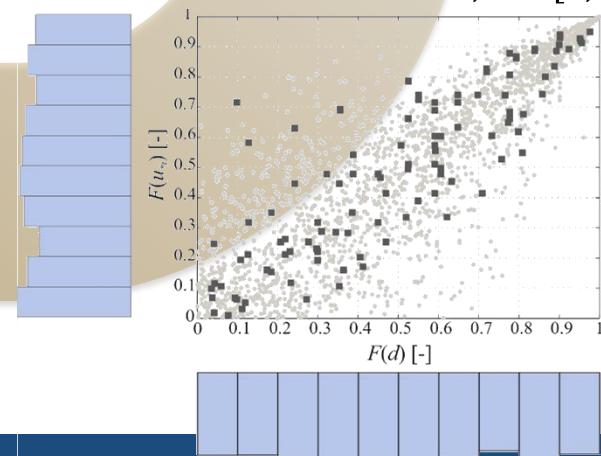
$$F(d, u_{*t}) = C\{F(d), F(u_{*t})\} \quad C: [0,1]^2 \rightarrow [0,1]$$



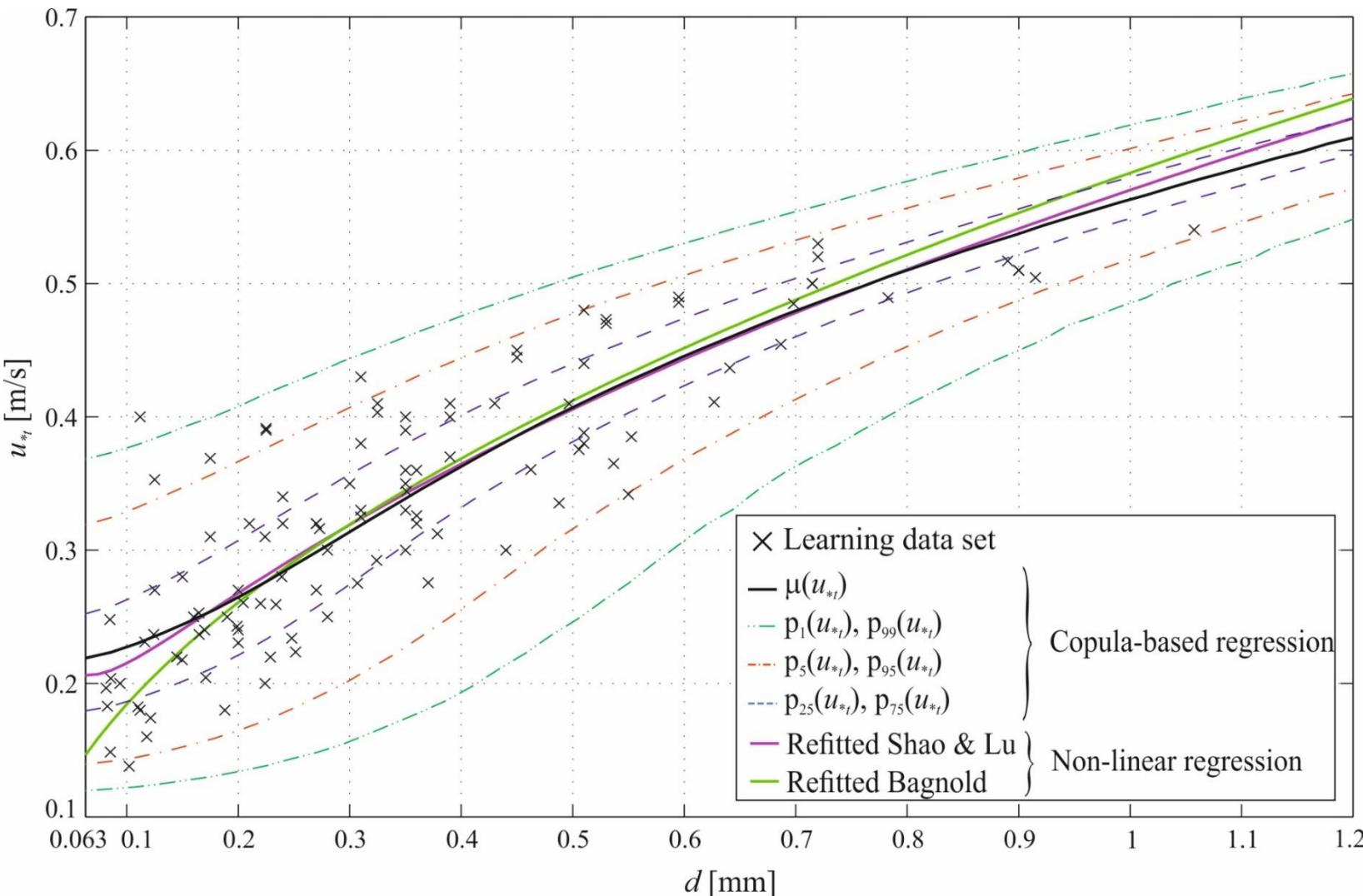
3 Fitting of Inverted Clayton Copula

$$C(u, v) = u + v - 1 + [(1-u)^{-1/\alpha} + (1-v)^{-1/\alpha} - 1]^{-\alpha}$$

$$u, v \in [0,1], \alpha > 0$$



Incoming Windblown Sand: probabilistic u_{*t}



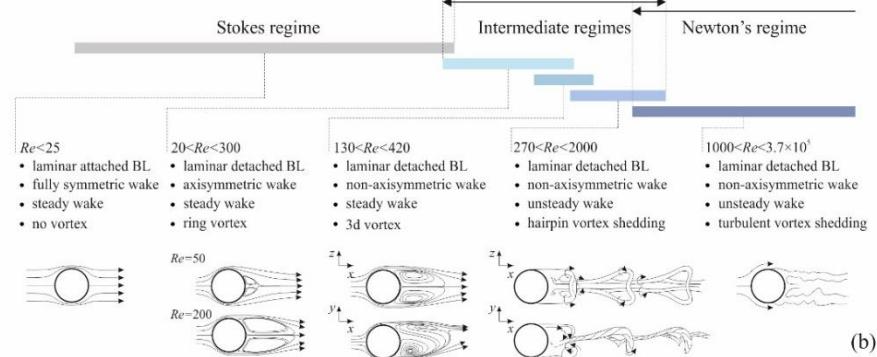
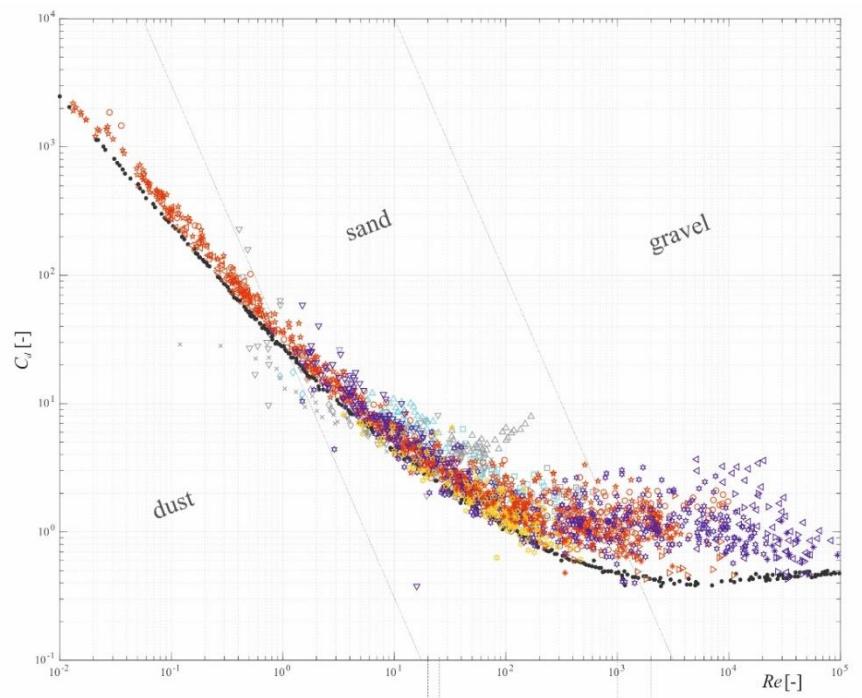
from in L. Raffaele, L. Bruno, F. Pellerey, L. Preziosi (2016), Aeolian Res.

Incoming Windblown Sand: probabilistic ω_s

$$Q_{in}(u_{*t}, \underline{\omega}_s, u_*)$$

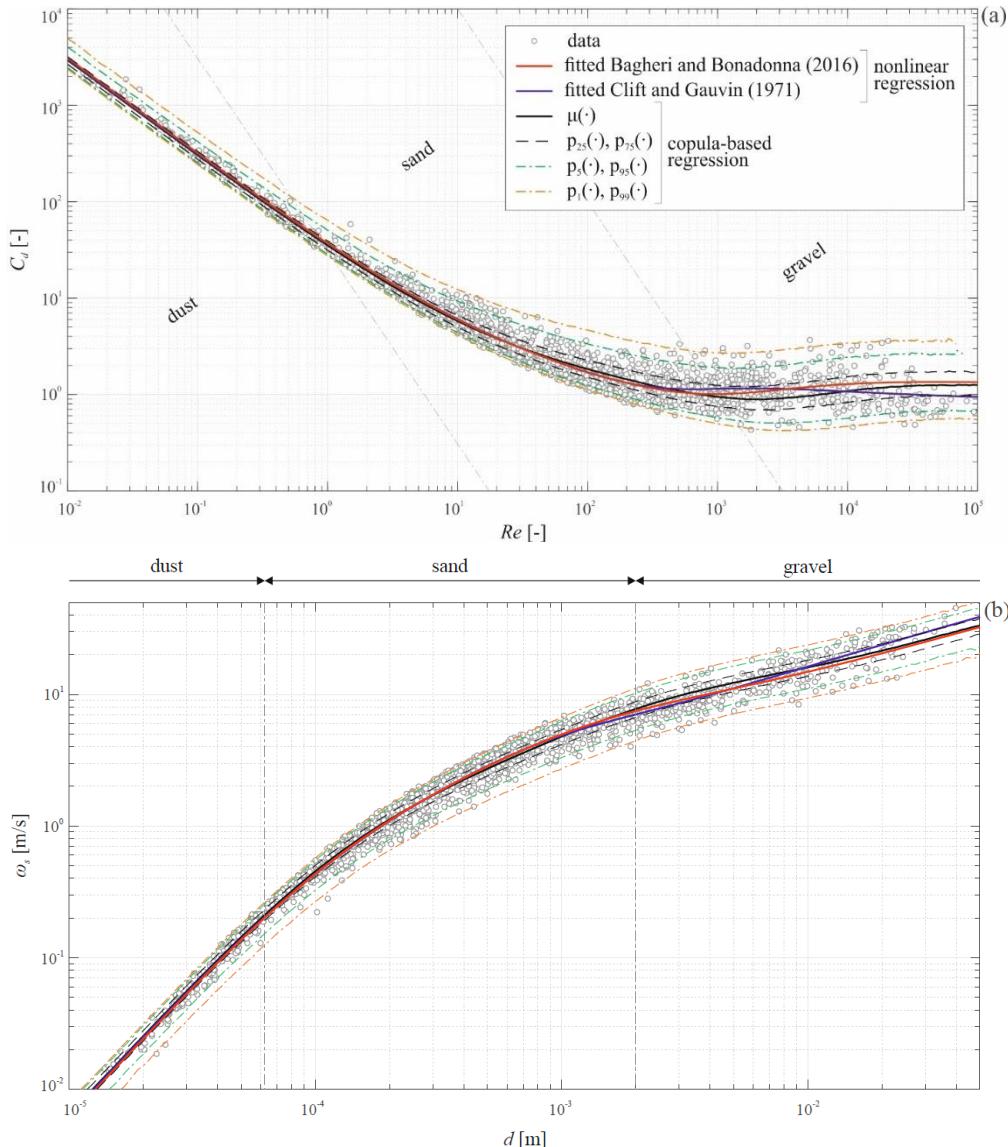
- Sedimentation velocity affects the mode of transport, distribution of particles above the ground, and transport rate
- Discrepancy among semi-empirical laws
- Sedimentation velocity bound to drag coefficient

● smooth spheres for reference (Brown and Lawler, 2003)

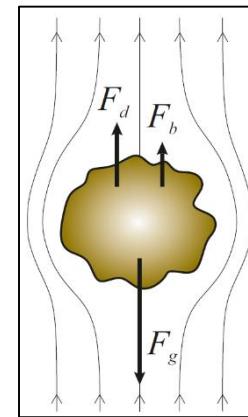


from L. Raffaele, L. Bruno, D. Sherman (2020), Aeolian Research

Incoming Windblown Sand: probabilistic ω_s



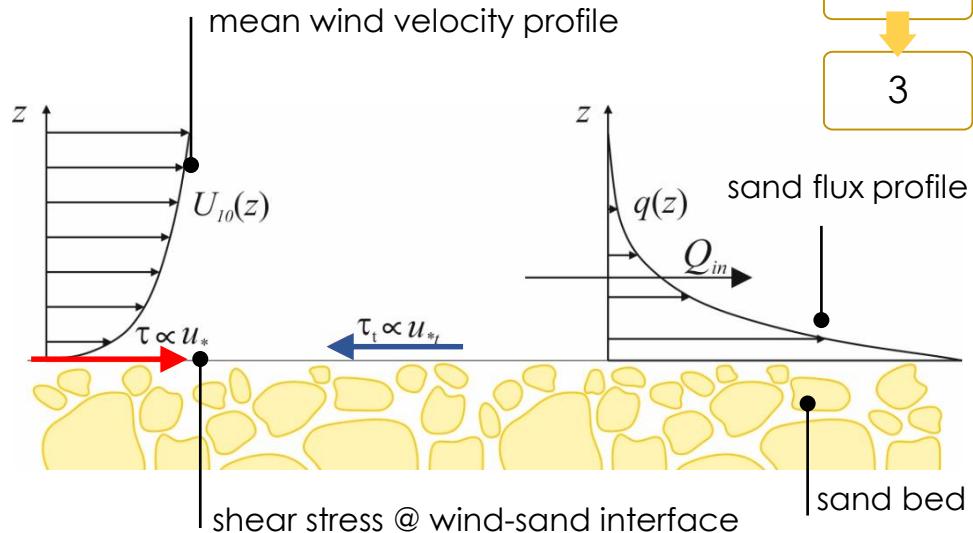
$$\left\{ \begin{array}{l} Re = \frac{\omega_s d}{\nu_f} \\ C_d = \frac{4 \rho_f (\rho_p - \rho_f)}{3 Re^2 \mu_f^2} g d^3 \end{array} \right.$$



$$\begin{aligned} F_d &= \frac{1}{2} \rho_f \omega_s^2 C_d \frac{\pi d^2}{4} \\ F_g &= \rho_p g \frac{\pi d^3}{6} \\ F_b &= \rho_f g \frac{\pi d^3}{6} \end{aligned}$$

$$\left\{ \begin{array}{l} d = \left[\frac{3}{4} \frac{C_d Re^2 \mu_f^2}{\rho_f (\rho_p - \rho_f) g} \right]^{1/3} \\ \omega_s = \frac{Re \nu_f}{d} \end{array} \right.$$

Incoming Windblown Sand



Wind shear velocity

$$u_* = u_*(U_{10}, z_0)$$

$$f(u_*) = \frac{k f(U_{10,ref})}{\ln z_{ref}/z_0}$$

Threshold shear velocity

$$u_{*t} \approx u_{*t}(d)$$

$f(u_{*t}|d)$ from Raffaele et al (2016)

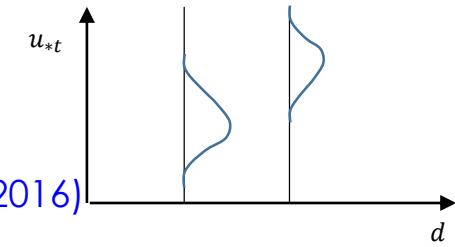
Incoming sand transport rate

$$Q_{in} = \int_0^{+\infty} q(z) dz$$

$$\approx Q_{in}(u_*, u_{*t})$$

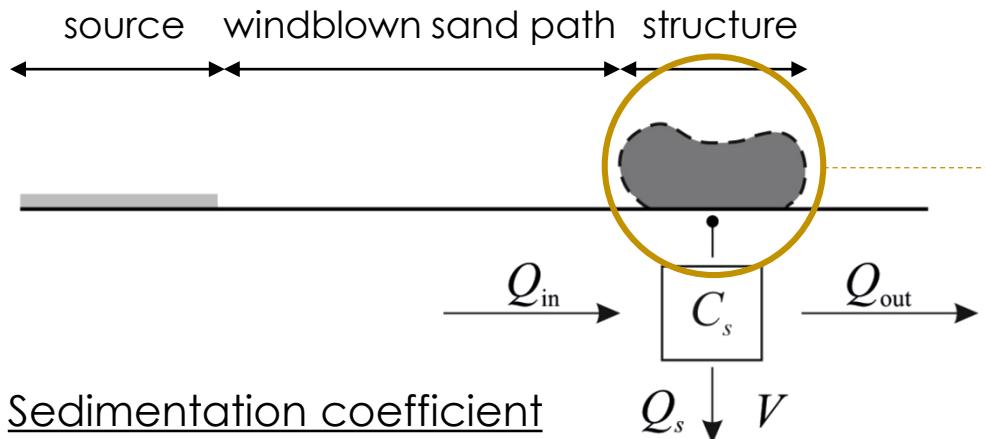
$$f(Q_{in}) = \begin{cases} A \sqrt{\frac{d}{d_r}} \frac{\rho_a}{g} f(u_*)^3 \left[1 - \frac{f(u_{*t}|d)}{f(u_*)} \right] & \text{if } u_* > u_{*t} \\ 0 & \text{if } u_* \leq u_{*t} \end{cases}$$

from Raffaele et al (2017a)



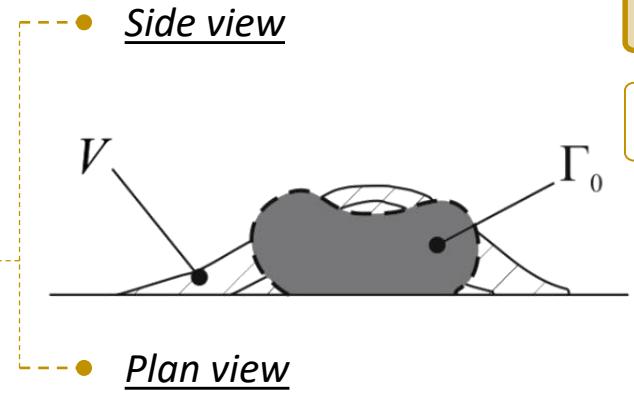
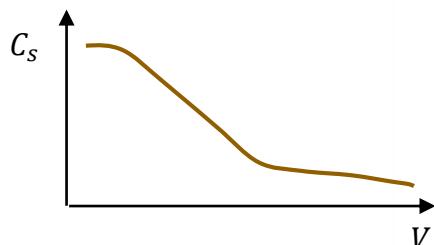
Aerodynamics/Morphodynamics

- 1
- 2
- 3

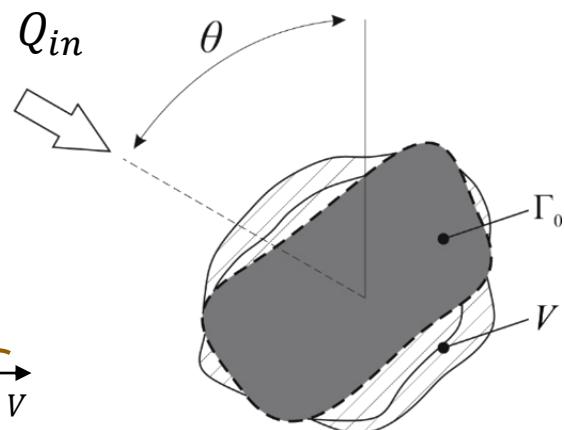


Sedimentation coefficient

- $C_s = Q_s/Q_{in} \in [0,1]$
- $C_s(\theta, \Gamma_0, V)$
- monotonic decreasing vs V
- No closed forms \rightarrow WT or CFD testing



Plan view



Sedimentation rate $f(Q_s) = C_s f(Q_{in})$

Outgoing transport rate $f(Q_{out}) = [1 - C_s] f(Q_{in})$

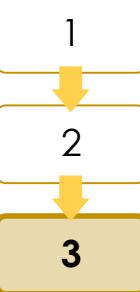
Windblown sand action

Time-variant Wbs action $V(t)$

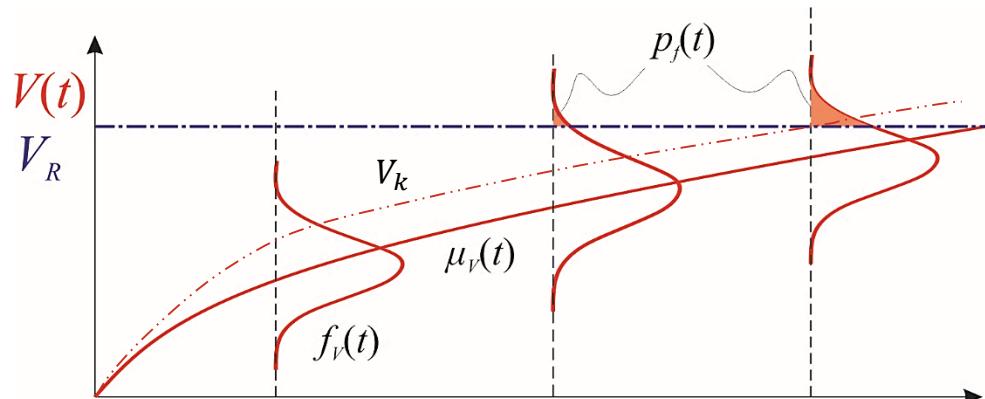
$$f_V(t) = \sum_{n=1}^{\infty} (g_1 * g_i * \dots * g_n) Q_s P[N_\theta = n]$$

Resistant sand volume V_R

- Structure/Infrastructure ← SLS
- SMM ← efficiency (C_s)

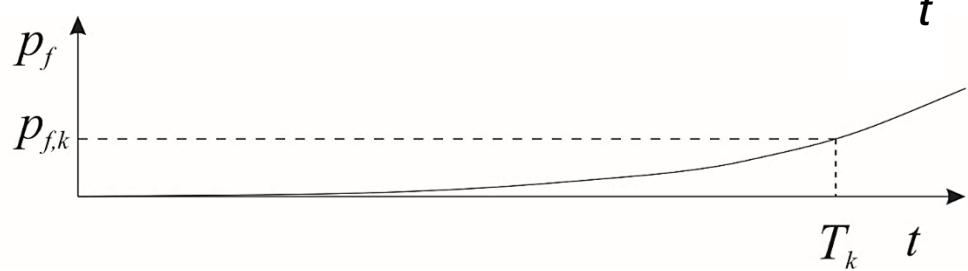


Time variant reliability analysis $V(t) < V_R$



Probability of failure

$$\begin{aligned} p_f(t) &= P[V(t) \geq V_R] \\ &= \int_0^{+\infty} F_{V_R}(x) f_V(x, t) dx = 1 - F_V(V_R, t) \end{aligned}$$



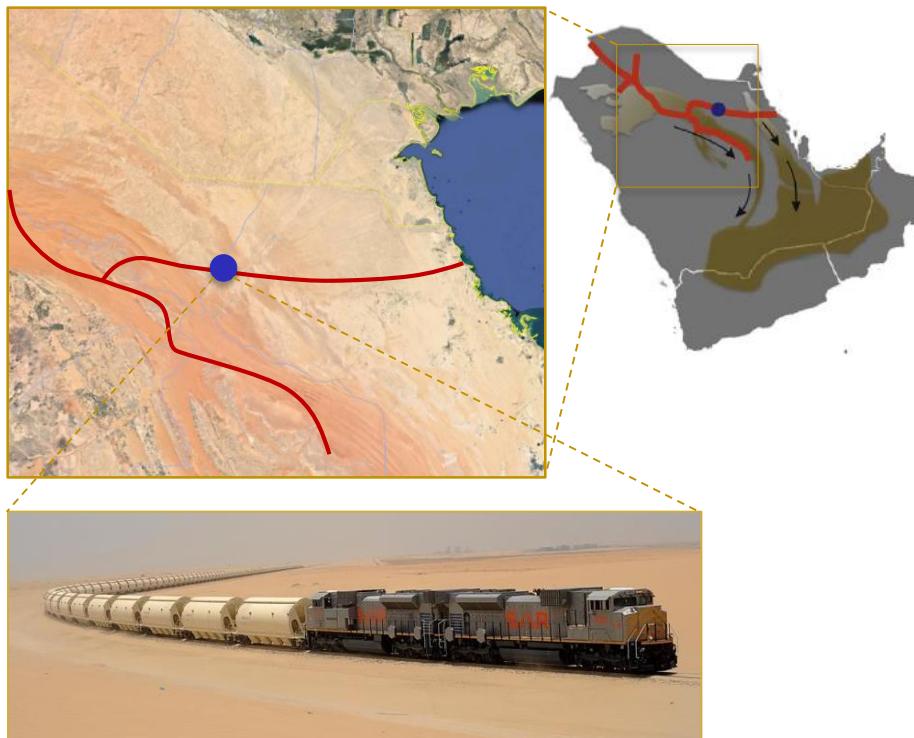
Characteristic time of failure

$$T_k = p_f^{-1}(p_{f,k}) \quad \text{e.g. } p_{f,k} = 5\%$$

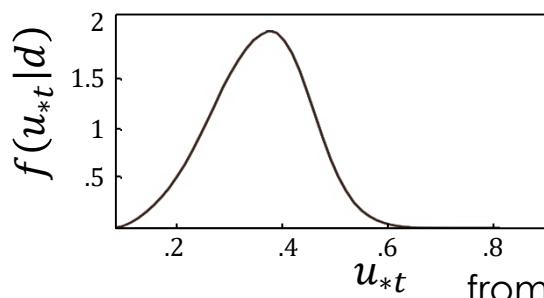


sand removal period $\leq T_k$

Site characteristics



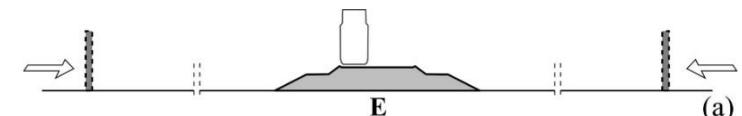
u_{*t} statistics ($d = 0.35 \text{ mm}$)



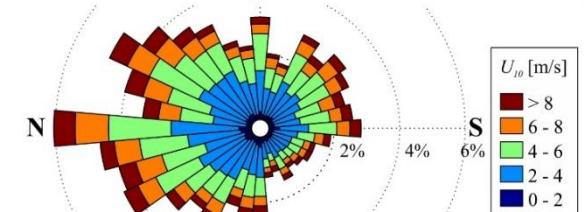
from Raffaele et al (2017b)

Wind statistics

$$z_0 = 4e - 3 \text{ m}$$



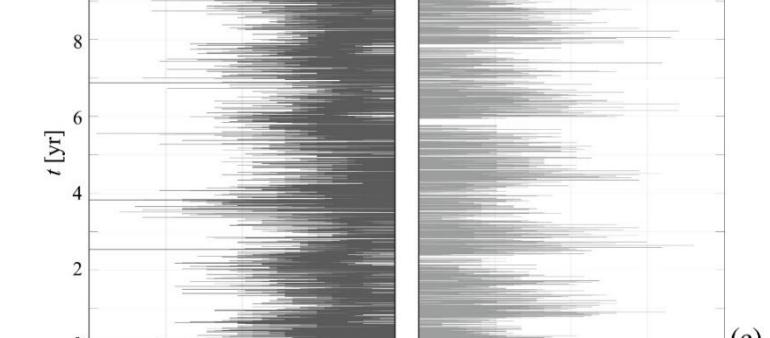
(a)



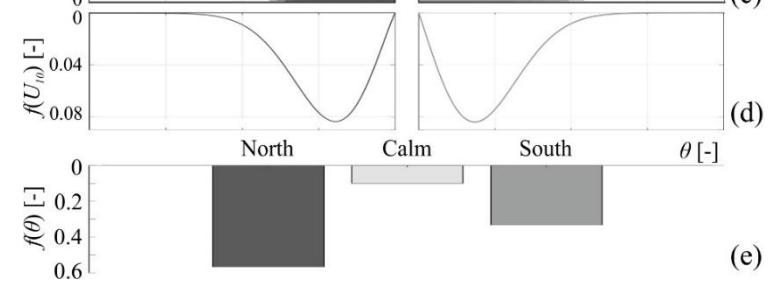
(b)



(c)

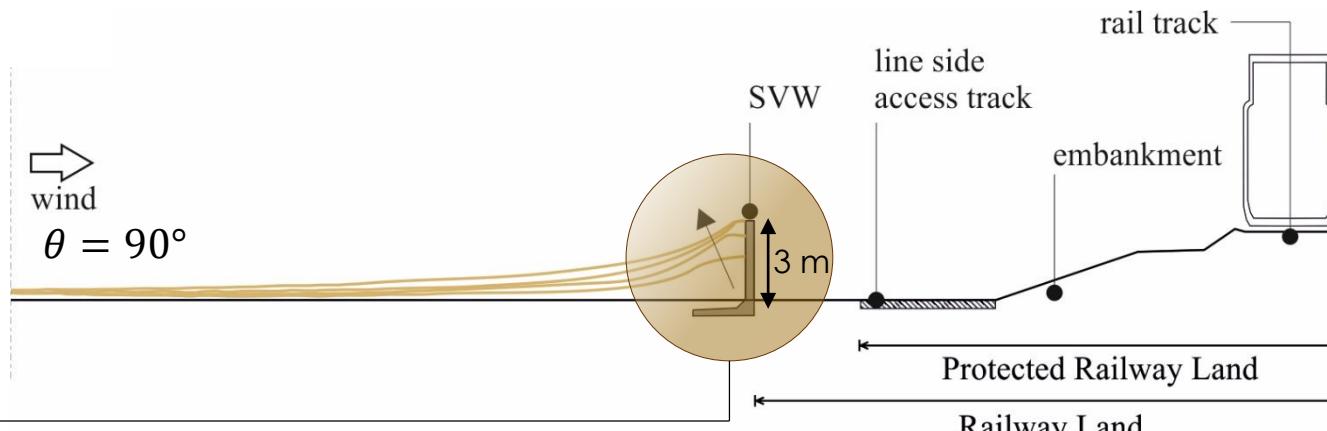


(d)



(e)

Sedimentation coefficient: SVW



- Straight Vertical Wall (SVW) from multiphase CFD simulation

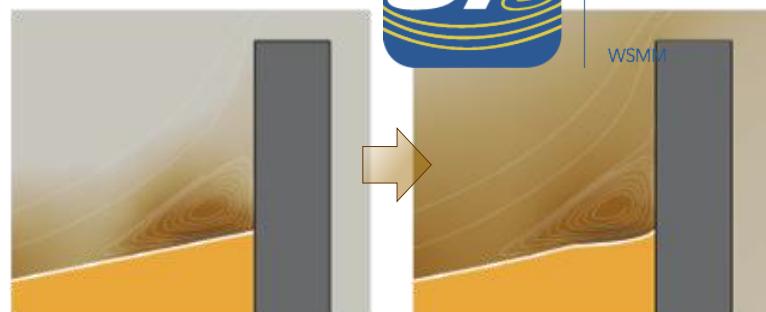
Eulerian 1st order multiphase model for windblown sand

Wind flow: RANS k- ω

$$\begin{cases} \nabla \cdot \bar{\mathbf{u}}_f = 0, \\ \frac{\partial \bar{\mathbf{u}}_f}{\partial t} + \bar{\mathbf{u}}_f \cdot \nabla \bar{\mathbf{u}}_f = -\frac{1}{\hat{\rho}_f} \nabla \bar{p} + \nabla \cdot [(v_f + v_t) \nabla \bar{\mathbf{u}}_f], \\ \frac{\partial k}{\partial t} + \nabla \cdot (k \bar{\mathbf{u}}_f) = \nabla \cdot [(\sigma_k v_f + v) \nabla k] + \tilde{P}_k - \beta^* k \omega, \\ \frac{\partial \omega}{\partial t} + \nabla \cdot (\omega \bar{\mathbf{u}}_f) = \nabla \cdot [(\sigma_\omega v_f + v) \nabla \omega] + \alpha \frac{\omega}{k} P_k - \beta \omega^2 + (1 - F_1) \frac{2\sigma_\omega}{\omega} \nabla k \cdot \nabla \omega, \end{cases}$$

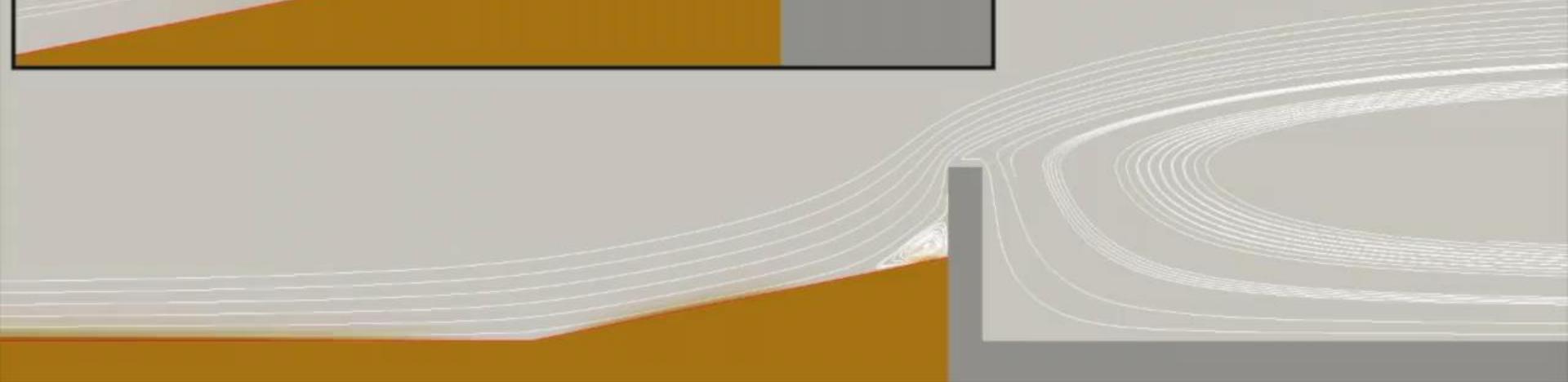
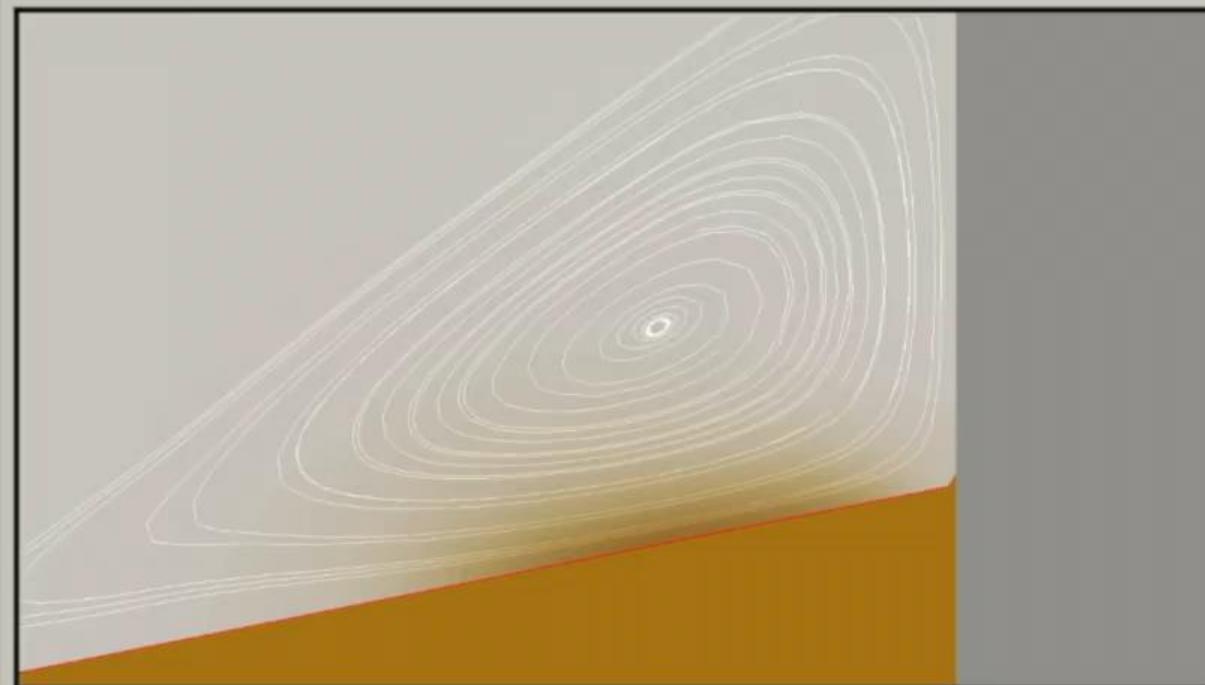
Sand phase: sand mass conservation equation

$$\begin{cases} \frac{\partial \phi_s}{\partial t} + \nabla \cdot \mathbf{q} = 0 \\ \mathbf{q} = \mathbf{u}_{tr} \phi_s + \mathbf{w}_s \phi_s - v_{eff} \phi_s^{k-1} \nabla \phi_s \end{cases}$$



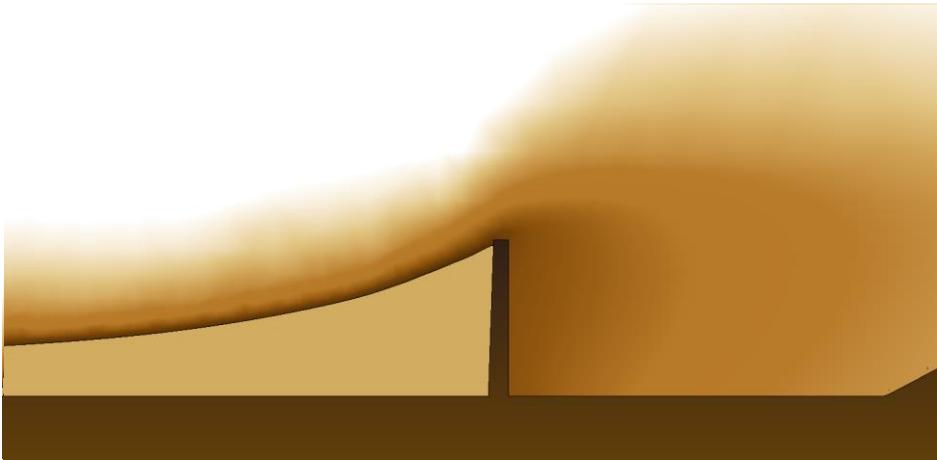
from A. Lo Giudice, L. Preziosi (2020), App. Math. Modelling

Sedimentation coefficient: SVW

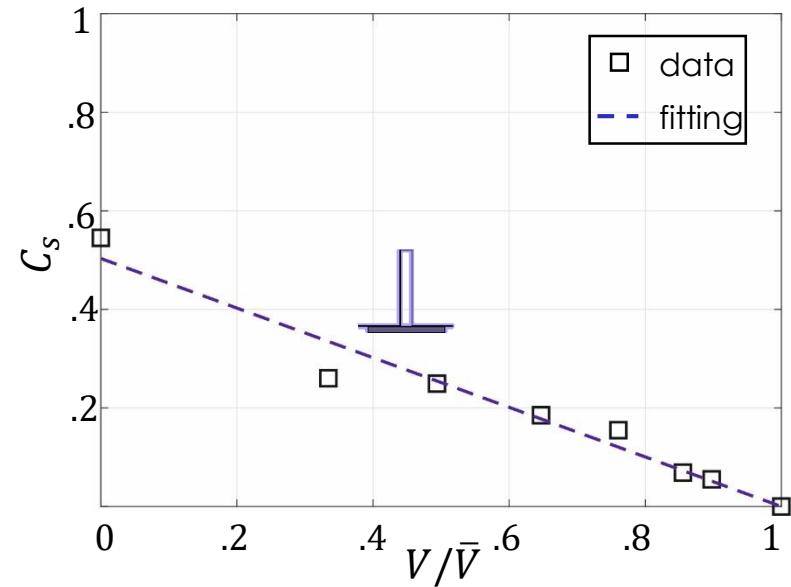
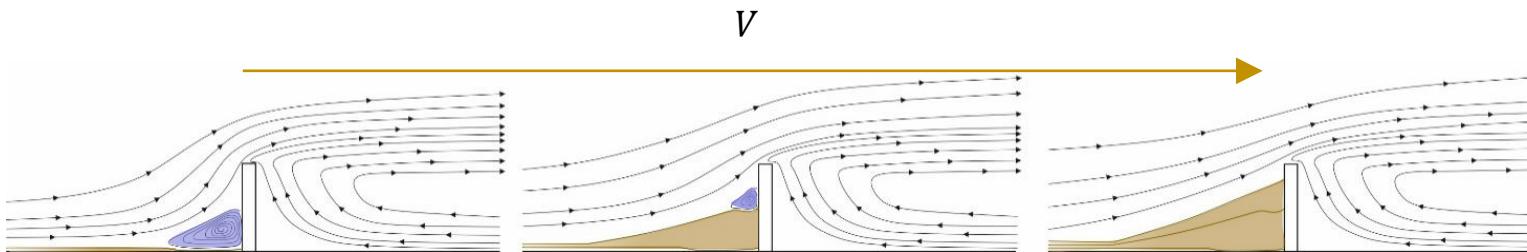


Sedimentation coefficient: SVW

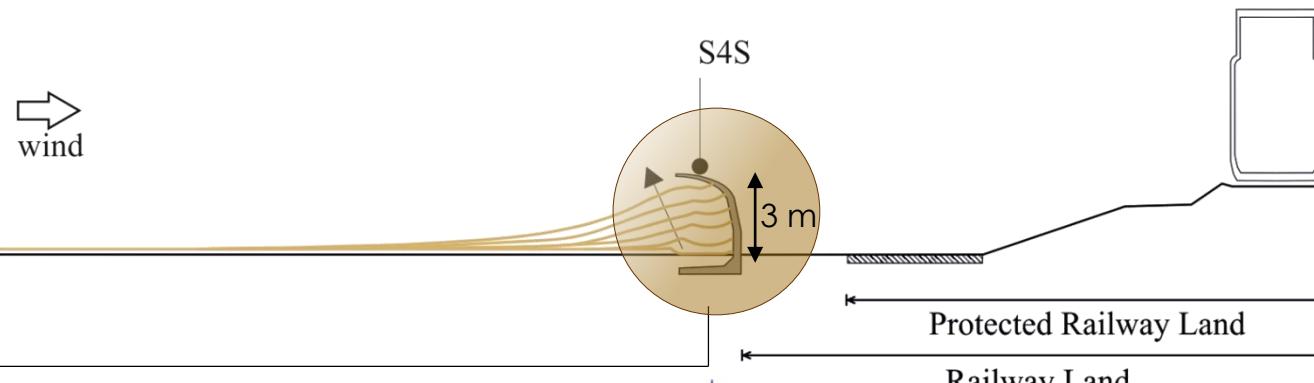
- Multiphase simulation



- Standard CFD simulation



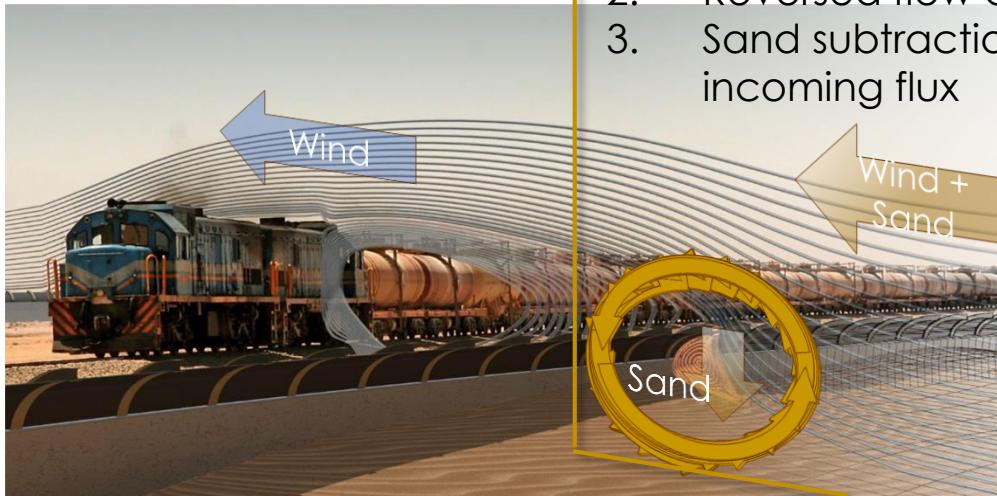
Sedimentation coefficient: S4S



- Shield for Sand (S4S) from WT tests @

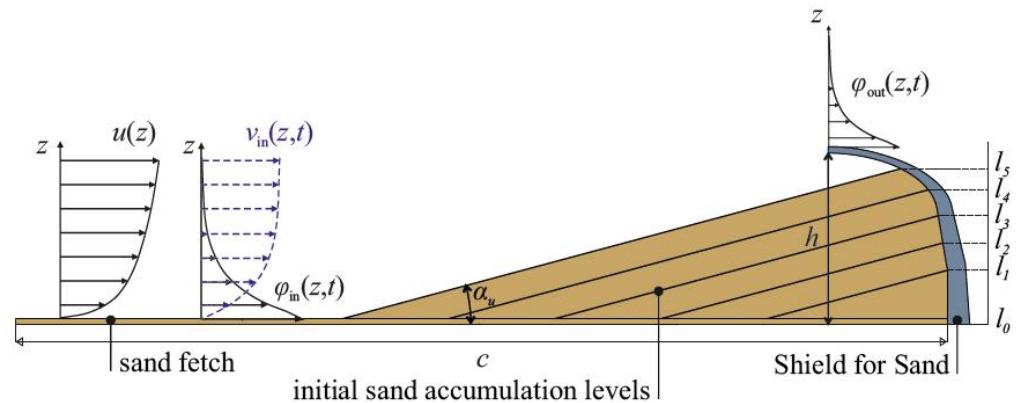
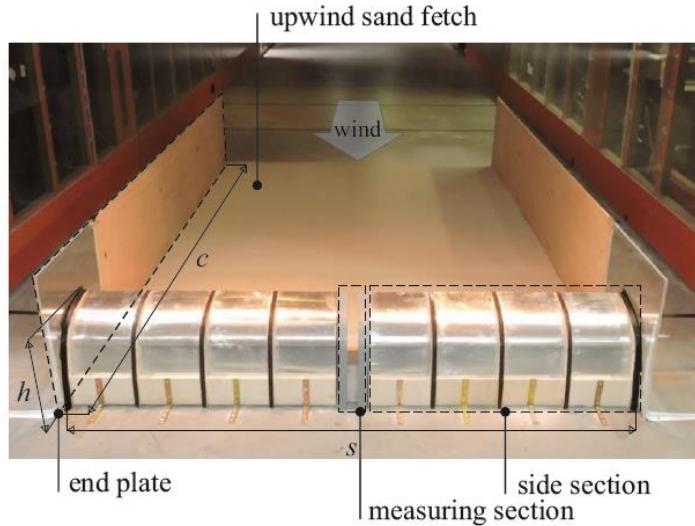


1. Trapping vortex
2. Reversed flow close to the ground
3. Sand subtraction from the incoming flux

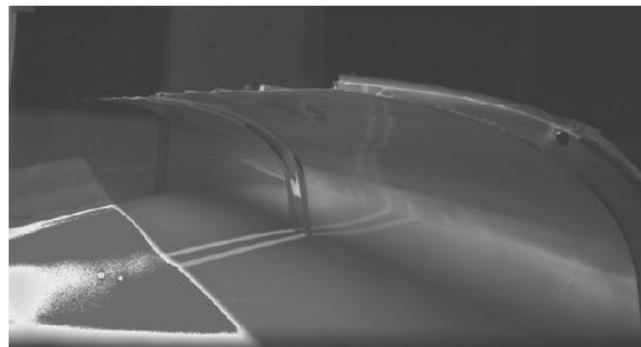
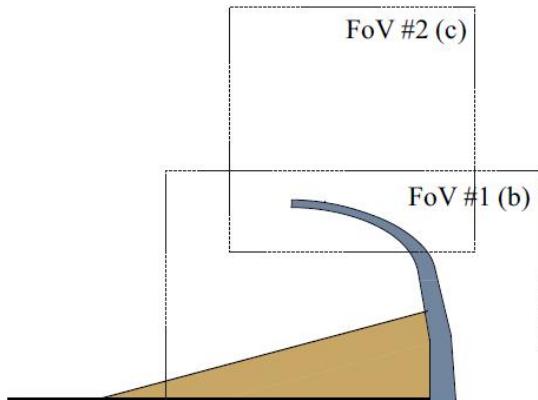


Sedimentation coefficient: S4S

- Wind tunnel setup in L-1B

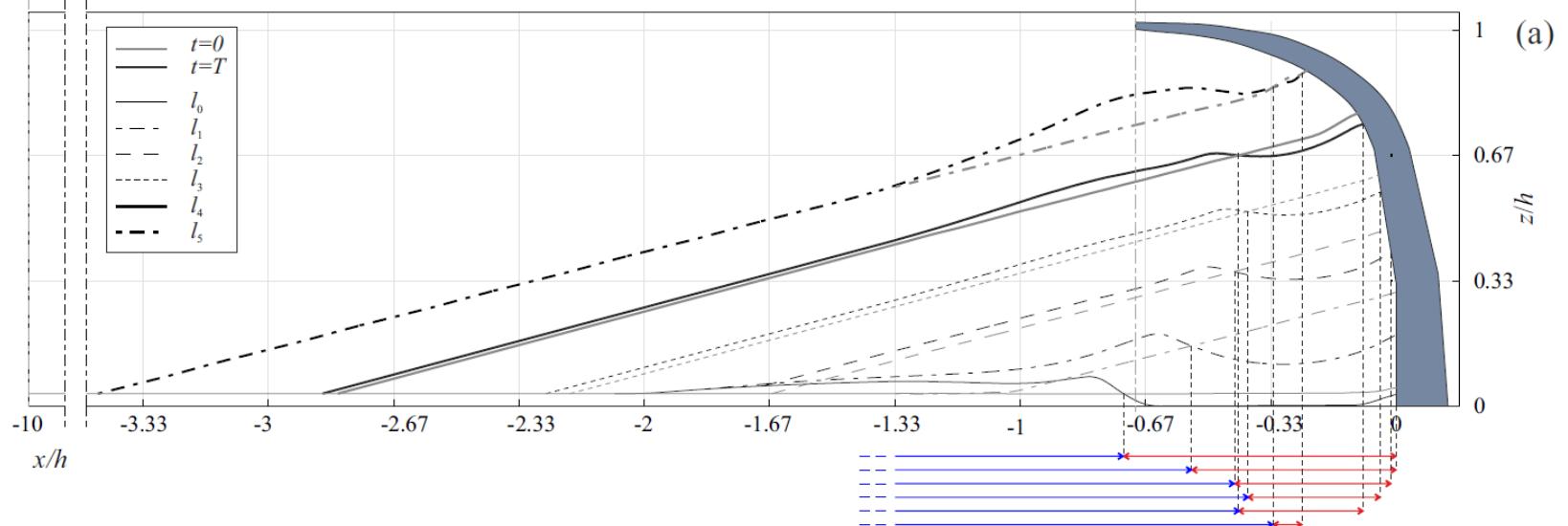
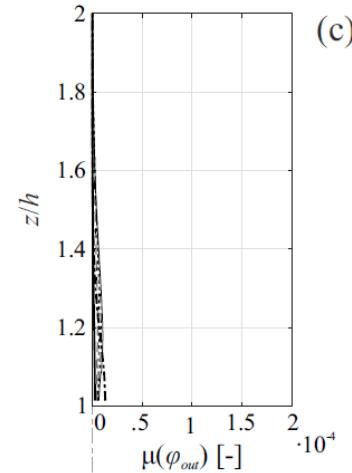
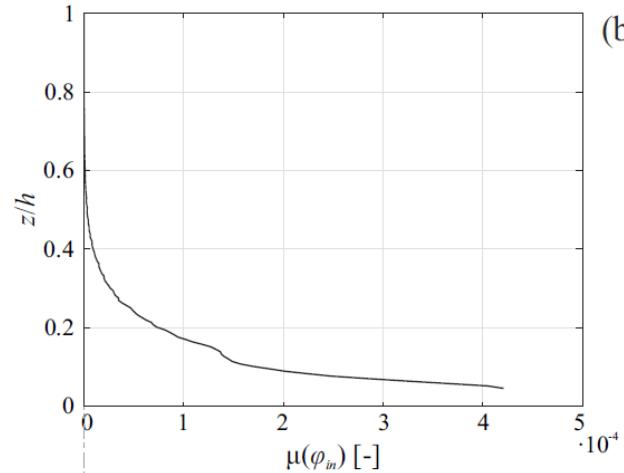


- PIV-PTV measurement setup



Sedimentation coefficient: S4S

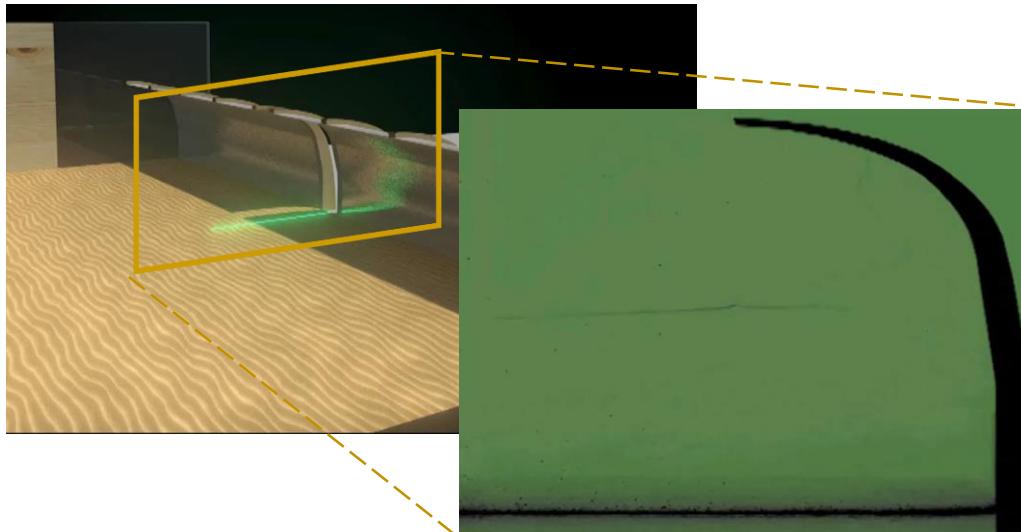
- Sand concentration and morphodynamics



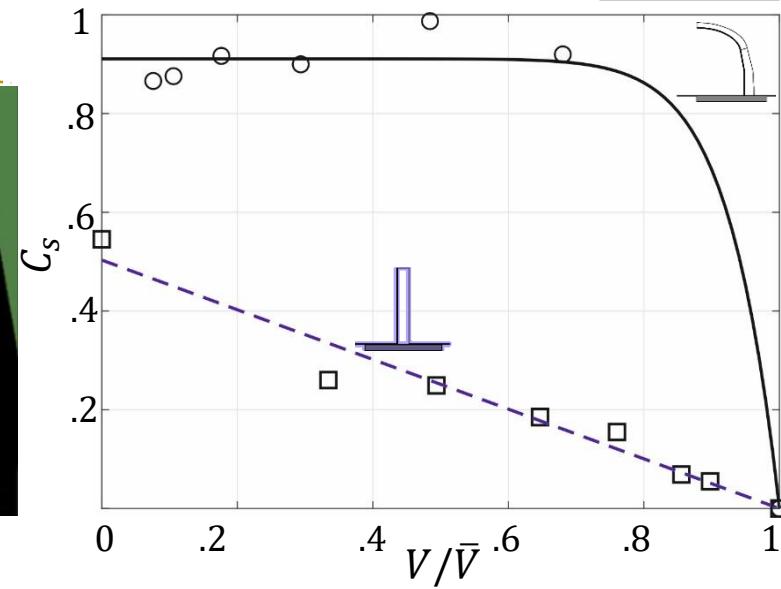
from Raffaele et al (under review)

Sedimentation coefficient: S4S

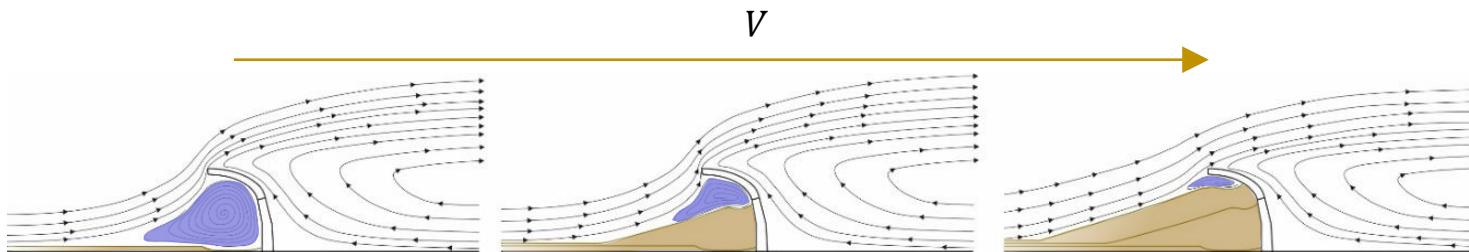
- Wind Tunnel test



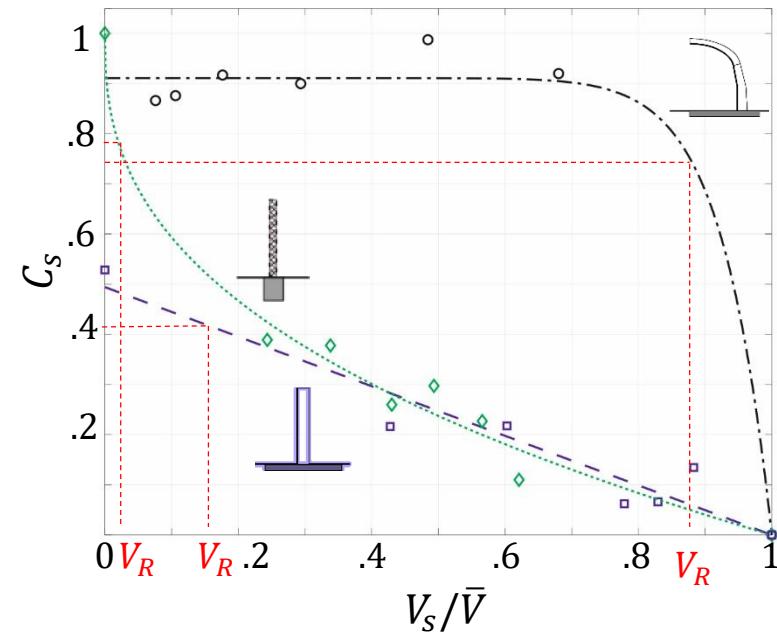
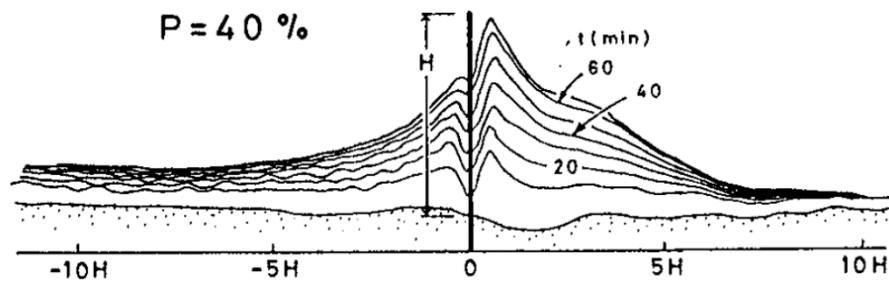
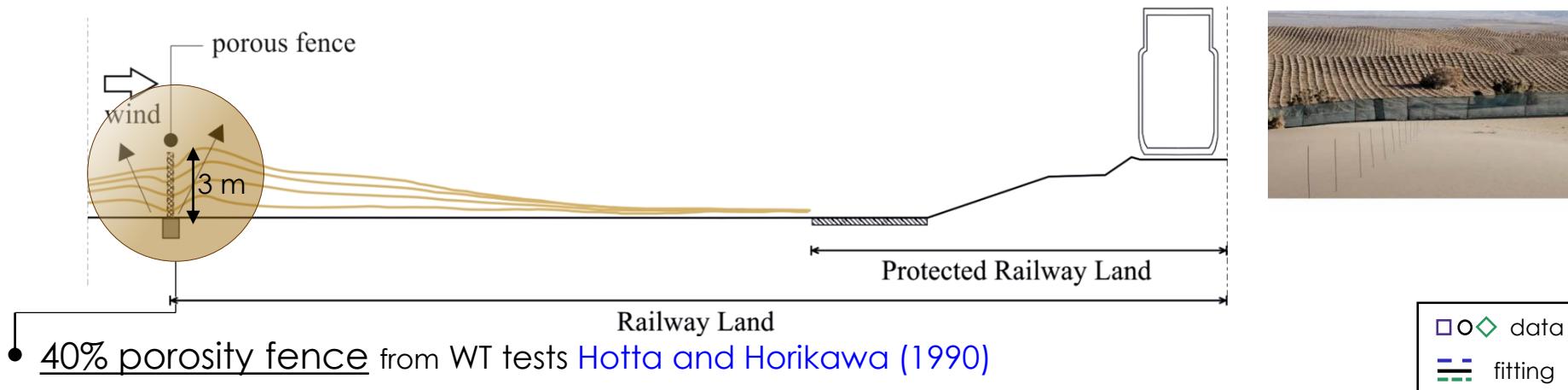
□○ data
— fitting



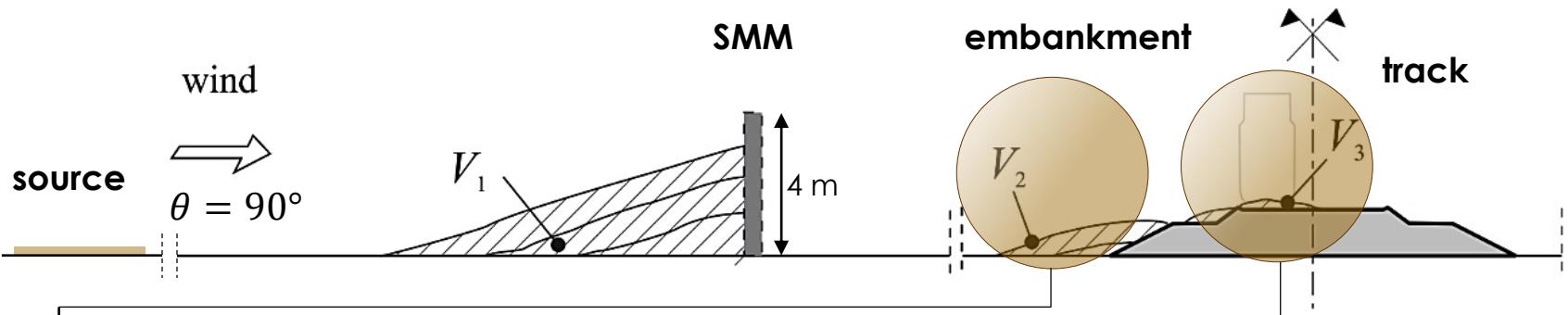
- Standard CFD simulation



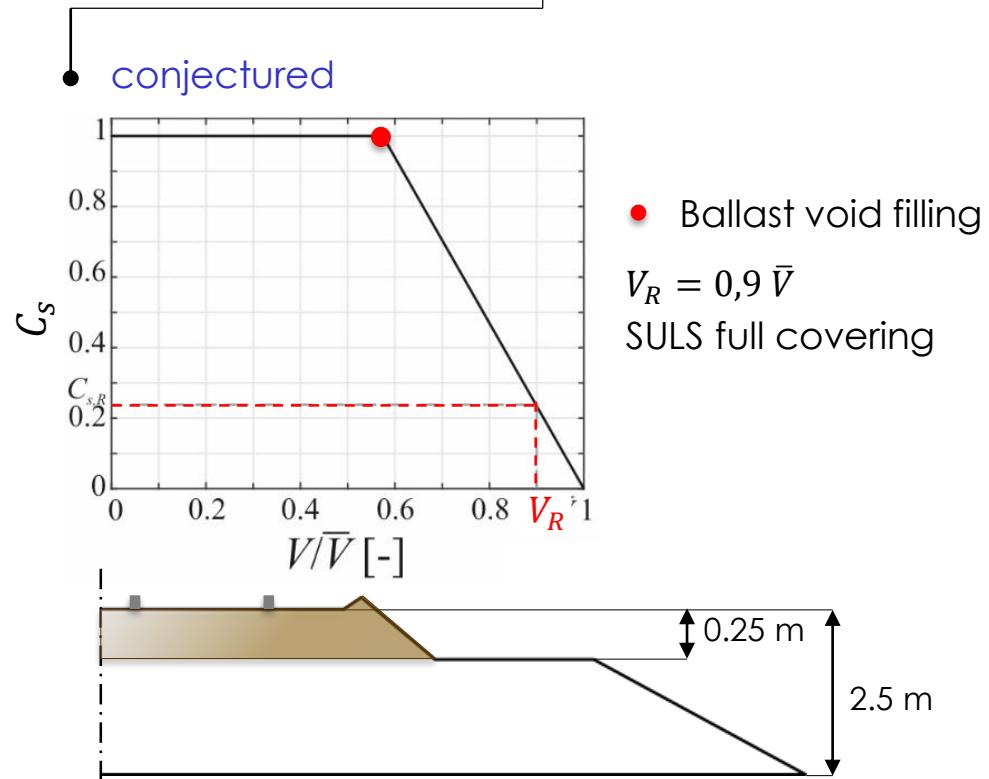
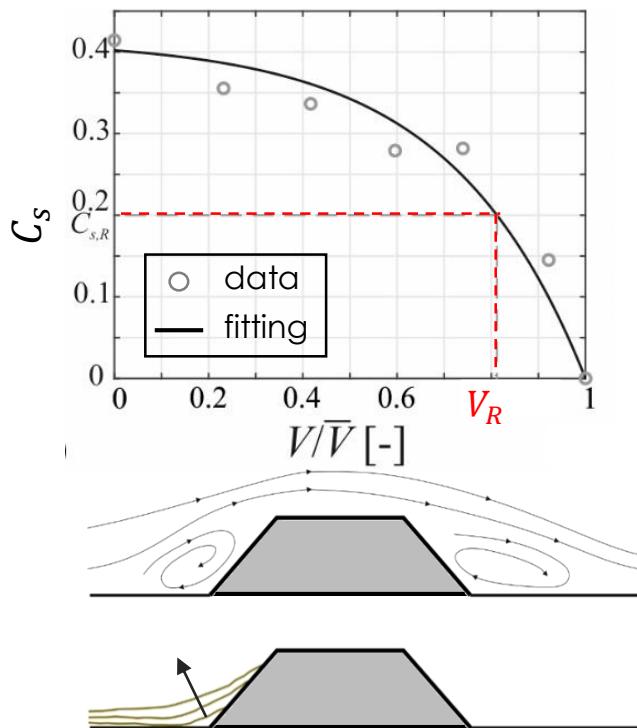
Sedimentation coefficient: porous fence



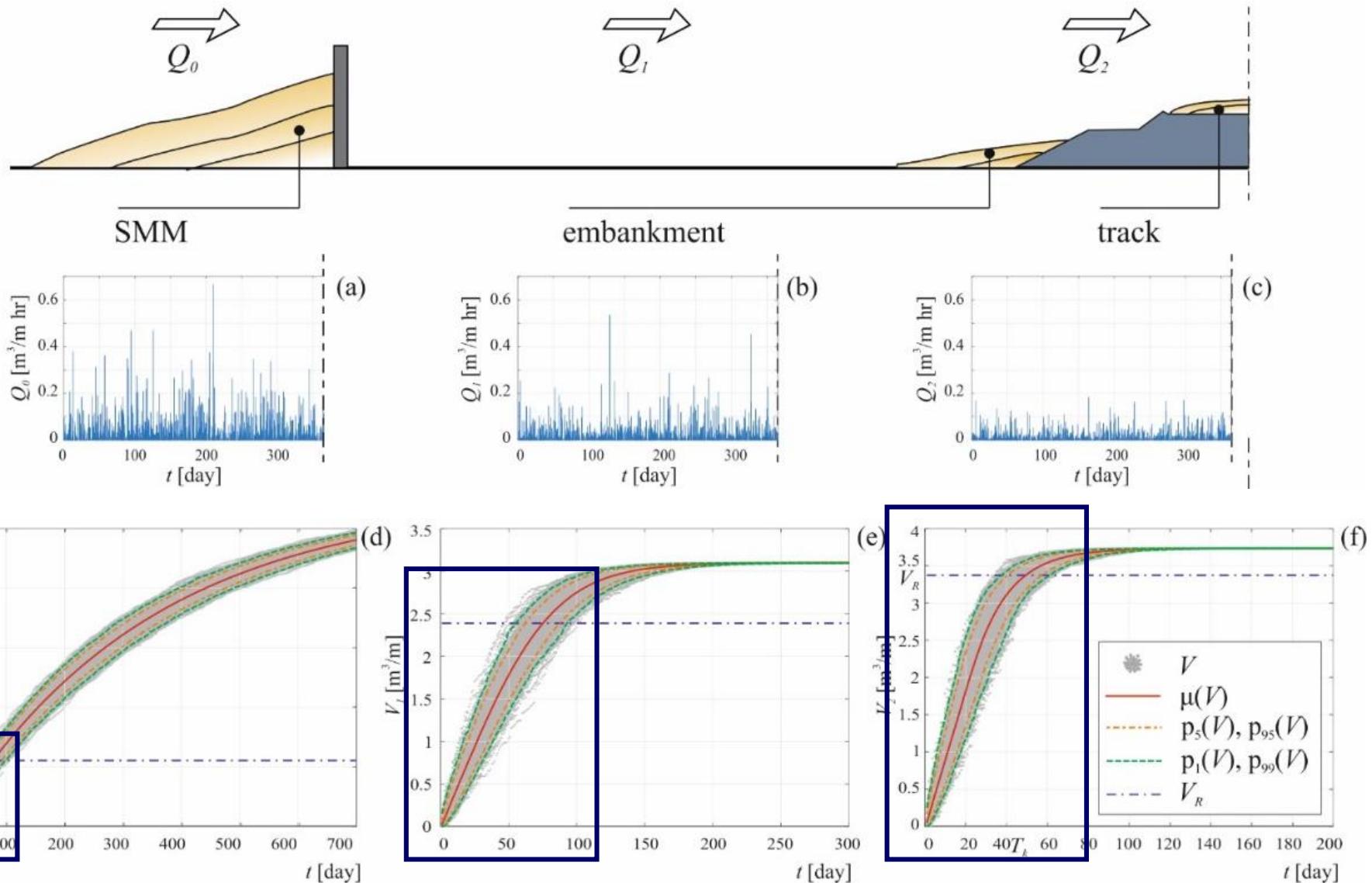
Sedimentation coefficient: embankment & track



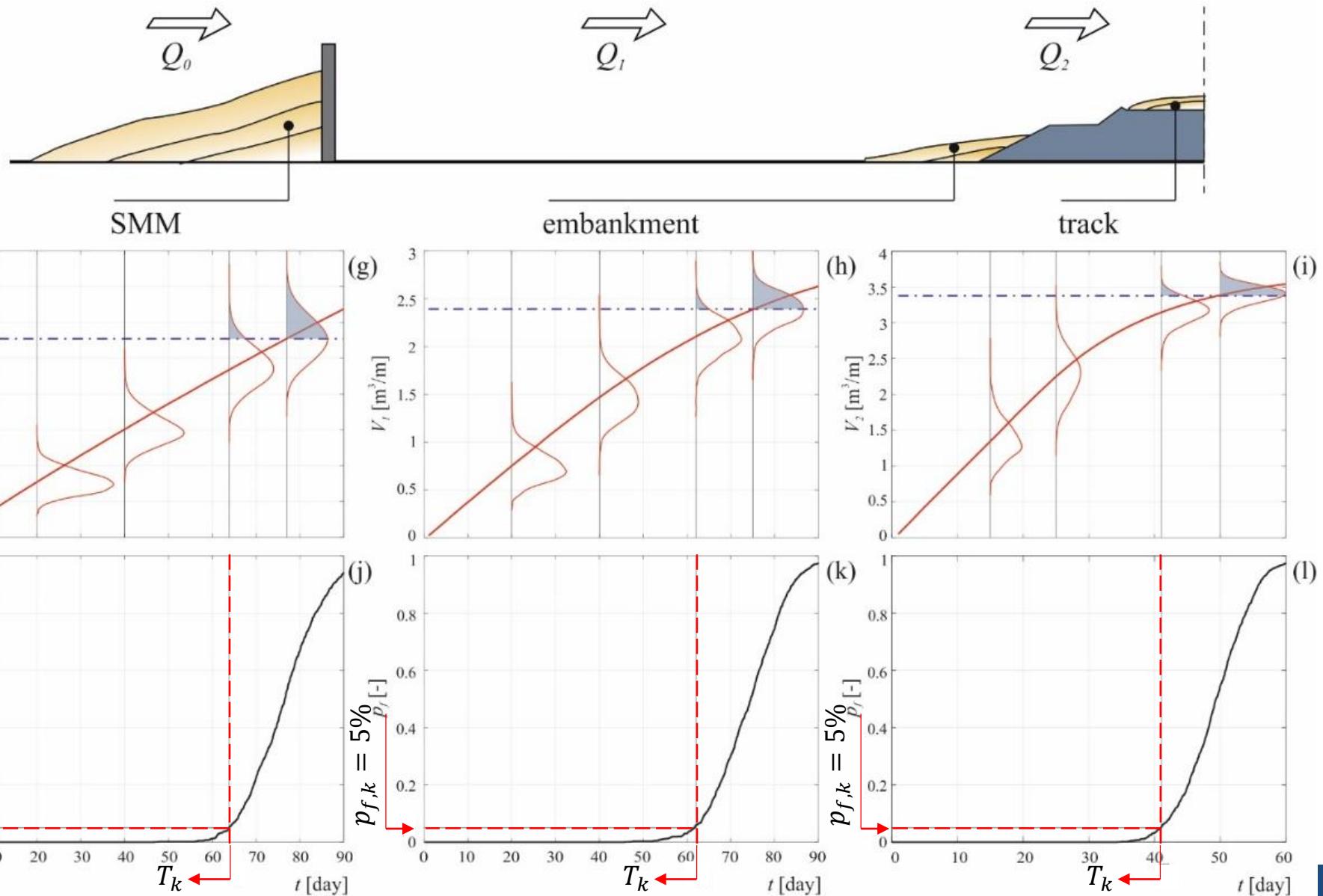
From WT tests Hotta & Horikawa (1990)



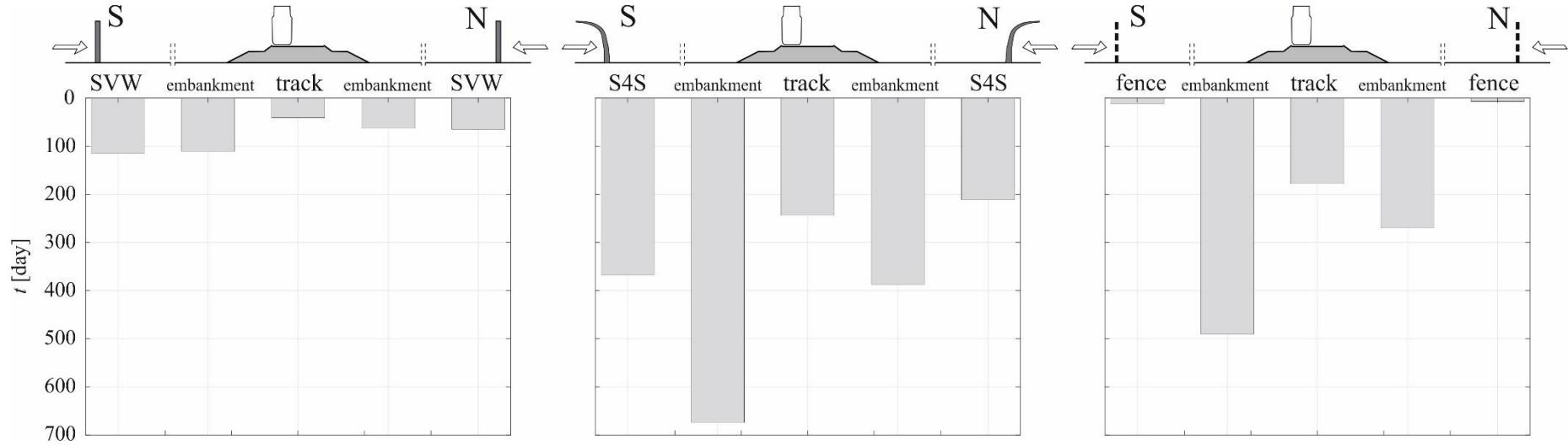
Results: SVW configuration, North side



Results: SVW configuration, North side



Lesson learnt: design perspective



- **S4S** scores overall good performance, while **SVW** shows the poorest performance.

$$\frac{T_{k,track}(S4S)}{T_{k,track}(SVW)} \sim 6 \quad \frac{T_{k,emb}(S4S)}{T_{k,emb}(SVW)} \sim 6 \quad \frac{T_{k,SMM}(S4S)}{T_{k,SMM}(SVW)} \sim 3$$

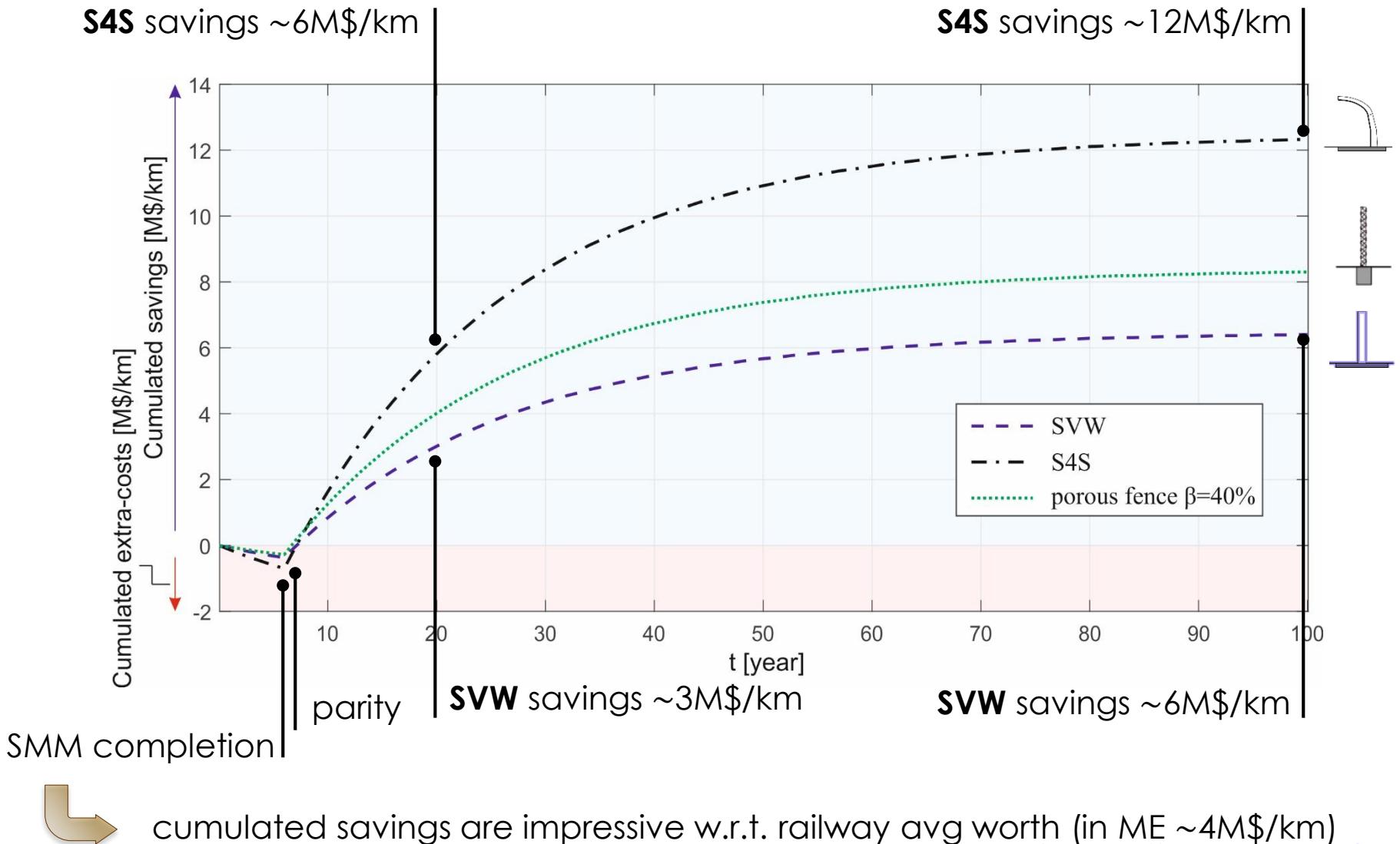
- The higher the wind occurrence (i.e. North side):
 - the lower T_k , for a given SMM capacity
 - the higher the required capacity, for a given T_k



T_k as a design requirement for SMM

from Raffaele & Bruno (2020)

Life Cycle Cost Analysis



Conclusion & Perspectives

To conclude..

The proposed modelling framework allows to:

- Move from trial-and-error to rationale design
- Assess the performances of SMMs
- Plan sand removal maintenance operations
- Assess the economic impact of SMMs

Some perspectives...

- Development of innovative Wind-Sand tunnel tests to assess the sedimentation coefficient of different SMM
- Extrapolation from scale to full-scale conditions under different environmental setups

Conclusion & Perspectives



Hybrid Performance assessment of
Sand Mitigation Measures



EU Horizon 2020 Marie Curie Individual Fellowship



von KARMAN INSTITUTE
FOR FLUID DYNAMICS



OPTIFLOW

WSMM

HyPer SMM received funding from the European Union's Horizon 2020 research and innovation programme under the Marie Skłodowska-Curie grant agreement No 885985