

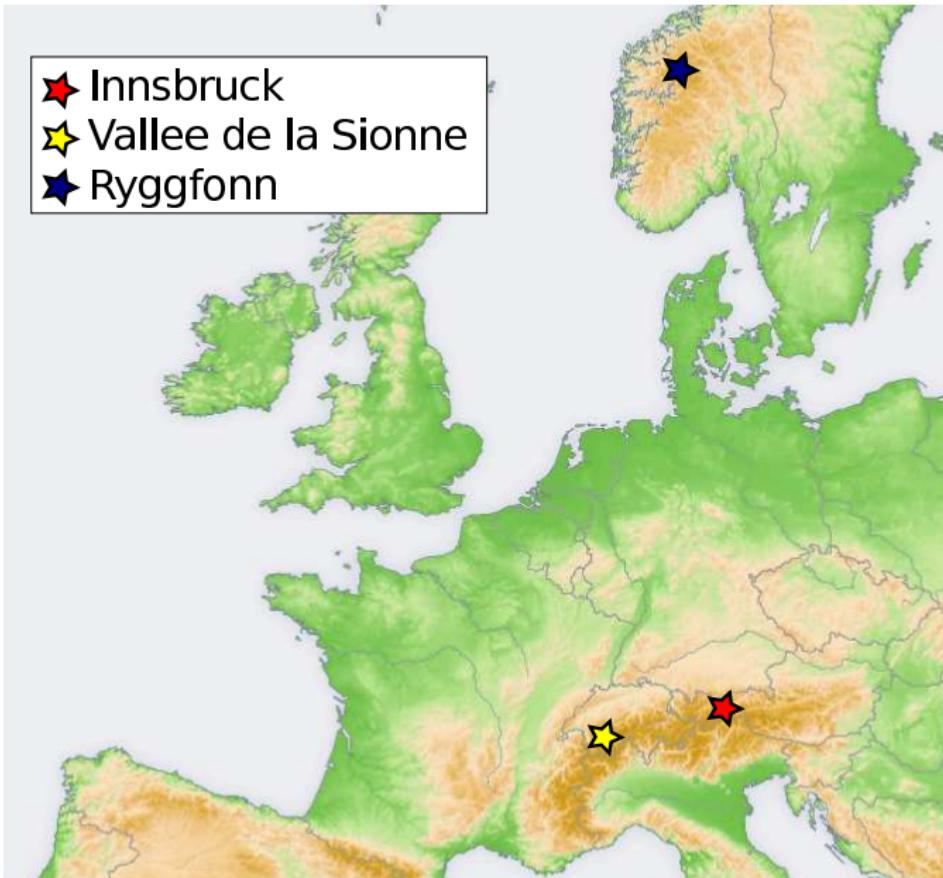
connecting computational and experimental snow avalanche dynamics

Jan-Thomas Fischer*,
Fromm, R.* , Gauer, P., Sovilla, B., Fellin, W.

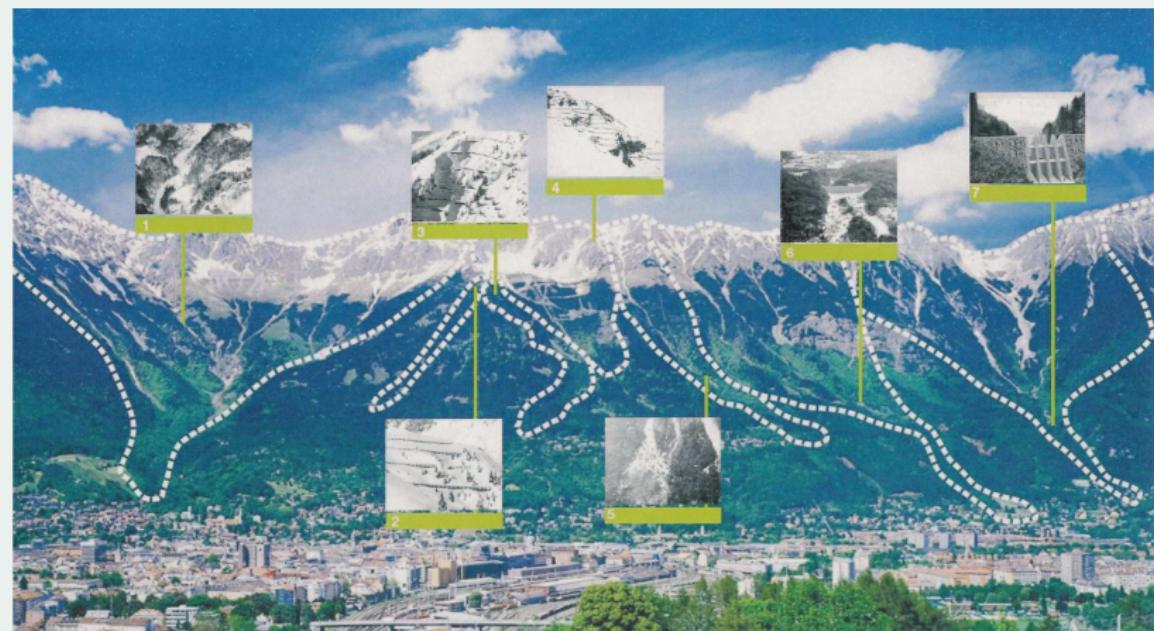
* Department for natural hazards - Austrian Research Centre for Forests BFW
Rennweg 1, 6020 Innsbruck, Austria

Fluid-mediated Particle Transport in Geophysical Flows
KITP, UCSB, 2013





Innsbruck, Tyrol, Austria



computational avalanche dynamics

oooooooooooooooooooooooooooo

experimental avalanche dynamics

oooooooooooooooooooo

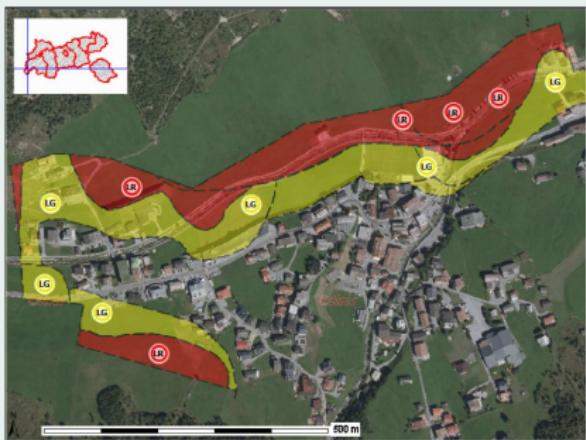
what is extreme?

1999 Galtür, Austria



destructive potential of extreme snow avalanches

hazard mapping



how far?
→ **runout**

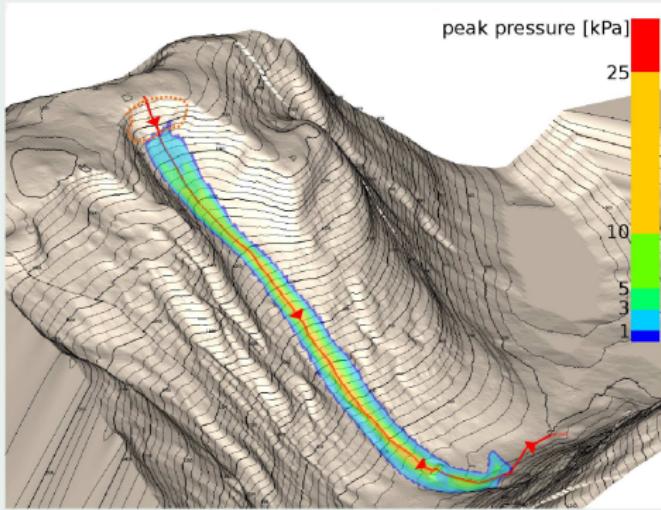
mitigation planning



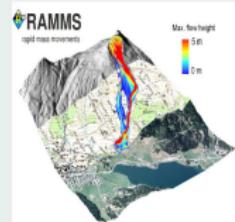
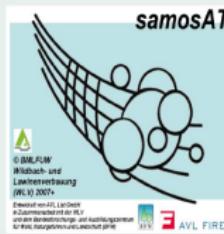
how destructive?
→ **pressure**

methods: computational and experimental avalanche dynamics

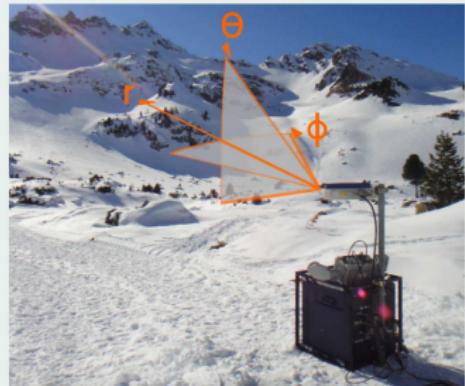
simulation results



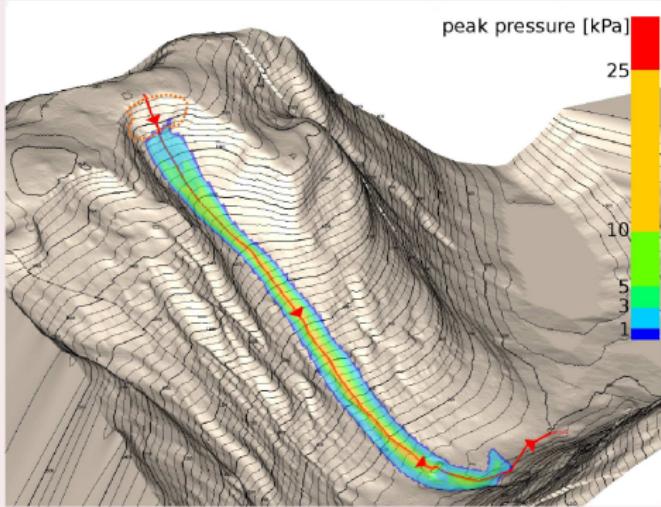
computation [5]



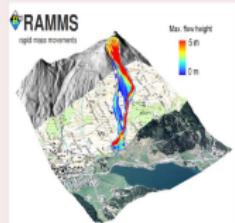
experiment [3, 4]



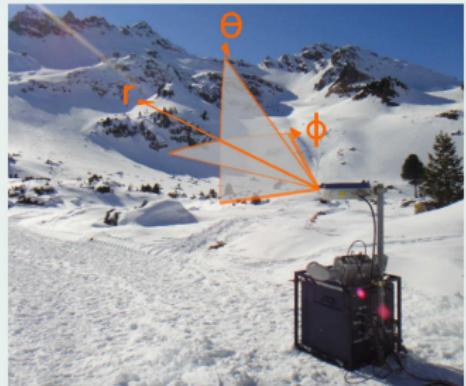
simulation results

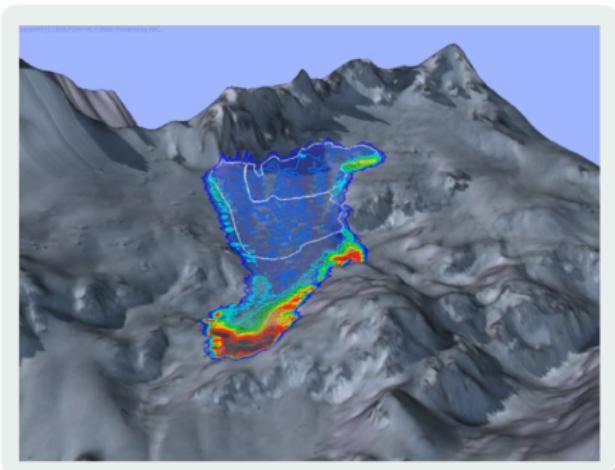
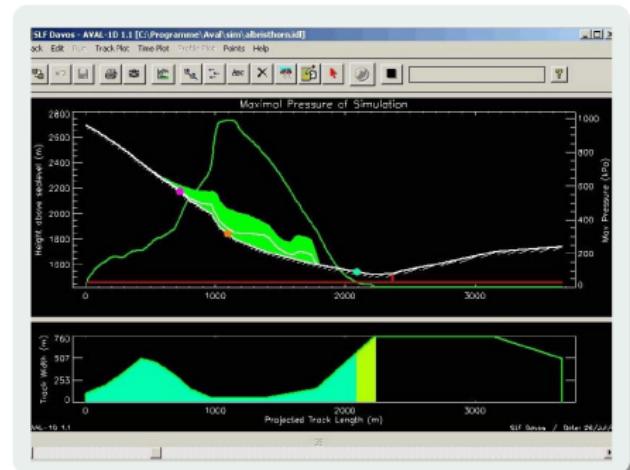


computation [5]



experiment [3, 4]





- simulations for: back calculation and prediction (inverse calibration/optimization)
 - learn something new about snow avalanche simulation in three dimensional terrain (simulation concepts, uncertainties, ...)
 - objective analysis method for comparison and evaluation of 100,1000,10000,... simulation runs
 - provide definitions representing main avalanche features

computational avalanche dynamics

avalanche types in nature

experimental avalanche dynamics

oooooooooooooooooooo

what is extreme?

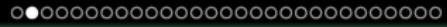
dfa - dense flow avalanche



psa - powder snow avalanche



computational avalanche dynamics



avalanche types in nature

experimental avalanche dynamics



what is extreme?

dfa - dense flow avalanche

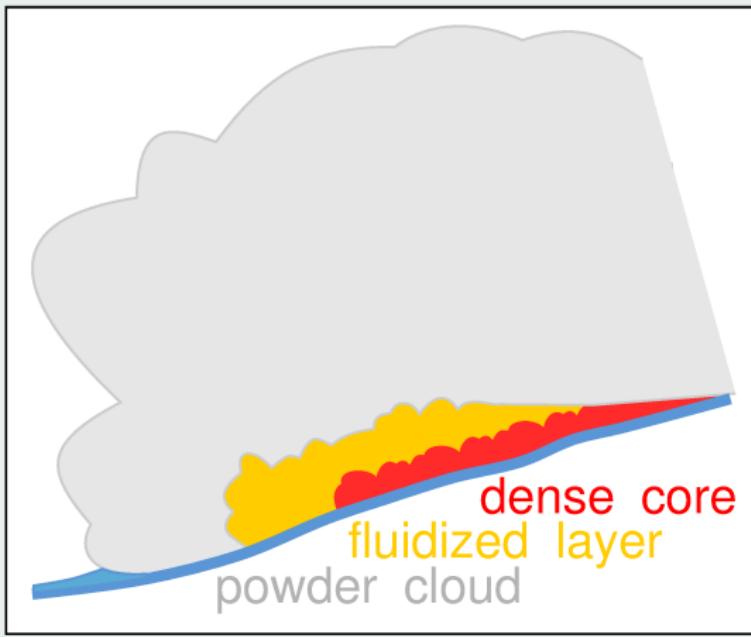


psa - powder snow avalanche



snow avalanche model

three layer structure - dense core - fluidized layer - powder cloud

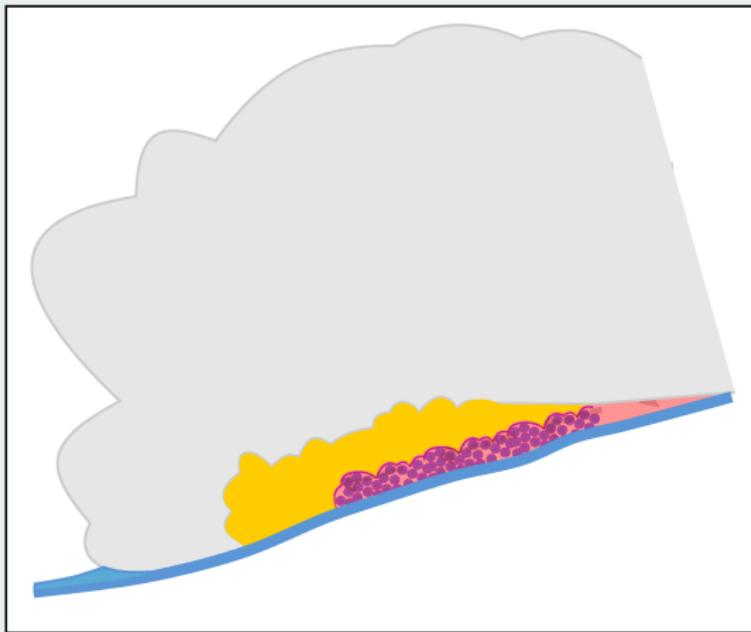


- flow depth
 - flow velocity
 - impact pressure

[11, 10, 9, 7]

dense flow avalanche model

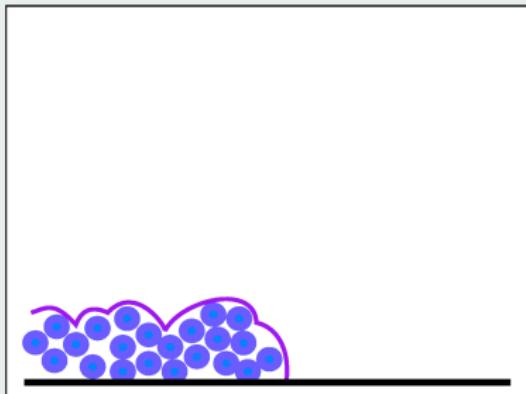
dfa - dense flow avalanche



- dense snow
 - granular flow
 - moderate velocity,
high density

dense flow avalanche

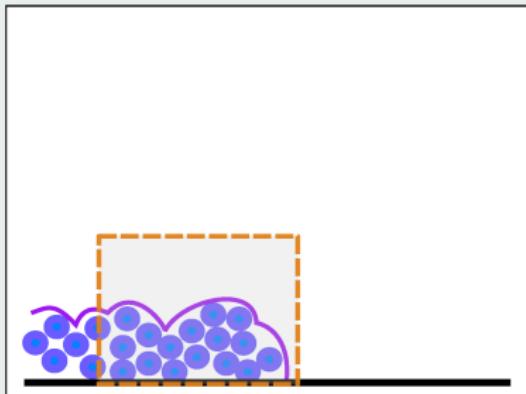
dense core



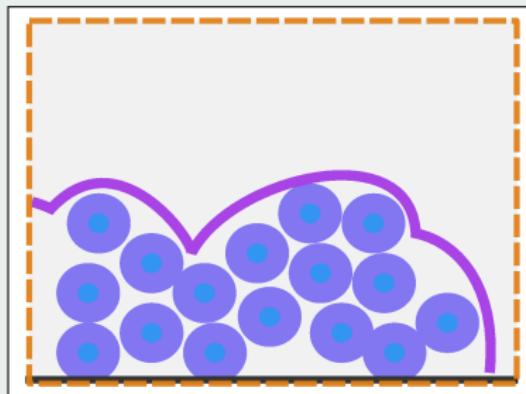
- 2d depth averaged shallow water/Savage Hutter equations
 - model parameters: density, bottom friction...
 - $c = 10^{-1}$, $\bar{\rho} = 150 - 400 \text{ kg m}^{-3}$, [10]

dense flow avalanche

dense core



frictional regime



- 2d depth averaged shallow water/Savage Hutter equations
- model parameters: density, bottom friction...
- $c = 10^{-1}$, $\bar{\rho} = 150 - 400 \text{ kg m}^{-3}$, [10]

model equations - shallow water/Savage Hutter

$$\partial_t \begin{pmatrix} h \\ hu_x \\ hu_y \end{pmatrix} + \partial_x \begin{pmatrix} hu_x \\ hu_x^2 + \frac{g_z h^2}{2} \\ hu_x u_y \end{pmatrix} + \partial_y \begin{pmatrix} hu_y \\ hu_x u_y \\ hu_y^2 + \frac{g_z h^2}{2} \end{pmatrix} = \begin{pmatrix} 0 \\ S_x \\ S_y \end{pmatrix}$$

$$S_i = hg_i - \frac{u_i}{\|\mathbf{u}\|} \frac{\tau^b}{\rho}$$

flow height: h , velocity: $\mathbf{u} = (u_x, u_y)$, grav. acceleration: $\mathbf{g} = (g_x, g_y, g_z)$

model assumptions

- incompressible material
- boundary conditions
- shallowness/dimension analysis
- depth integration

phenomenological bottom friction

$$\begin{aligned}\tau_{RAMMS}^b &= \mu \rho h g_z + \frac{\|\rho \mathbf{g}\|}{\xi} \mathbf{u}^2 \\ \tau_{SamosAT}^b &= \mu \left(1 + \frac{R_s^0}{R_s^0 + R_s}\right) \rho h g_z + \frac{\rho \mathbf{u}^2}{\left(\frac{1}{\kappa} \ln \frac{h}{R} + B\right)^2} + \tau_0 \\ \tau_{XYZ}^b &= \dots\end{aligned}$$

with

$$R_s = \frac{\rho \mathbf{u}^2}{h g_z}, \text{friction parameters: } \mu, \xi, R_s^0, \kappa, R, B, \tau_0, \dots$$

model results and their interpretation

model results - spatiotemporal evolution of flow variables:

- $h(x, y, t)$ - flow depth
- $\mathbf{u}(x, y, t)$ - flow velocity

simulation results - maximum impact pressure

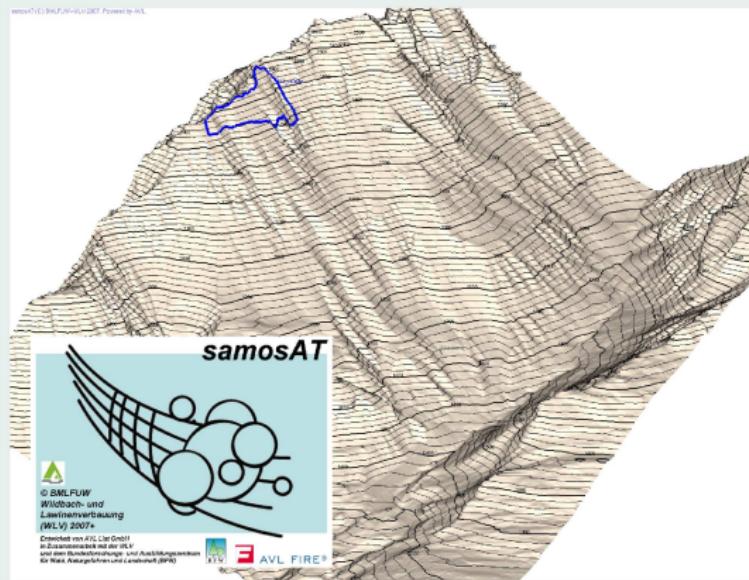
- $P(x, y, t) = \rho_{flow} u^2$
- $\tilde{P}(x, y) = \max_t P(x, y, t)$

[9, 1]

example Vallée de la Sionne, Switzerland:

simulation input:

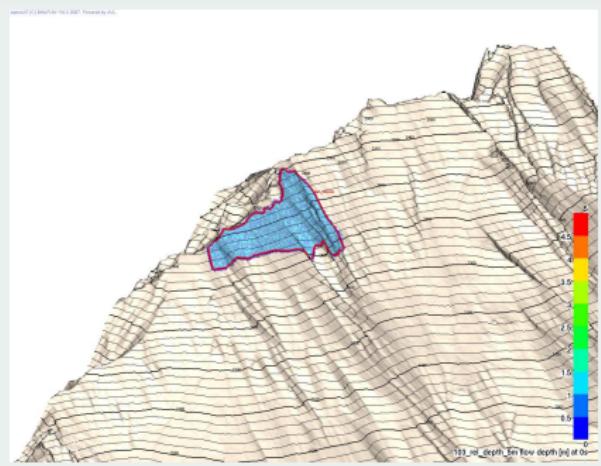
snowAT 1.0, build 2012-01-01, 2007. Powered by AVL.



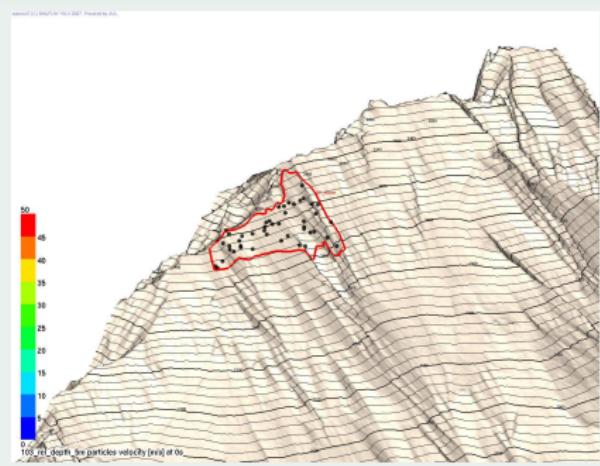
measurements

- Digital Elevation model
- release area
- release depth

dfa - SPH - continuum

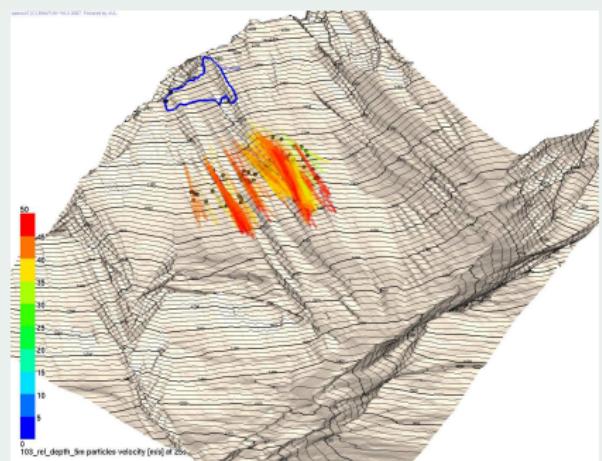


dfa - SPH - numerical particles

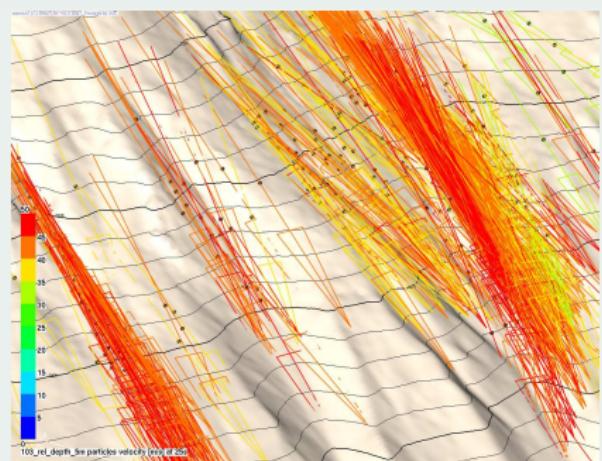


- discretization in: time, space, mass

dfa - SPH - 25 s



dfs - SPH - 25s

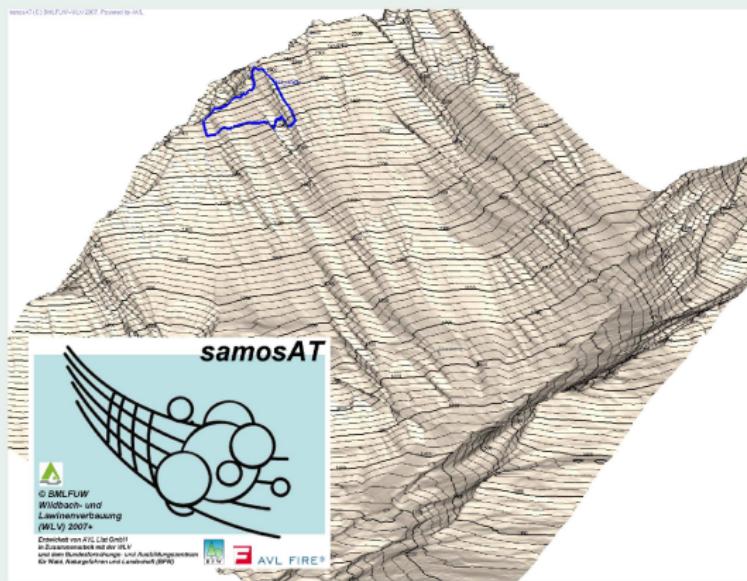


- computation of spatiotemporal evolution of flow variables

example Vallée de la Sionne, Switzerland:

simulation input:

snowAT 1.0, build 2012-01-10, Proven by H.A.



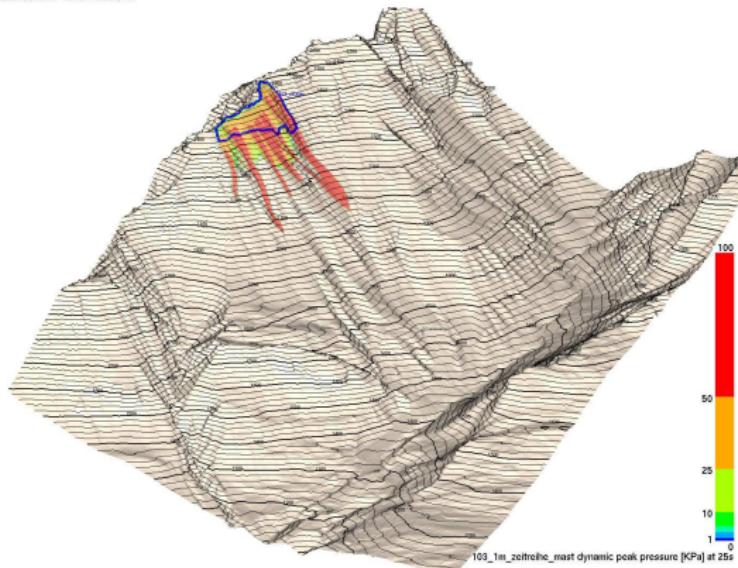
measurements

- Digital Elevation model
- release area
- release depth

example Vallée de la Sionne, Switzerland:

simulation results 25s:

simufl (LSDM, FLW, AGL, 2007, Preusser AG,



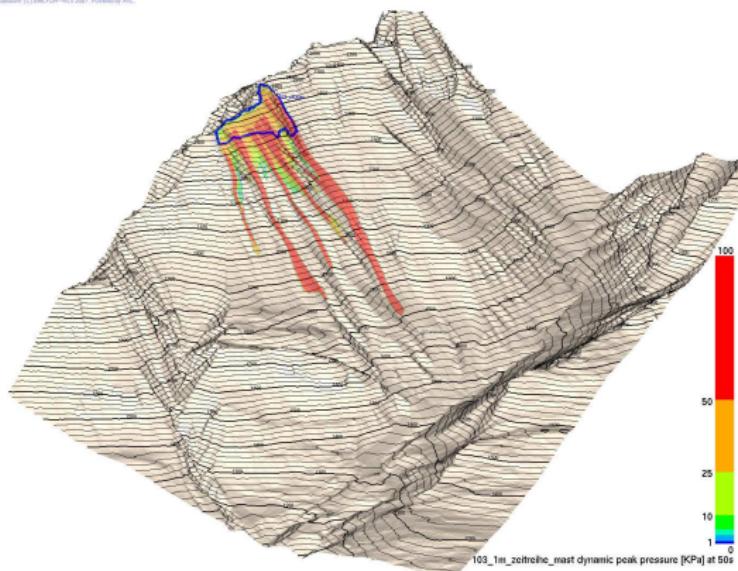
- how far?
→ **runout**
- how destructive?
→ **pressure**

- initial conditions → measurements

example Vallée de la Sionne, Switzerland:

simulation results 50s:

simsoft (C) DMU AG, 2007. Proprietary AG.



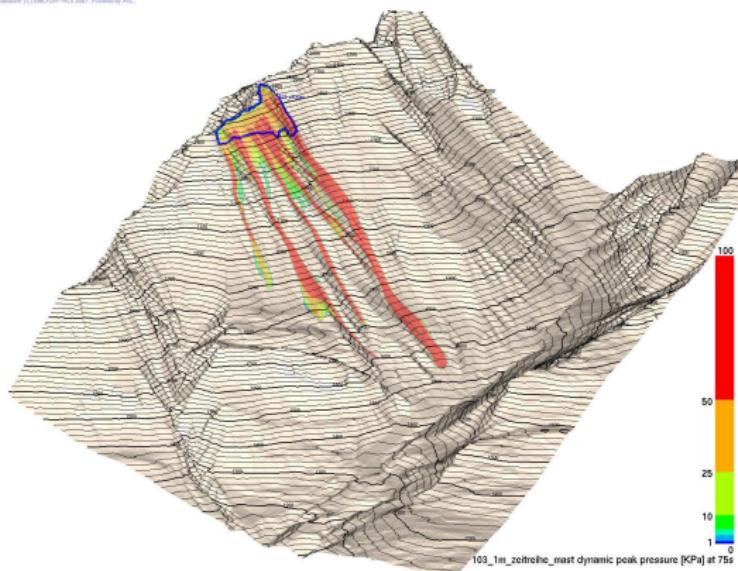
- how far?
→ **runout**
- how destructive?
→ **pressure**

- initial conditions → measurements

example Vallée de la Sionne, Switzerland:

simulation results 75s:

simsoft (C) DMU/ETH-Zürich 2007. Proprietary ARI.



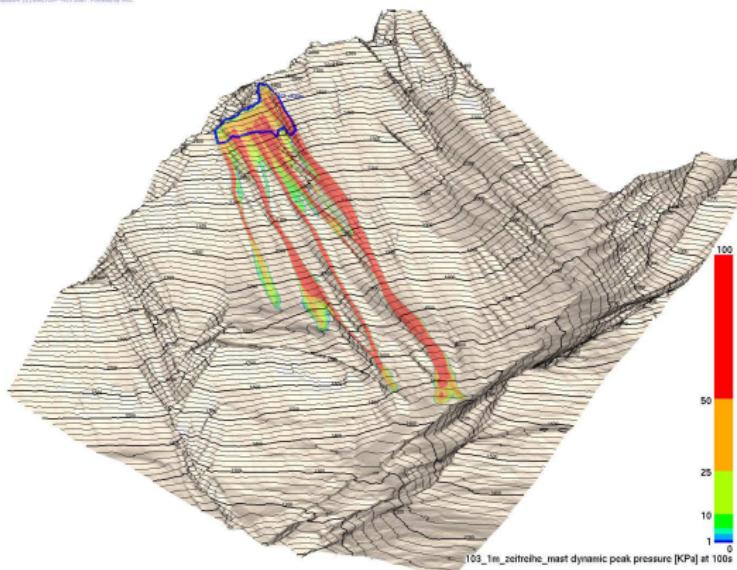
- how far?
→ **runout**
- how destructive?
→ **pressure**

- initial conditions → measurements

example Vallée de la Sionne, Switzerland:

simulation results 100s:

simulif (LIDM,FDn,AGs,2007,Proximity AGs,



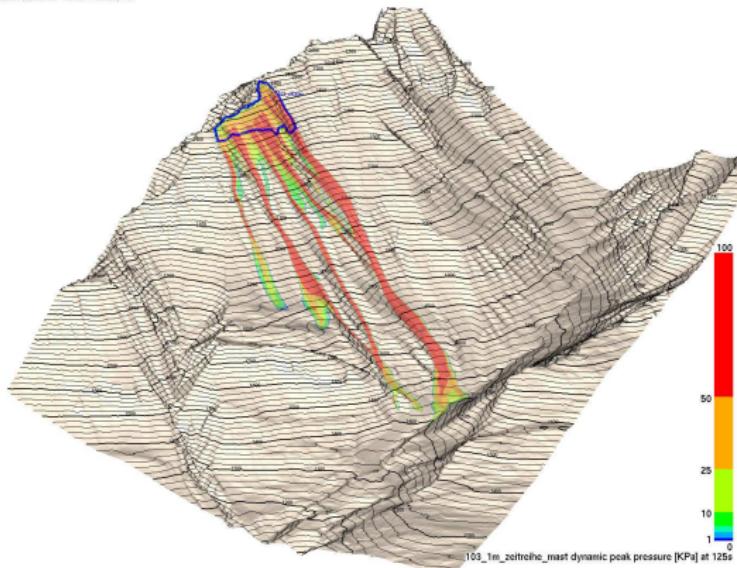
- how far?
→ **runout**
- how destructive?
→ **pressure**

- initial conditions → measurements

example Vallée de la Sionne, Switzerland:

simulation results 125s:

simulif (LIDW-AGs) 2007. Prevertex AG.



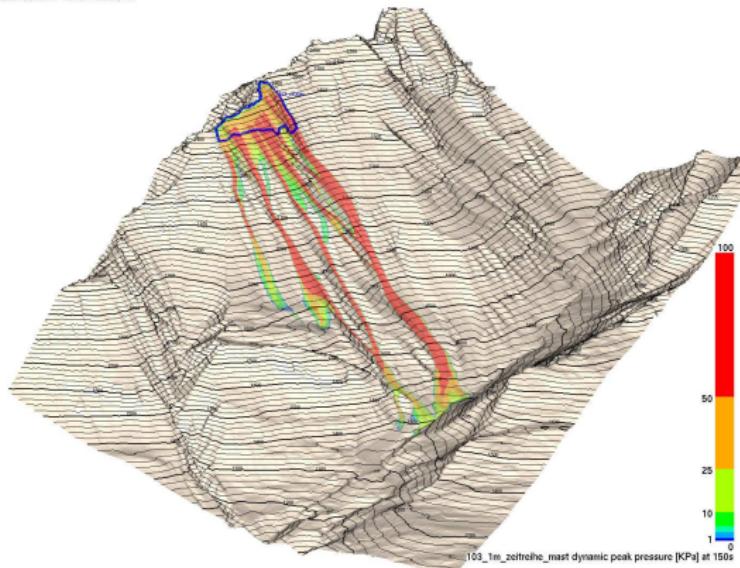
- how far?
→ **runout**
- how destructive?
→ **pressure**

- initial conditions → measurements

example Vallée de la Sionne, Switzerland:

simulation results 150s:

simulif (LIDM,FDn,AGs,2007,Proximity AGs,



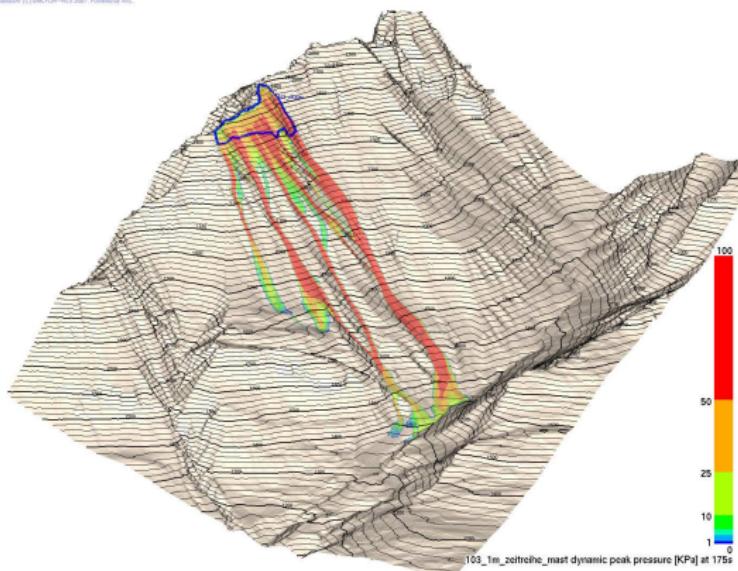
- how far?
→ **runout**
- how destructive?
→ **pressure**

- initial conditions → measurements

example Vallée de la Sionne, Switzerland:

simulation results 175s:

simulif (LIDW-AvA-2007) Prevalley AvA.



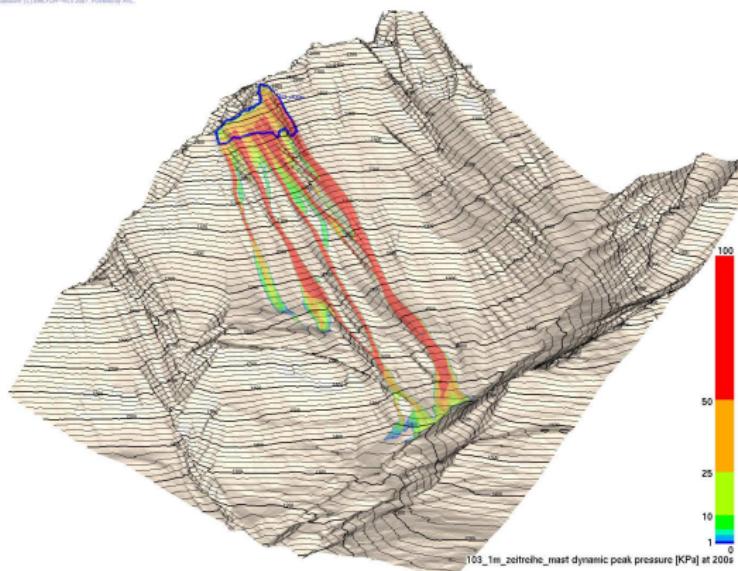
- how far?
→ **runout**
- how destructive?
→ **pressure**

- initial conditions → measurements

example Vallée de la Sionne, Switzerland:

simulation results 200s:

simoutf (1) DM.FDv-AGs.2007_Precipity AGs.



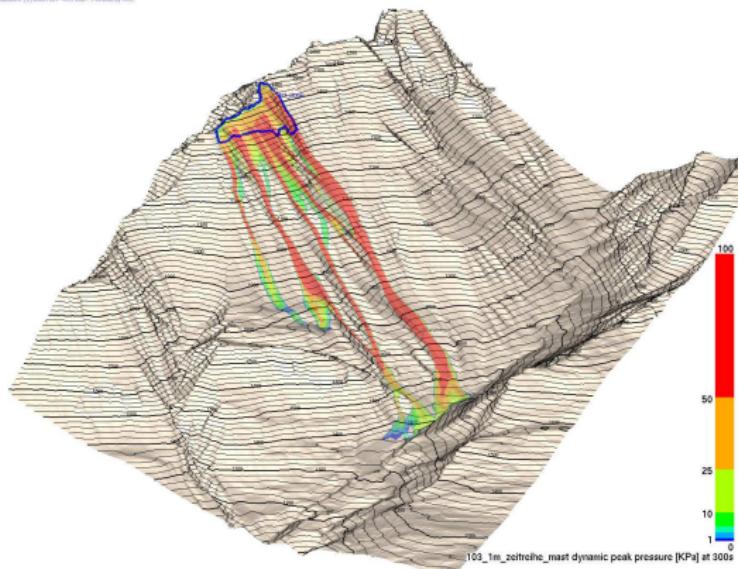
- how far?
→ **runout**
- how destructive?
→ **pressure**

- initial conditions → measurements

example Vallée de la Sionne, Switzerland:

simulation results final:

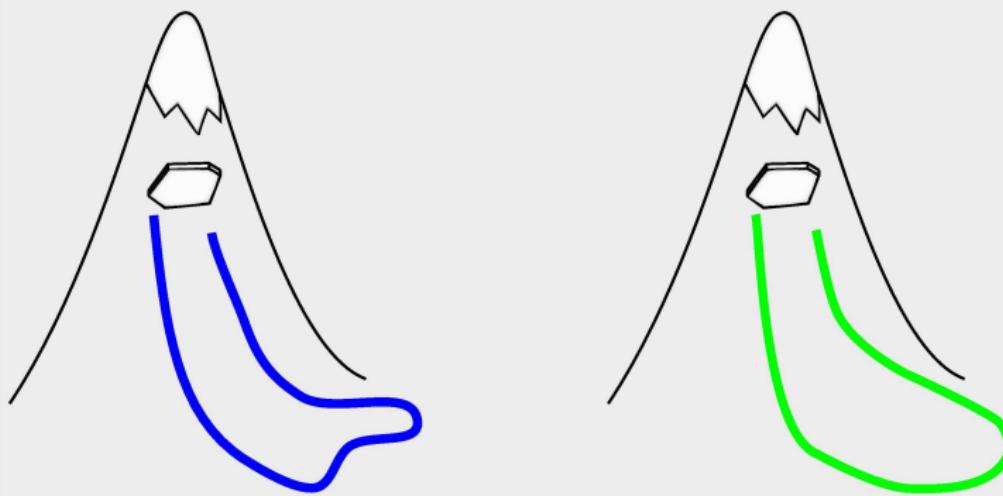
simsoft 1.1.0M, Date: 4/12/2007, Processor: 4G,



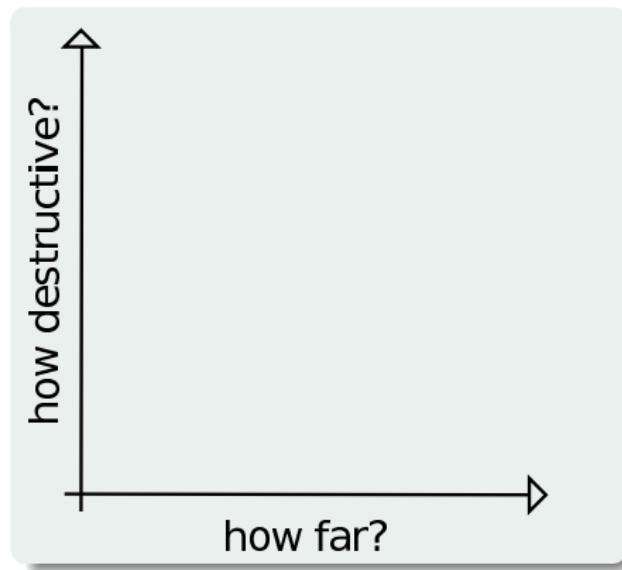
- how far?
→ **runout**
- how destructive?
→ **pressure**

- model parameters → back calculation

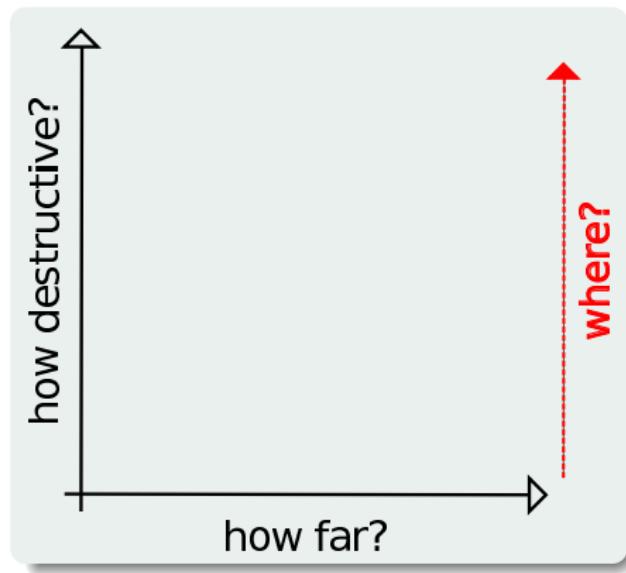
method for evaluation and comparison [2]



input: topography, release information, model parameters
output: flow depth, velocity, ... maximum impact pressure - $\tilde{P}(x, y)$



scalar metric, to represent main avalanche features



scalar metric, to represent main avalanche features

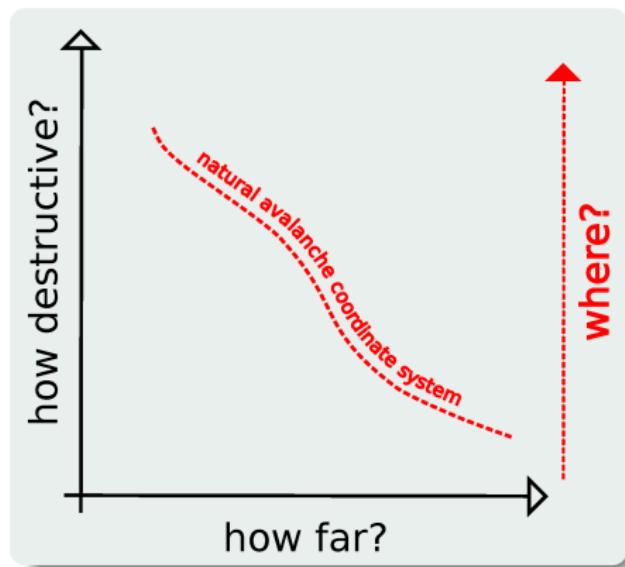
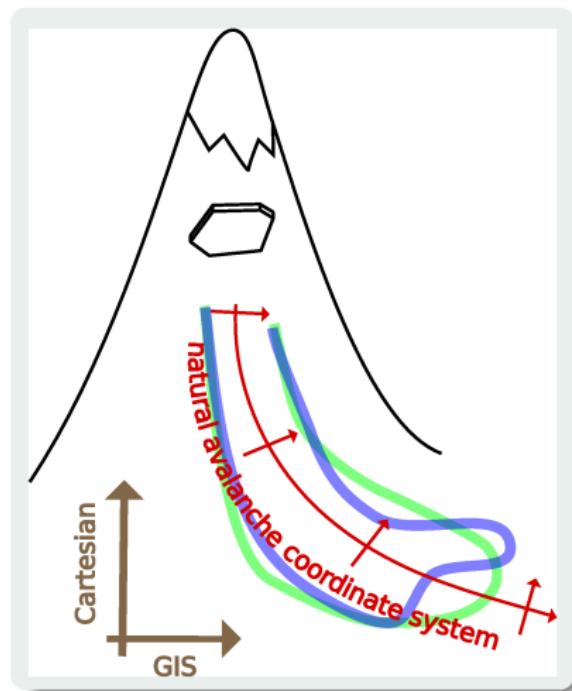


- how to determine start and end point in a global framework?
- how would an avalanche see it?



- how would an avalanche see it - change of framework
- coordinate transformation along the avalanche path

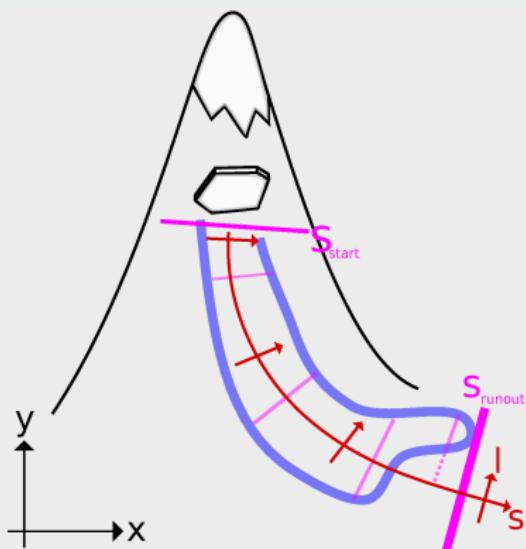
coordinate transformation



where? path dependent coordinate system

indicators - path dependent metric

runout



what is runout?

runout is a threshold, e.g.

$$P_{limit} = 1 \text{ kPa}$$

of the cross sectional peak pressure maximum

$$P_{cross}^{max}(s) = \max_I P(s, I)$$

defines runout position

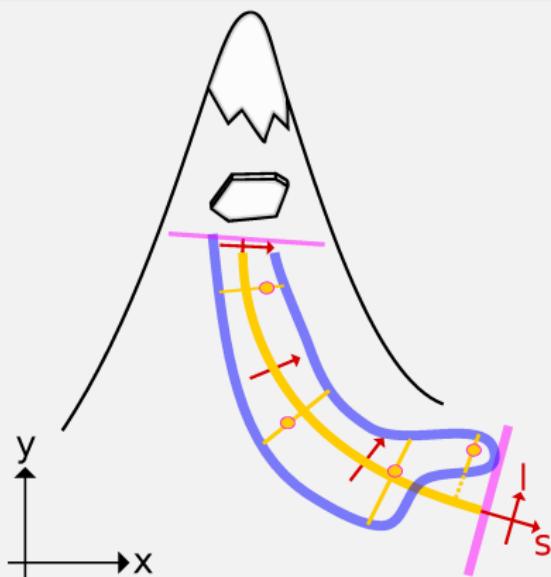
$$s_{runout}$$

along the avalanche path

two dimensional pressure results $\tilde{P}(x, y)$ to define scalar indicators in new coordinate system $P(s, I)$

indicators - path dependent metric

destructiveness



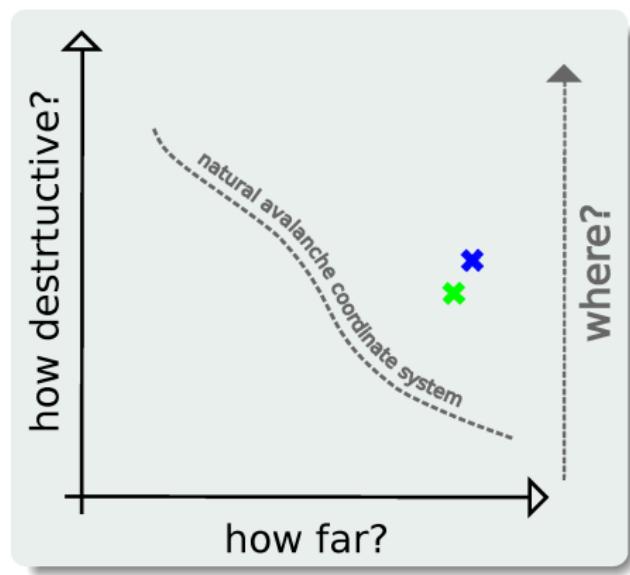
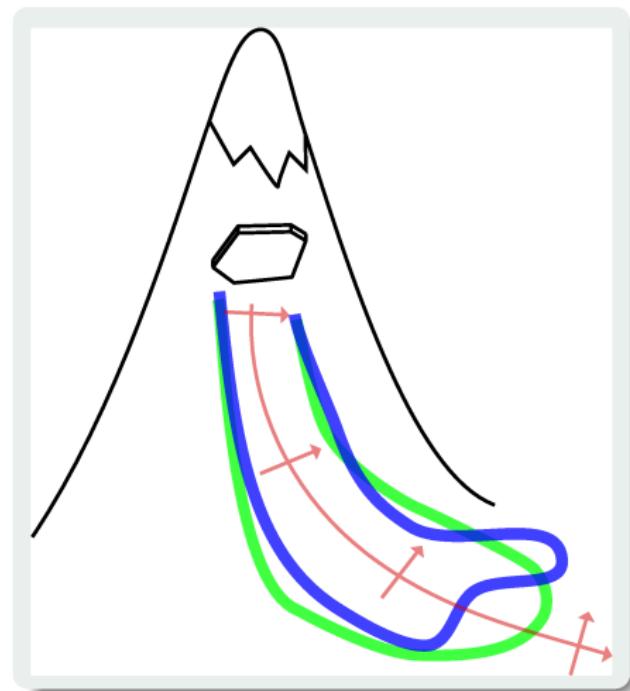
what is destructiveness?

a measure for destructiveness is the
Averaged (along the avalanche path)
Maximum (cross sectional)
Peak Pressure (AMPP)

$$P_{cross}^{\max}(s) = \max_l P(s, l)$$

$$AMPP = \frac{1}{|s_{start} - s_{runout}|} \int_{s_{start}}^{s_{runout}} P_{cross}^{\max}(s) \, ds$$

two dimensional pressure results $\tilde{P}(x, y)$ to define scalar indicators in new coordinate system $P(s, l)$



comparison of multiple simulation runs

computational avalanche dynamics

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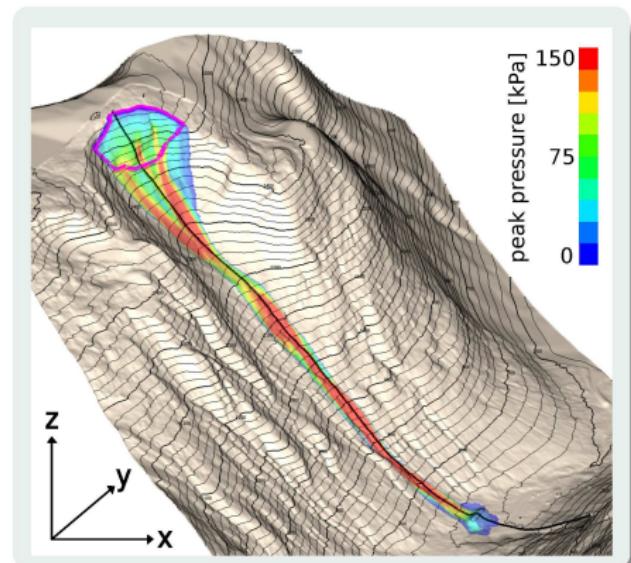
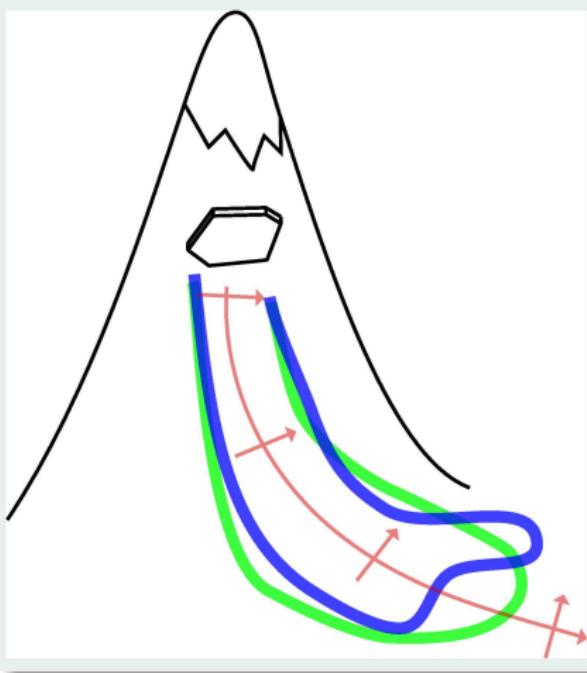
Example - Ryggfonn

experimental avalanche dynamics

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what is extreme?

Example - Ryggfonn



definition of path dependent coordinate system

computational avalanche dynamics

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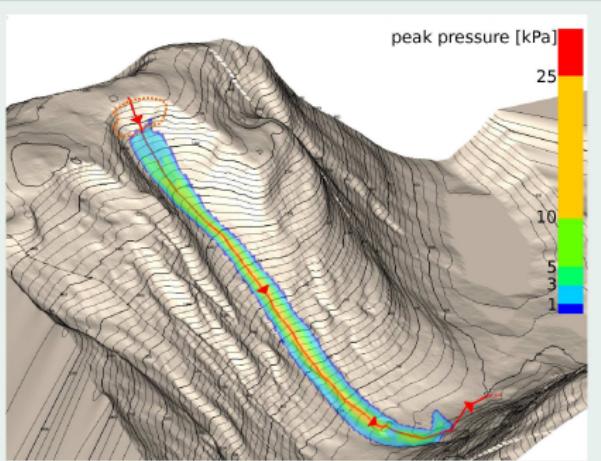
Example - Ryggfonn

experimental avalanche dynamics

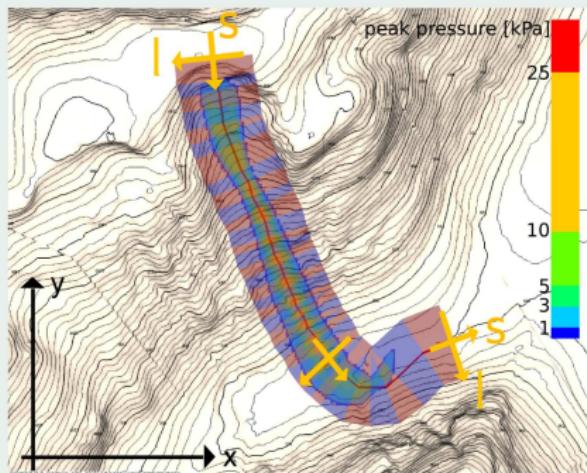
oooooooooooooooooooo

what is extreme?

Ryggfonn Norway

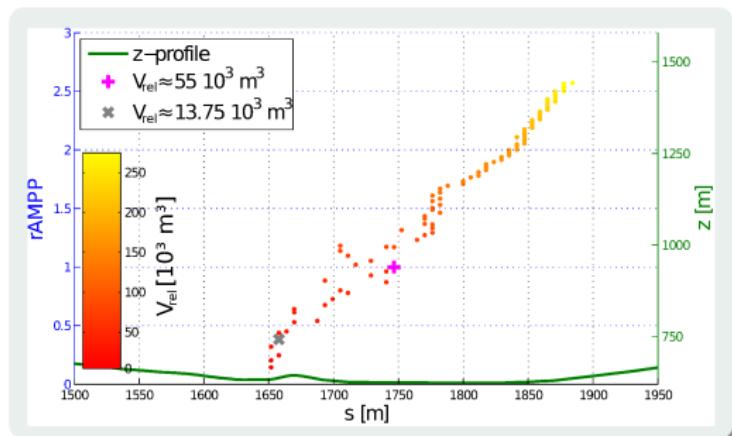
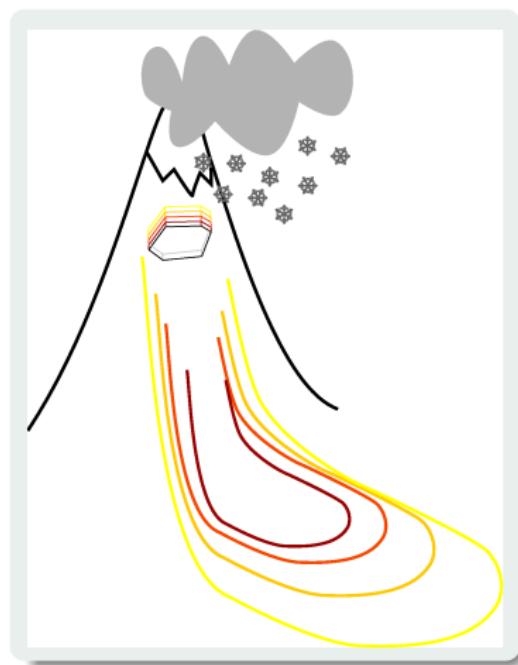


coordinate system



results of snow avalanche simulation in computational coordinate system
and path dependent coordinate system

variation of release depth



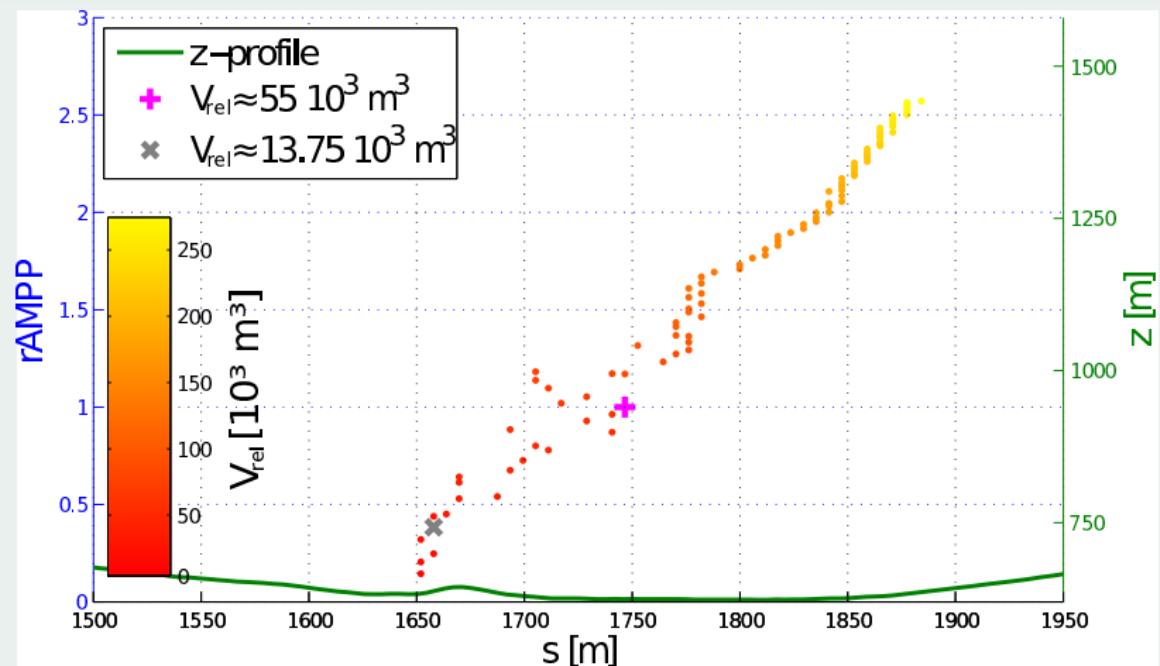
main avalanche features of 100 simulation runs with varying input topography, **release information**, model parameters summarized in objective and clear way

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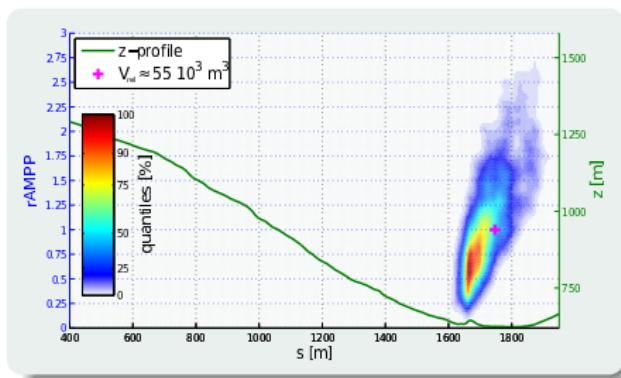
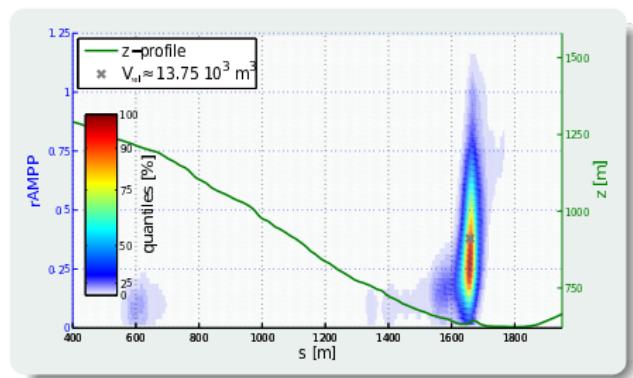
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Example - Ryggfond

variation of release depth

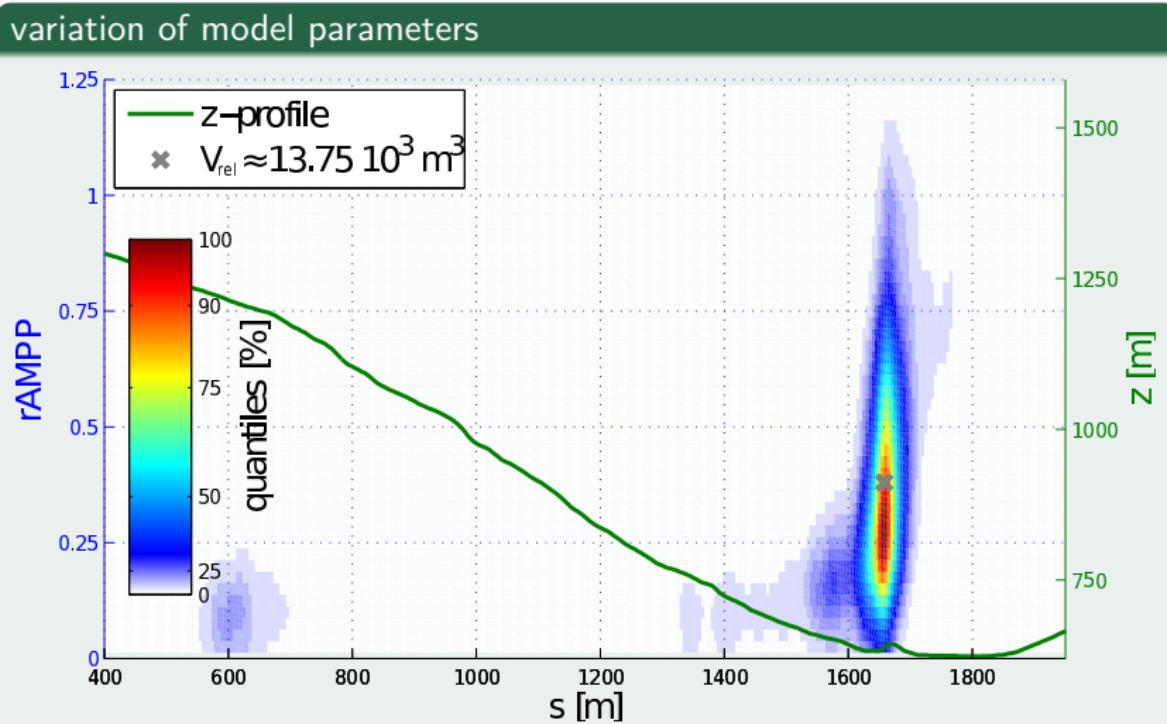


variation of model parameters



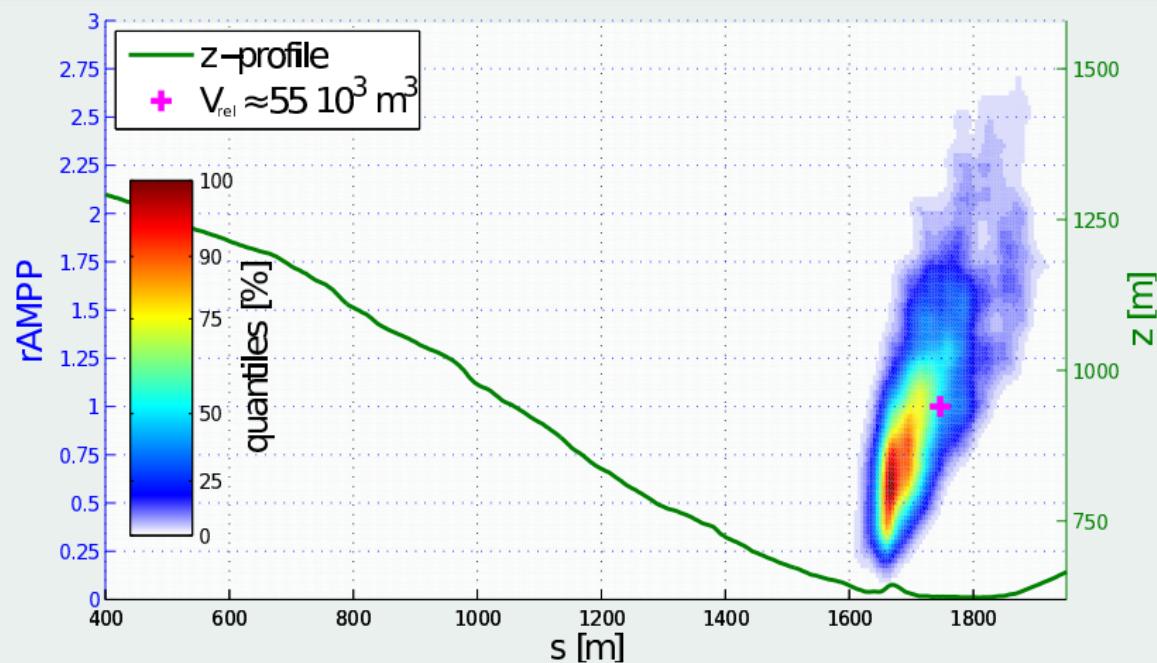
simulation input: topography, release information, **model parameters**
 density distribution of main simulation features for 1000 simulation runs
 with varying friction parameters, and different release volume

Example - Ryggfond



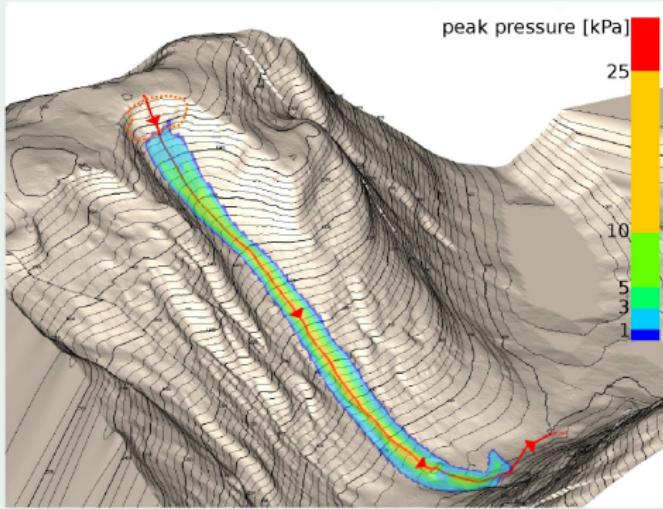
application in sensitivity analysis, calibration, uncertainty analysis

variation of model parameters

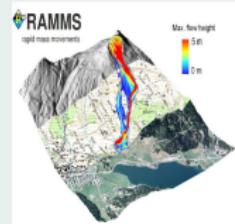


application in sensitivity analysis, calibration, uncertainty analysis

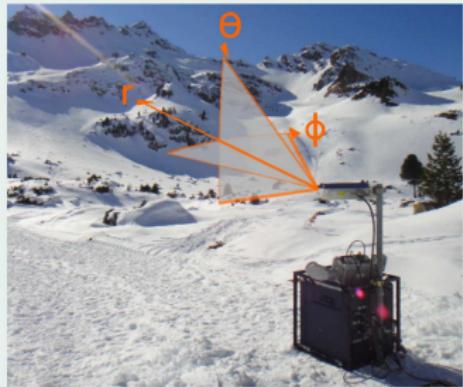
simulation results [2]



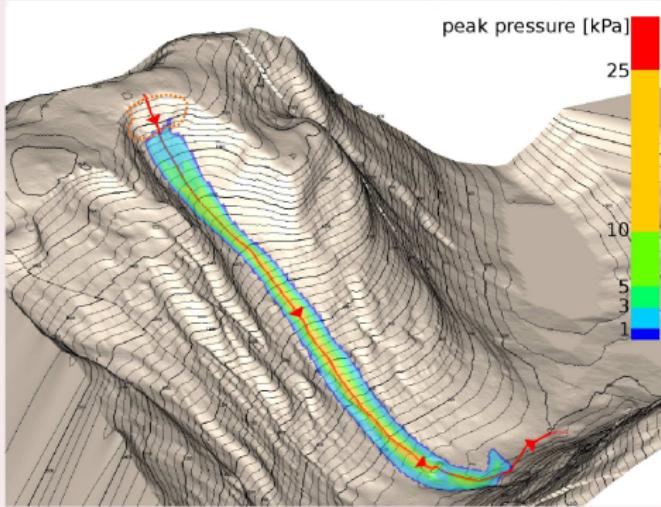
computation [5]



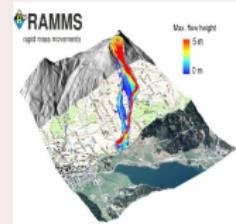
experiment [3, 4]



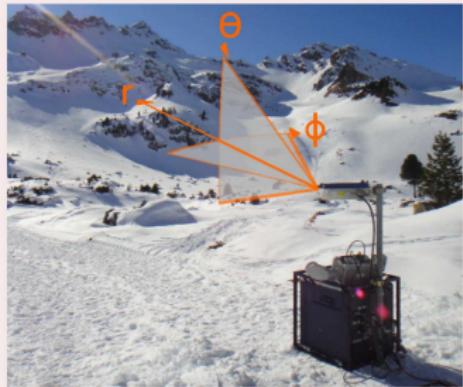
simulation results



computation [5]



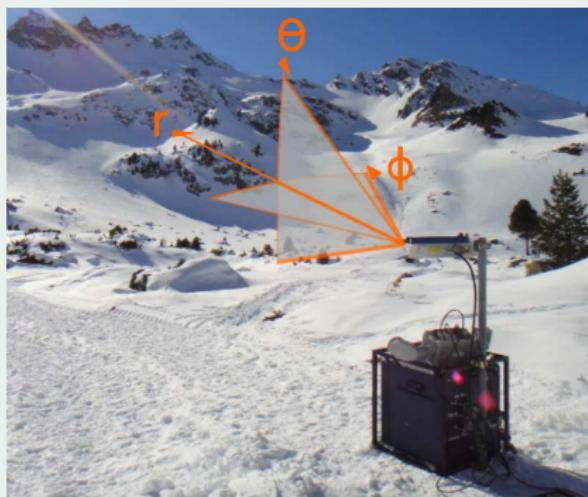
experiment [3, 4]



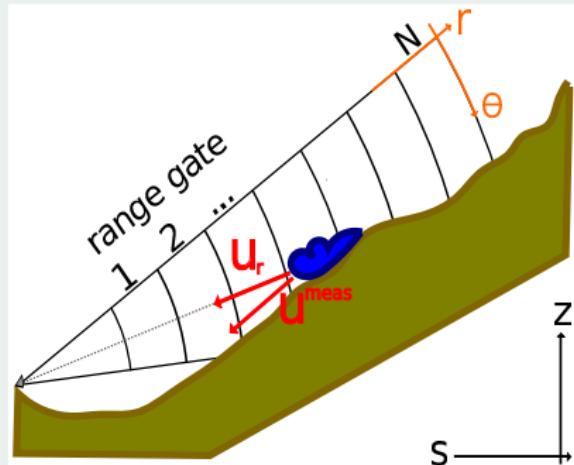


- learn about the velocities, mass balance and dynamics of avalanches
- estimate accuracy of simulated avalanche velocities
- provide optimized model parameters/input

field measurement



data processing



pulsed Doppler radar measurements
5.8 GHz \approx 5 cm snow clods

range gate width \approx 25 – 100 m
topographic correction and projection

computational avalanche dynamics

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Doppler radar measurements

experimental avalanche dynamics

what is extreme?

Ryggfonn

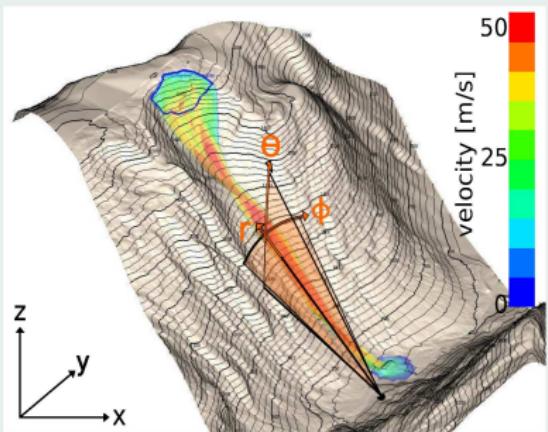


Vallée de la Sionne



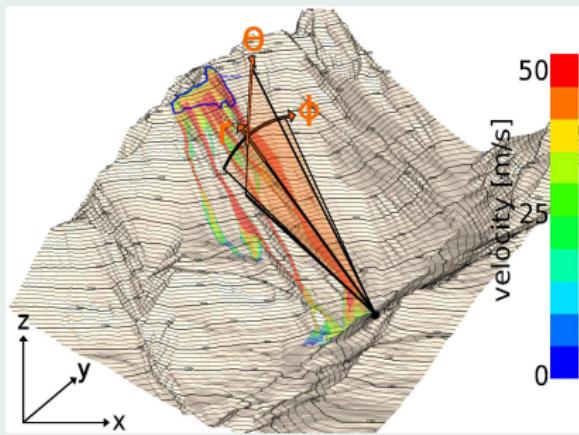
Doppler radar positions at test sites

Ryggfond - 17.04.1997



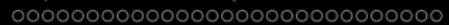
- $V_{rel} \approx 12 - 30 \times 10^3 \text{ m}^3$
 - $V_{dep} \approx 40 \times 10^3 \text{ m}^3$
 - $\bar{\alpha} = 28^\circ$
 - $\Delta Z = 900 \text{ m}$

Vallée de la Sionne - 10.02.1999



- $V_{rel} \approx 84 \times 10^3 \text{ m}^3$
 - $V_{dep} \approx 505 \times 10^3 \text{ m}^3$
 - $\bar{\alpha} = 30^\circ$
 - $\Delta Z = 1200 \text{ m}$

computational avalanche dynamics



Doppler radar measurements

experimental avalanche dynamics



what is extreme?

Ryggfonn



Vallée de la Sionne

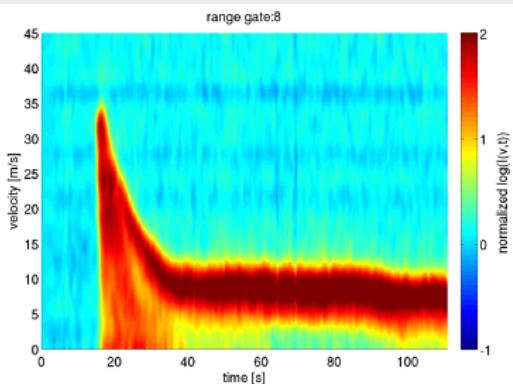


Vallée de la Sionne, 10. 2. 1999

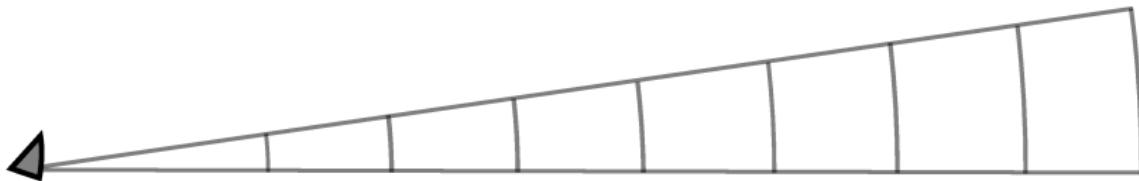


Ryggfonn 17.04.1997

450-500 m



- range gate intensity spectra
 $I(t, \Delta f) \rightarrow I(t, v)$
- lowpass and noise filtering
- normalizing with background signal



computational avalanche dynamics

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Doppler radar data processing

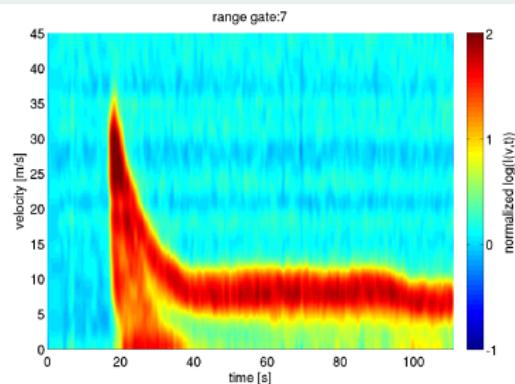
experimental avalanche dynamics

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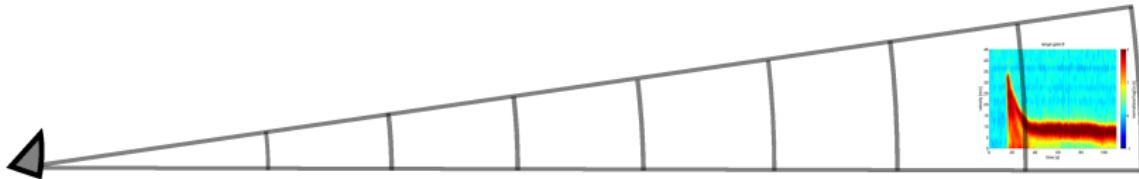
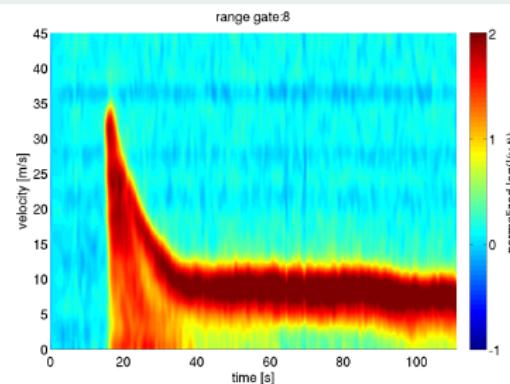
what is extreme?

Ryggfonn 17.04.1997

400-450 m



450-500 m



computational avalanche dynamics

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Doppler radar data processing

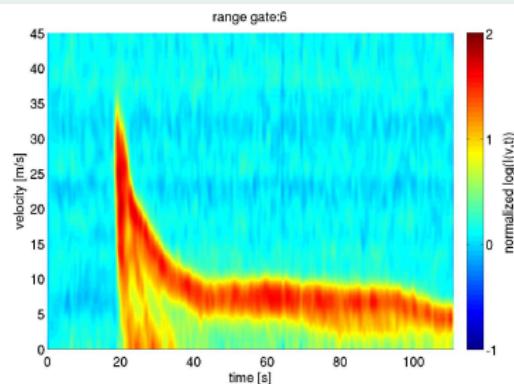
experimental avalanche dynamics

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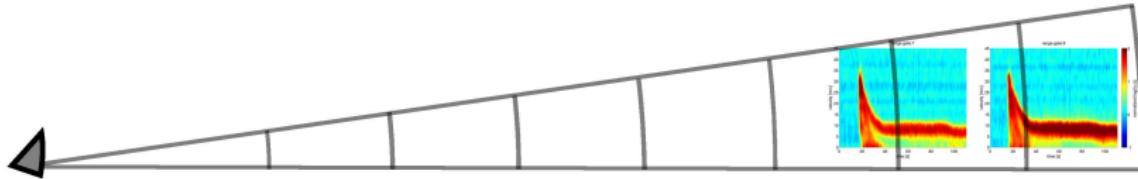
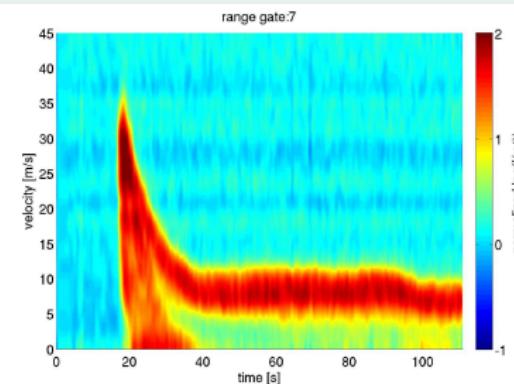
what is extreme?

Ryggfonn 17.04.1997

350-400 m

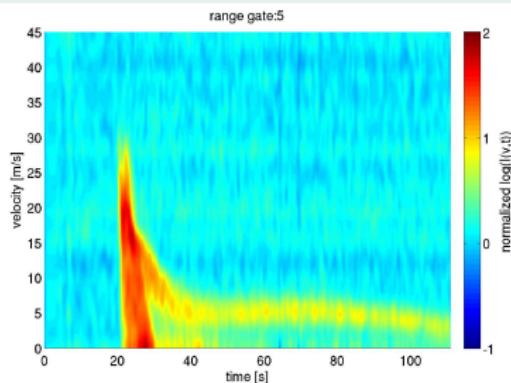


400-450 m

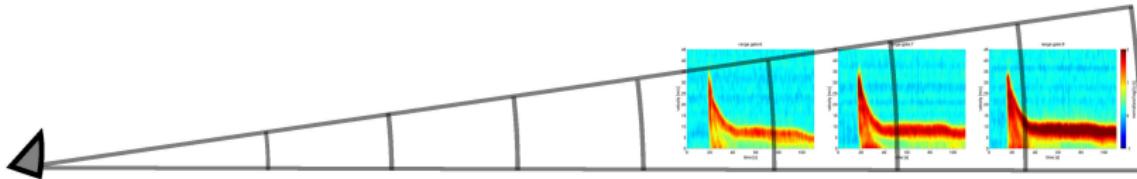
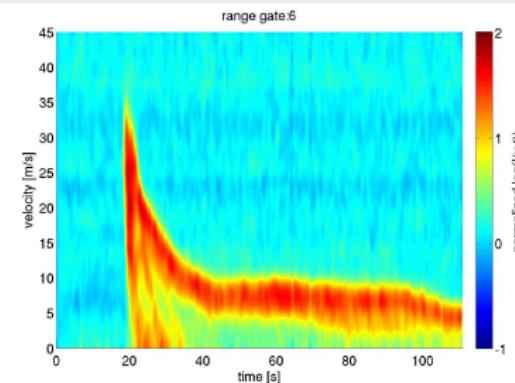


Ryggfonn 17.04.1997

300-350 m



350-400 m



computational avalanche dynamics

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Doppler radar data processing

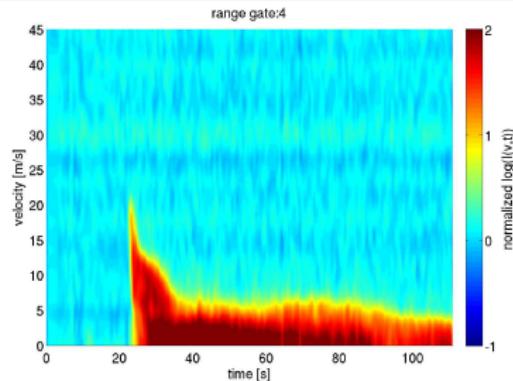
experimental avalanche dynamics

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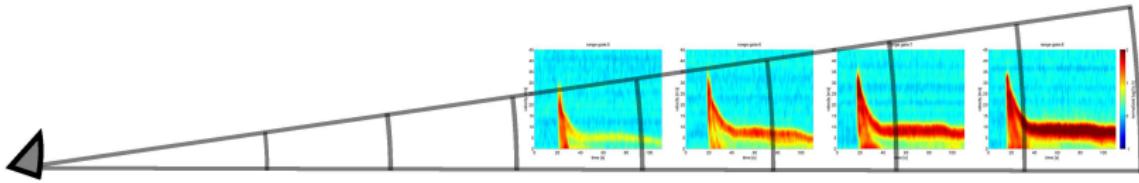
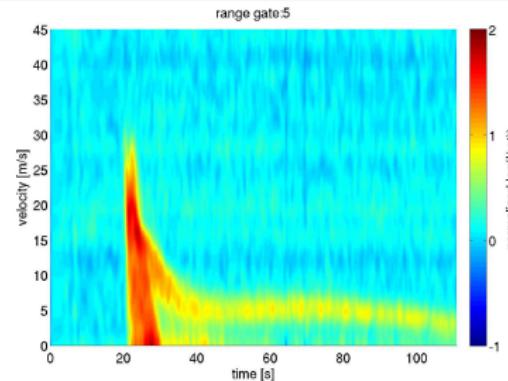
what is extreme?

Ryggfonn 17.04.1997

250-300 m



300-350 m



computational avalanche dynamics

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Doppler radar data processing

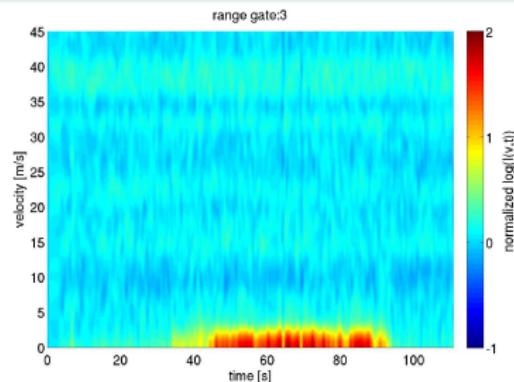
experimental avalanche dynamics

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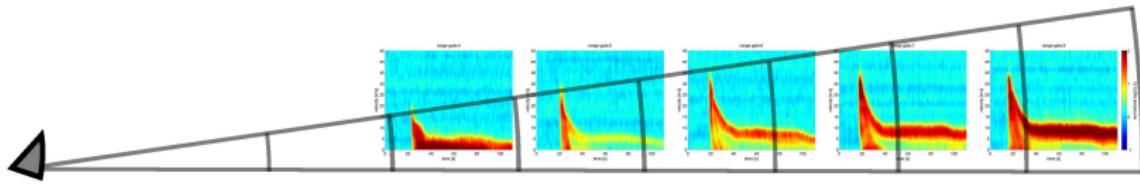
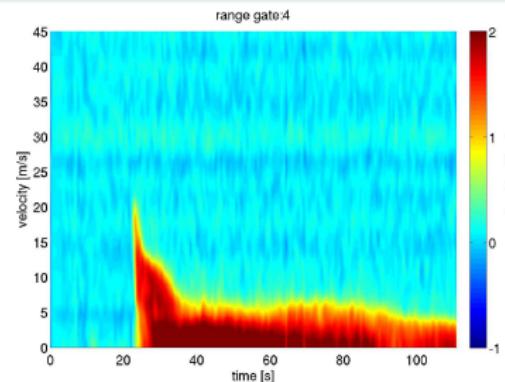
what is extreme?

Ryggfonn 17.04.1997

200-250 m



250-300 m



computational avalanche dynamics

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Doppler radar data processing

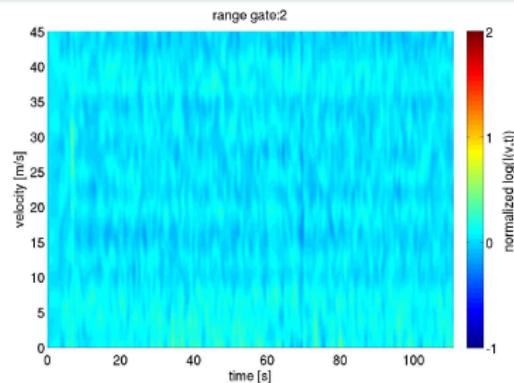
experimental avalanche dynamics

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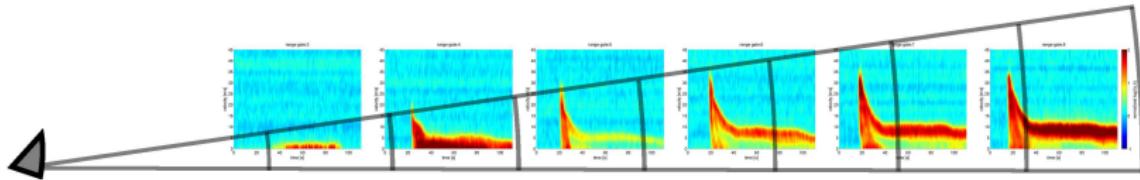
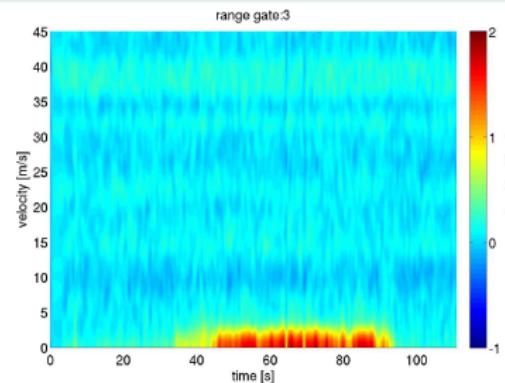
what is extreme?

Ryggfonn 17.04.1997

150-200 m



200-250 m

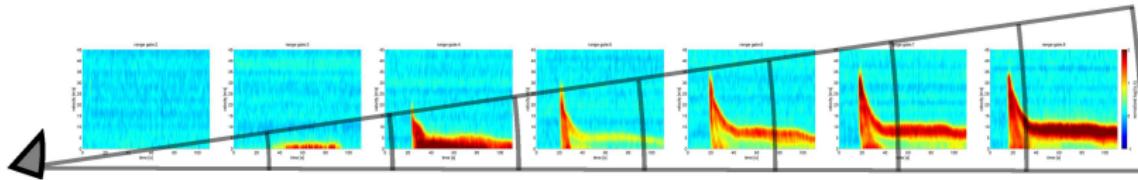
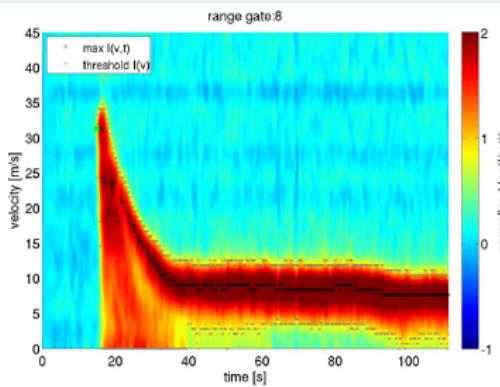


Ryggfonn 17.04.1997

different velocity types

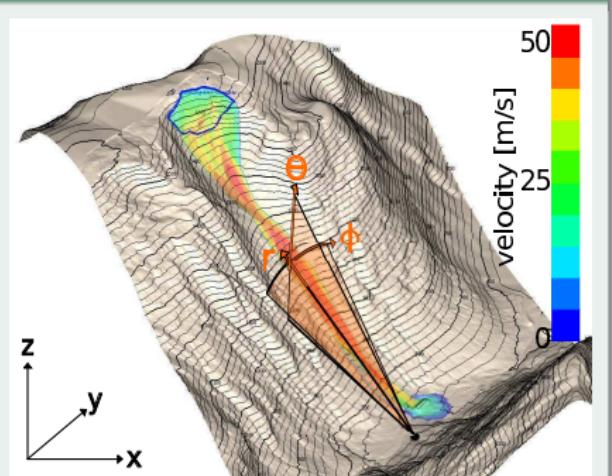
- velocity of maximum intensity
- front velocity
- velocity range
- [12, 8, 6]...

450-500 m

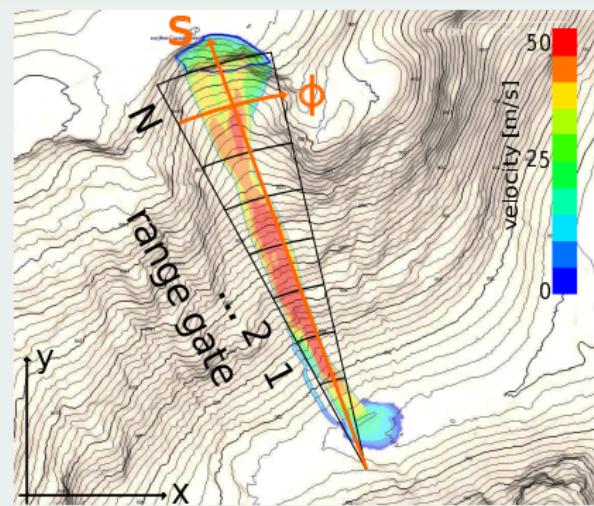


evaluation - Ryggfonn

simulation output

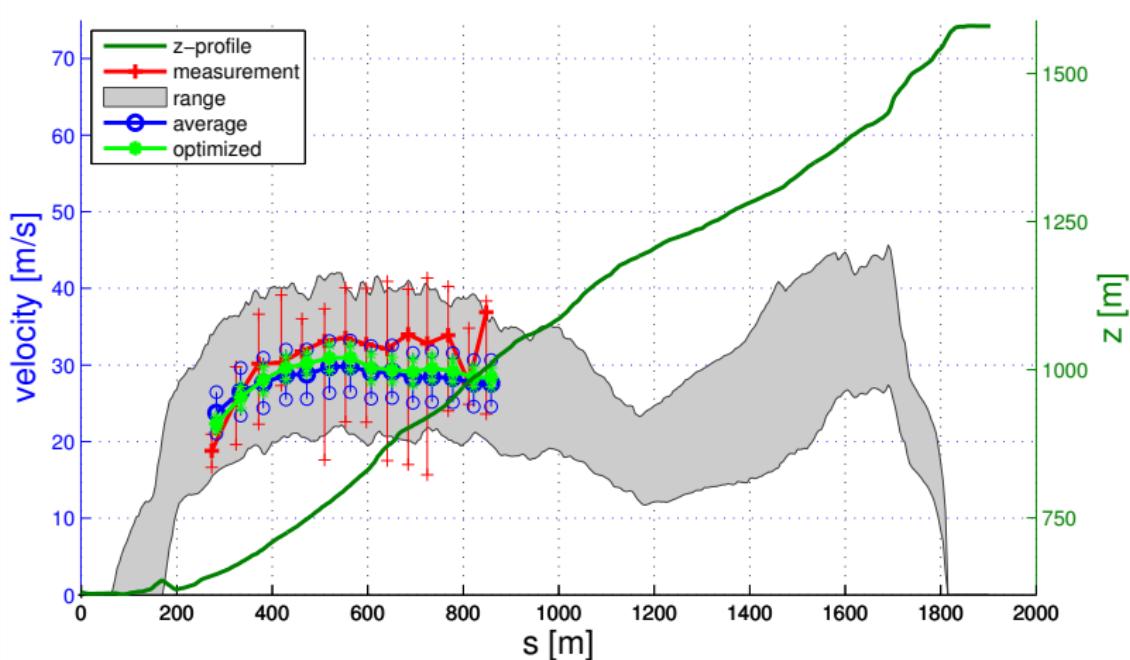


result processing



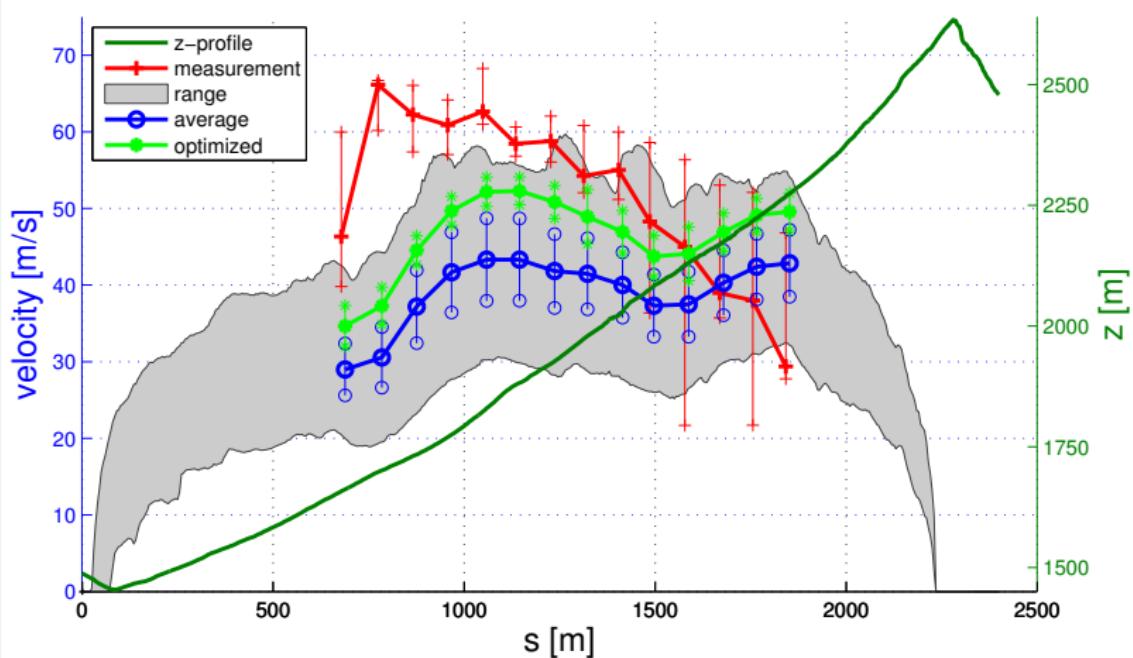
simulation input: topography, **release height (measurement uncertainty)**, model parameters
 transformation in measurement system,
 comparison of multiple (10000) simulation runs.

Ryggfonn - avalanche simulation with release depth variations



velocity evaluation and uncertainty estimation with probabilistic methods

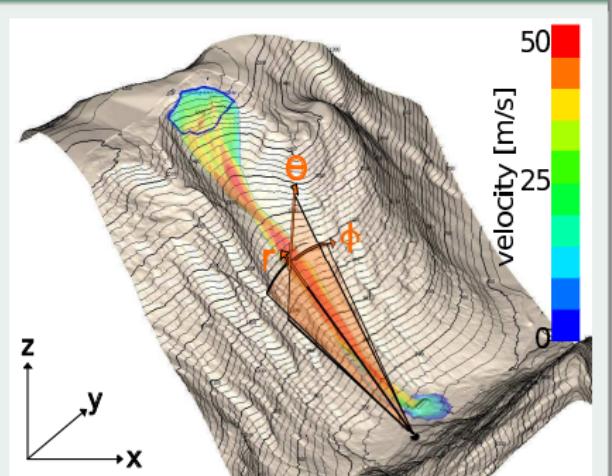
Vallée de la Sionne - avalanche simulation with release depth variations



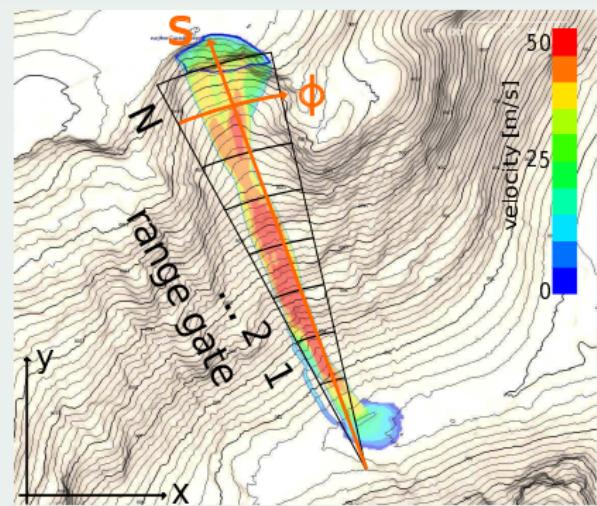
velocity range, average and best fit...

evaluation - Ryggfonn

simulation output

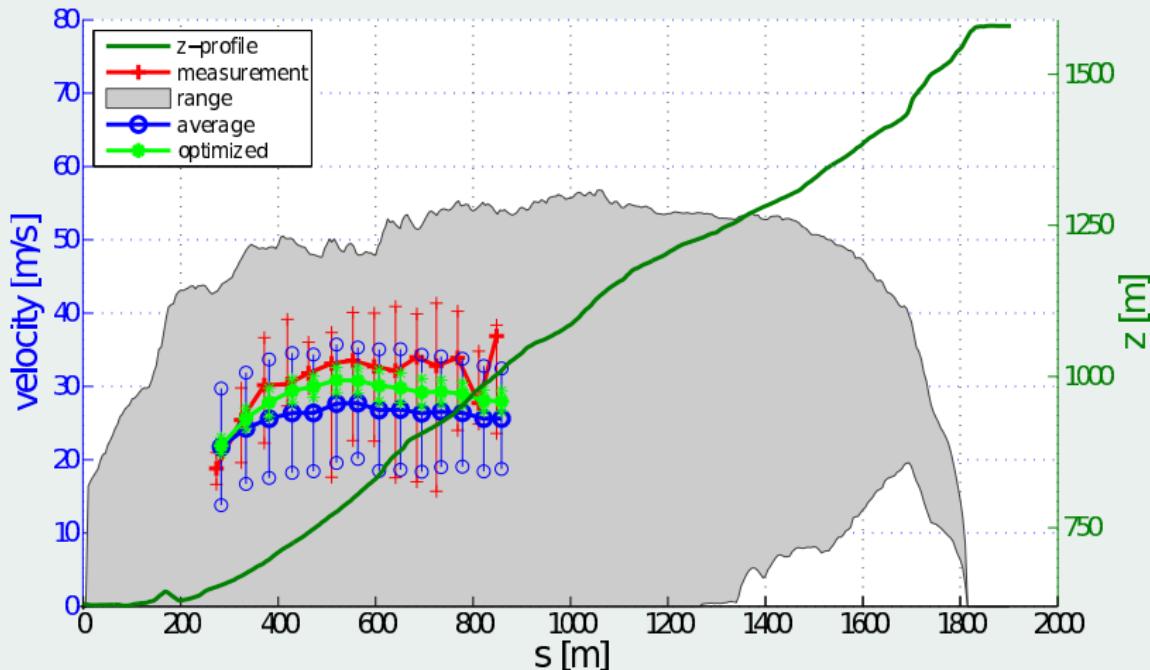


result processing



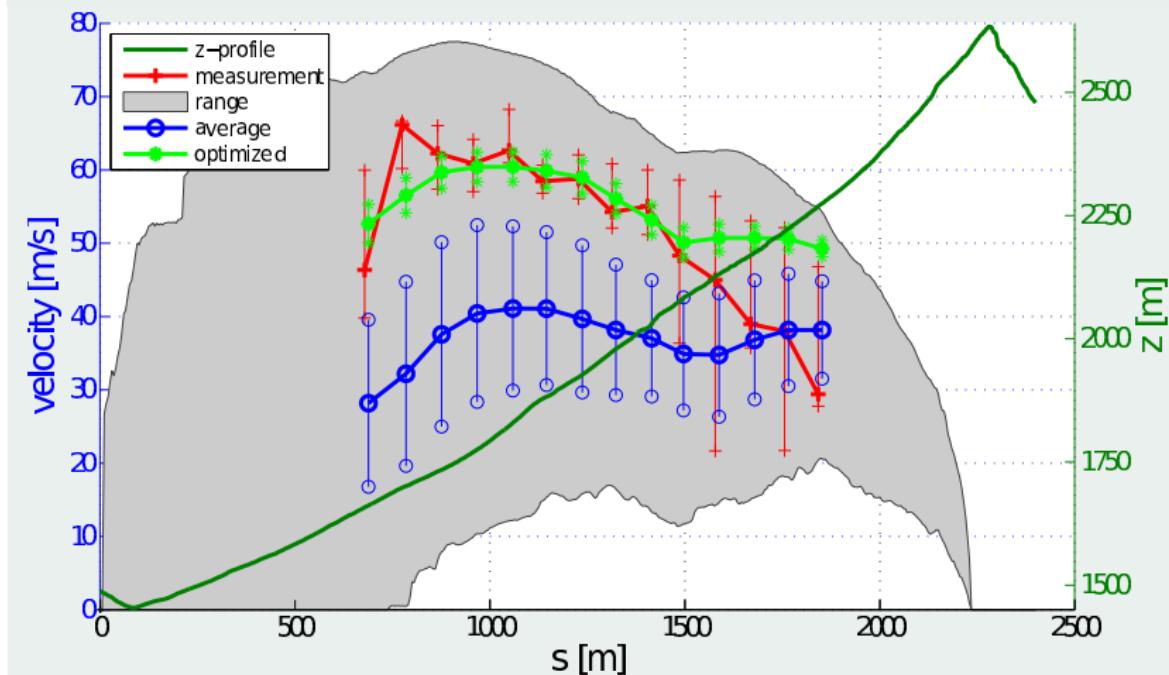
simulation input: topography, **release height (measurement uncertainty)**, model parameters ($\pm 50\%$)
 transformation in measurement system,
 comparison of multiple (10000) simulation runs,

Ryggfonn - avalanche simulation with monte carlo input variations



velocity evaluation and calibration/optimization with probabilistic methods

Vallée de la Sionne - avalanche simulation with monte carlo input variations



velocity range, average and best fit...

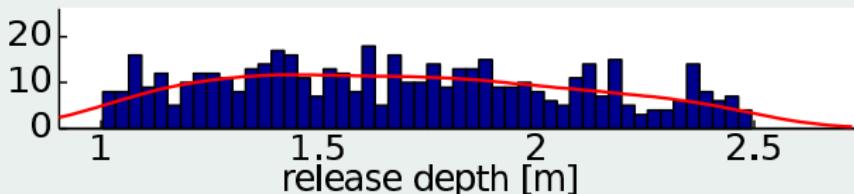
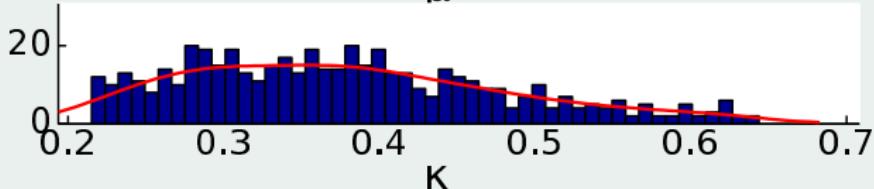
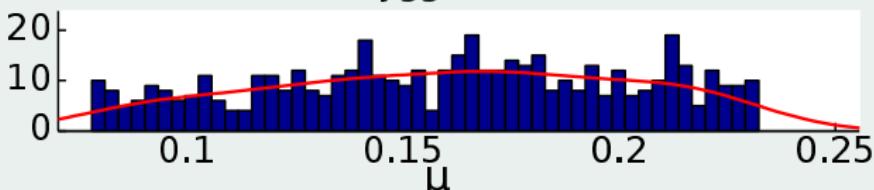
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simulation evaluation

Ryggfonn - optimized for best 10% simulation runs

Ryggfonn



distributions of optimized model input/parameters

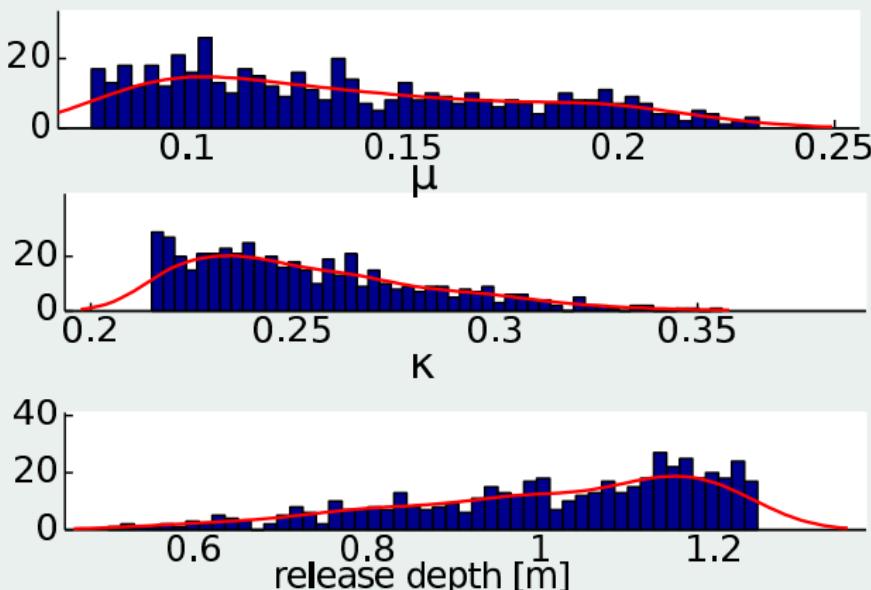
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simulation evaluation

Vallée de la Sionne - optimized for best 10% simulation runs

Vallee de la Sionne



distributions of optimized model input/parameters

laser scanning



lasser scanning

- terrestrial - airborne
- 3d topographic data
- digital elevation models
- mass balance
- ...

computational avalanche dynamics

ooooooooooooooooooooooo

field measurements - mass balance

experimental avalanche dynamics

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what is extreme?

Ryggfonn, Norway - scanning position



computational avalanche dynamics

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field measurements - mass balance

experimental avalanche dynamics

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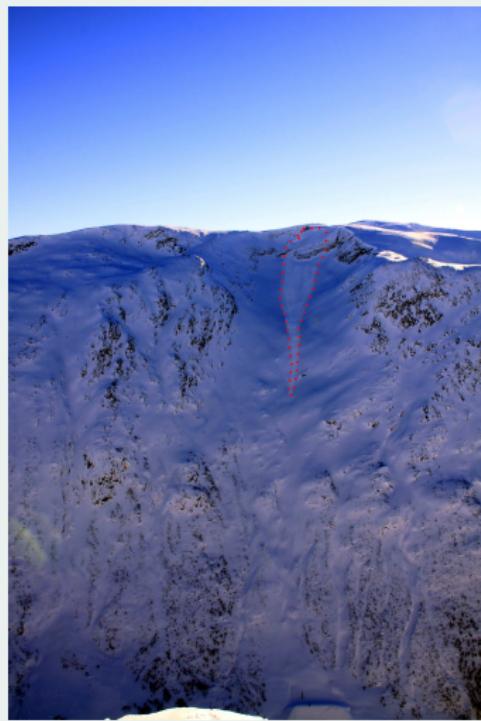
what is extreme?

avalanche release



artificially released slab

avalanche deposition



computational avalanche dynamics

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field measurements - mass balance

experimental avalanche dynamics

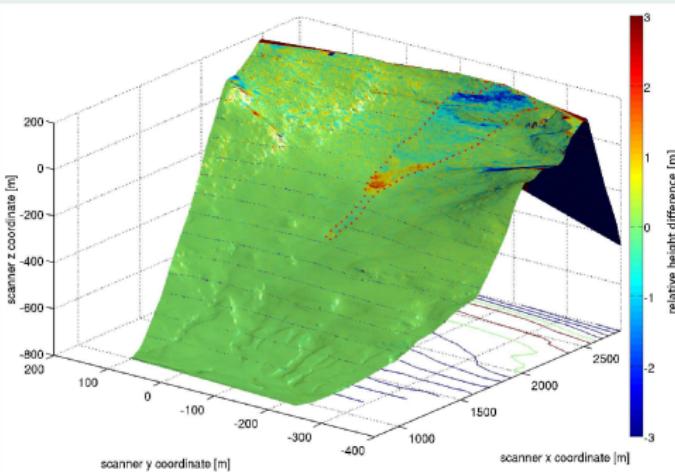
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what is extreme?

field measurement



data evaluation



volume $\approx 15000 \text{ m}^3$
areas of erosion and deposition

summary

- model independent method for the interpretation of avalanche simulations in three dimensional terrain with a broad applicability in model evaluation and comparison
- identify and quantify sources of uncertainties in dependence of input variations
- comprehensive evaluation of simulation results with velocity measurements
- improved calibration/optimization procedure of simulation software

computational avalanche dynamics

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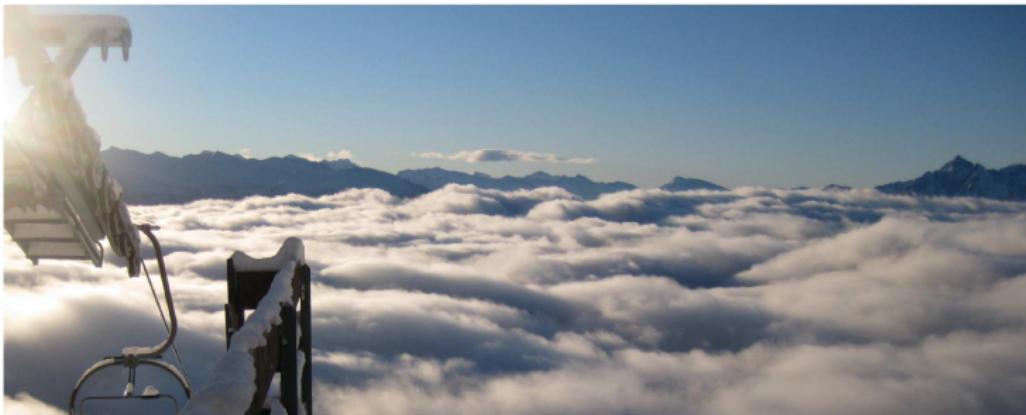
acknowledgements

experimental avalanche dynamics

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what is extreme?

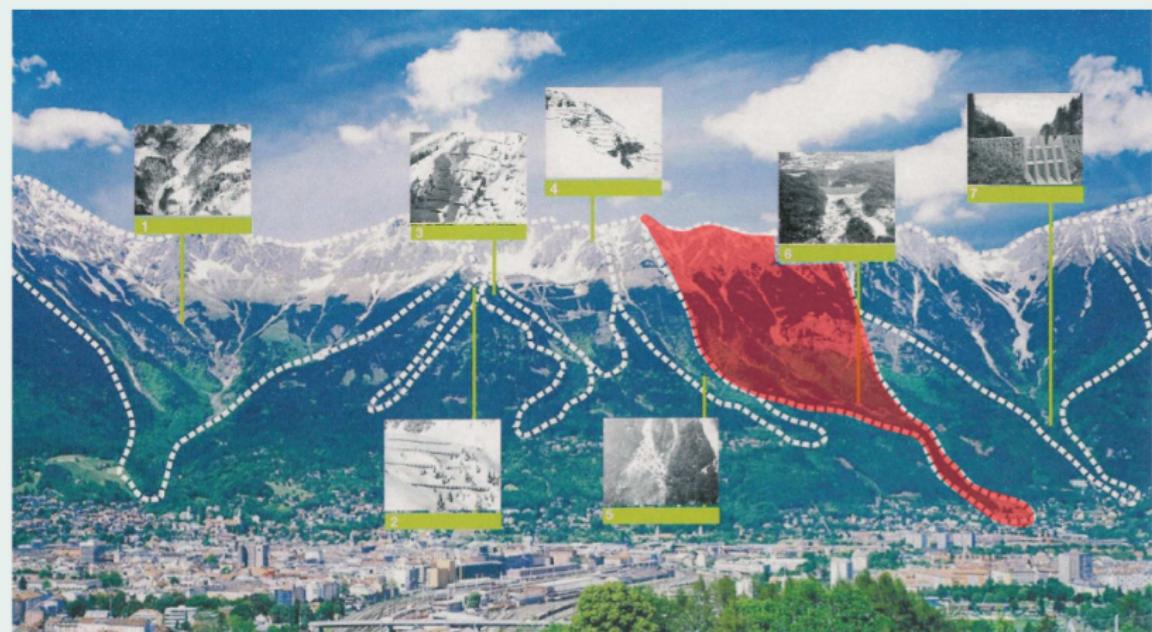
thank you for your attention



references (non exhaustive)

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- [6] P. Gauer, D. Issler, K. Lied, K. Kristensen, H. Iwe, E. Lied, L. Rammer, and H. Schreiber. On full-scale avalanche measurements at the Ryggefonna test site, Norway. *Cold Regions Science and Technology*, 49(1):39–53, 2007.
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- [11] S. B. Savage and K. Hutter. The motion of a finite mass of granular material down a rough incline. *Journal of Fluid Mechanics*, 199(1):177–215, 1989.
- [12] H. Schreiber, W. L. Randeu, H. Schaffhauser, and L. Rammer. Avalanche dynamics measurement by pulsed Doppler radar. *Annals of Glaciology*, Vol 32, 2001, 32:275–280, 2001.

Arzler Alm avalanche, Innsbruck, Tyrol, Austria



Avalanches north of Innsbruck

- 1: „Höttinger Graben“ avalanche
- 2: „Schneckengulf“ avalanche
- 3: „Gerlehner“ avalanche
- 4: „Rastlboden“ & „Gerschrofen“ avalanches,
- 5: „Penzenlahn“ avalanche,
- 6: „Arzler Alm“ avalanche,
- 7: „Mühlauer Klamm“ avalanche

historical events - e.g. 1923

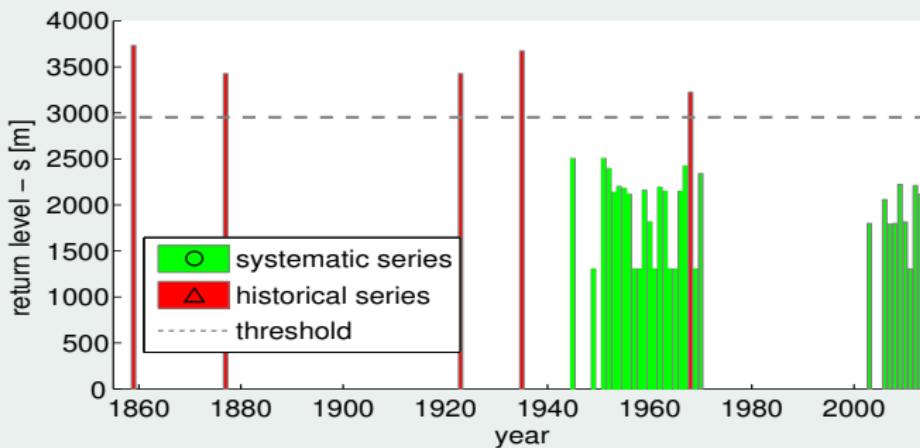


Phot. Richard Müller, Döbriach.

Ein Bild der Mühlauer Lawine vom Jahre 1923, die fast am gleichen Tage, am 3. Februar, aus dem Gebiete des Arzler Horns herabkam.

- what run out is expected for a certain return period?
- what return period can be assigned to an event?
- can extreme value analysis be helpful?

time series data



- horizontally projected runlength - return level s [m]
- **systematic series:** block maxima of continuous observation (30 y)
- **historical series:** observed events above limit (5 y)
- threshold: upper limit for all non observed events (121 y)

generalized extreme value (GEV) distribution

$$\begin{aligned} f_\theta(R) &= \frac{1}{\sigma} \left(1 - \xi \frac{(R - \mu)}{\sigma}\right)^{(1/\xi)-1} \exp\left(-\left(1 - \xi \frac{(R - \mu)}{\sigma}\right)^{1/\xi}\right), \quad \xi \neq 0, \\ F_\theta(R) &= \exp\left(-\left(1 - \xi \frac{(R - \mu)}{\sigma}\right)^{1/\xi}\right), \quad \xi \neq 0, \end{aligned}$$

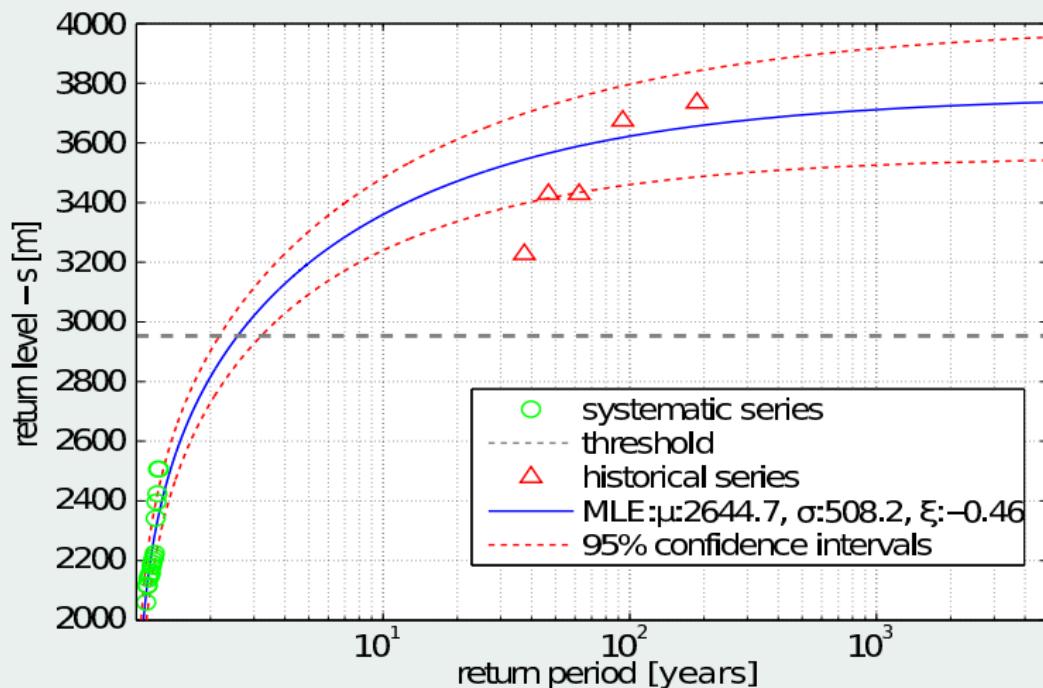
with $\theta = \{\mu, \sigma, \xi\}$: location μ , scale σ and shape ξ .

→ maximum likelihood estimate fit with customized likelihood function

$$L = \prod_i^s f(R_i|\theta) F(R_{lim}|\theta)^{n-h-s} \prod_j^h f(R_j|\theta),$$

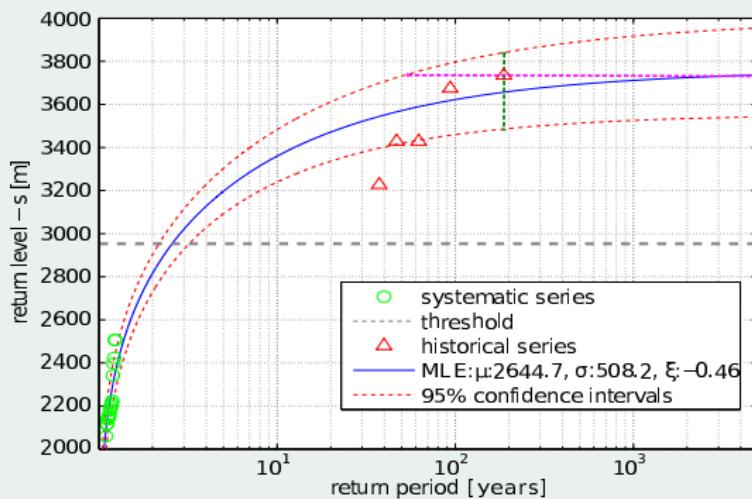
with n , the total length of the investigated series, the run out threshold R_{lim} , R_i the run out values of the systematic series of length s and R_j the run out values of the historical series of length h , respectively.

return level - return period



return period = 1 / exceedance probability

return level - return period - largest event 1859



- empirical observation: return level $s = 3735$ m return period 187 y
- GEV estimate for RP 187 y: 3657 m (3486 m to 3840 m)
- GEV estimate for RL $s = 3735$ my: 4313 y (52 y to ∞ y)
→ return period estimates difficult - return level estimates O.K.