



Vinh N. Dang & Calvin Whealton :: Risk & Human Reliability Group :: Paul Scherrer Institute

# **Extreme Flood Hazard Assessment**

## **Overview of a probabilistic methodology and its implementation for a Swiss river system**

5th Probabilistic Flood Hazard Assessment Research Workshop  
19-21 February 2020. USNRC, Rockville, MD

- Background & objectives
- Methodology
  - Hydrology
  - Structures & natural processes
  - Hydraulics
  - Probabilistic synthesis
- Hazard curves and uncertainties
- Findings
- Summary and outlook











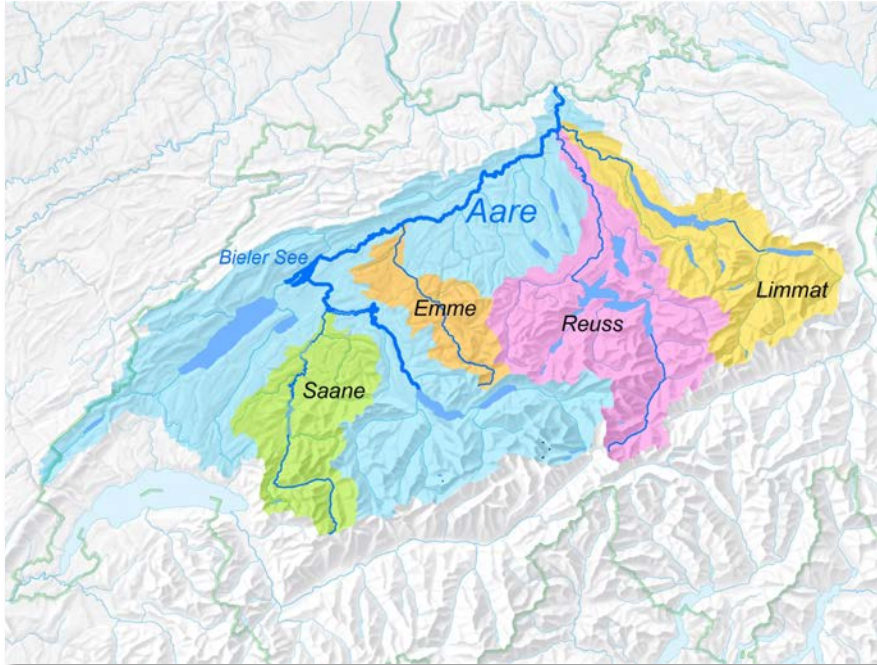
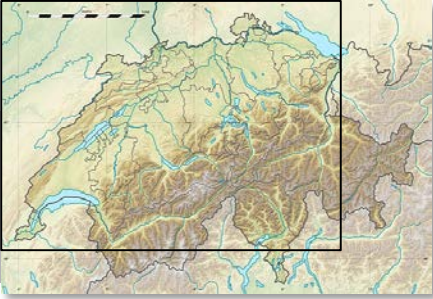
GEOLOGEN / INGENIEURE /  
GEOPHYSIKER /  
UMWELTFACHLEUTE




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# Aare River Watershed



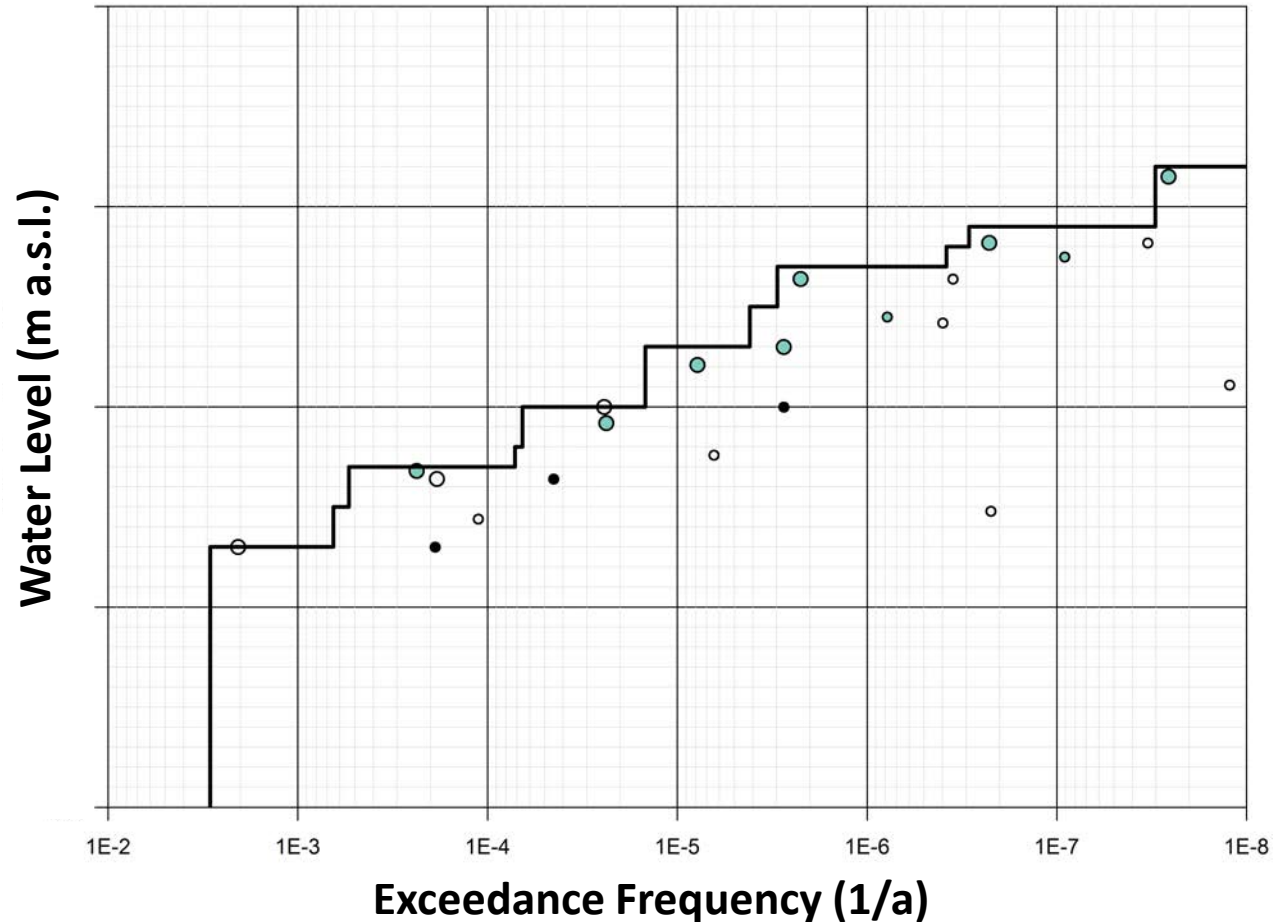
- Develop consistent methodology for probabilistic flood hazard assessment (PFHA)
  - Develop hydrological dataset for PFHA
  - Hazard assessment for selected sites on Aare
    - Frequency range of 1E-3 to 1E-7/a
    - Including conditional events
  
- The Aare catchment
  - 295 km (183 mi) to Rhine (at Koblenz, CH)
  - Catchment area 17'675 km<sup>2</sup> (6'870 sq. mi.)
    - 43% of surface area of Switzerland
    - High alpine to farmland and urban
    - 4 major subcatchments
    - Highly engineered system

## Hazard Curve

### Hazard measure

➤ Elevation head  
(in m.a.s.l.)

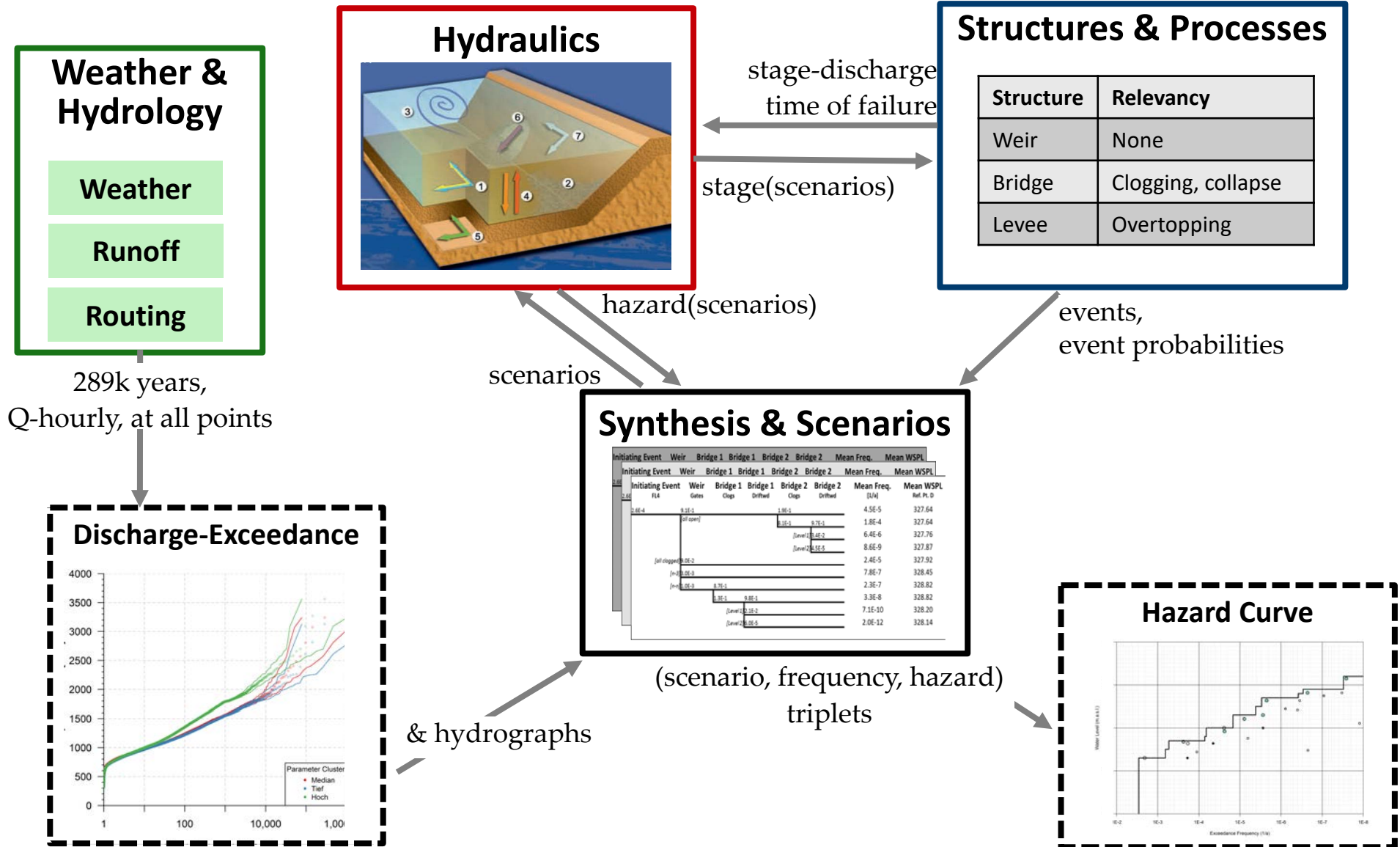
- Total head
- Velocity
- Shear stress



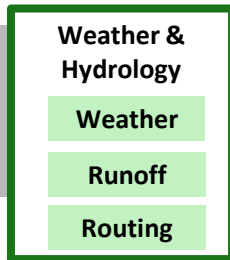
Input: triplets (scenario, frequency, hazard level)



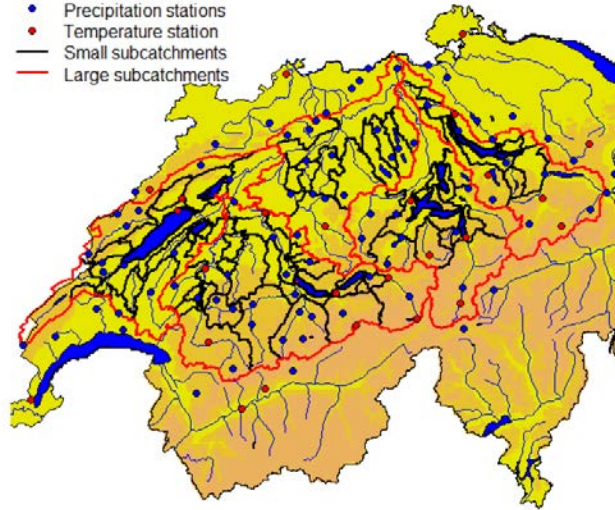
# Methodology Overview



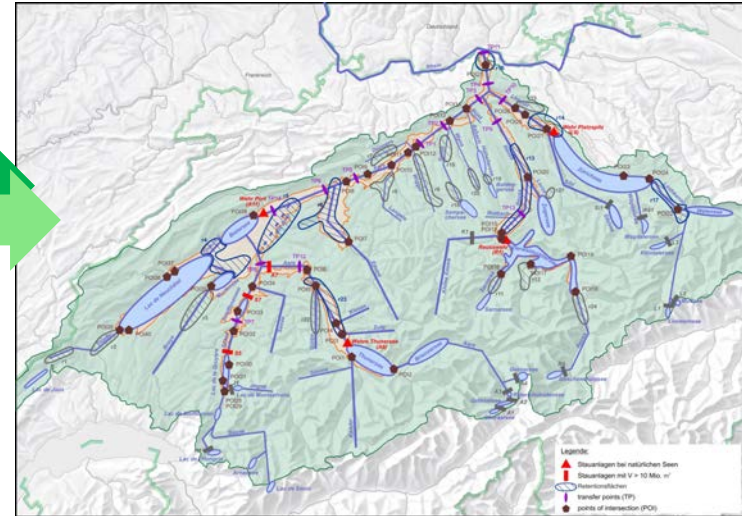
# Hydrologic Modeling Chain



- Precipitation stations
- Temperature station
- Small subcatchments
- Large subcatchments



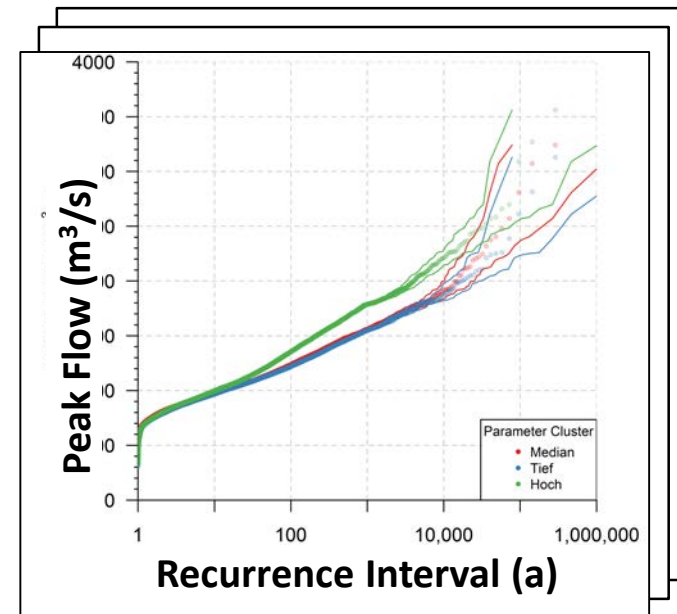
Source: EXAR Detailbericht A, Figure 1



Source: EXAR Phase A Bericht, Fig. 3

Main outputs for next PFHA steps:

- discharge-exceedance curves in the system
- 289,000 years with 3 HBV parameter sets (hourly resolution)



## Weather

**GWEX:** mean average precipitation and temperature (MAP & MAT)

- Precipitation (105 stations) modeled using Extended GPD distribution
- Temperature (26 stations) modeled as MAR(1) process
- Spatially disaggregated to catchments using Thiessen polygons
- Temporally disaggregated from 3-days to 1-hr using meteorological analog

## Runoff

**HBV:** hourly runoff values for each elementary catchment

- Semi-distributed catchment model
- 89 elementary catchments in the system (40 ungauged)
- Cluster analysis used to define lower, median, and higher simulated floods

## Routing

**RS Minerve:** hourly flow values at transfer points

- Aggregated elementary catchment runoff to flow in main tributaries and Aare
- Includes lake regulation
- Calibrated to 2005 flood and validated to 2007 flood (both ~100-yr return period)

# Probabilistic Scenario Modeling

scenario,  
frequency,  
hazard level

	Scenario	
	<i>Initiating event</i>	<i>Top events</i>
Hydraulic simulation	<b>Representative hydrograph</b>	<ul style="list-style-type: none"> <li>• <b>Natural process</b></li> <li>• <b>Structure-related</b> induced, correlated, independent</li> </ul>
Quantification (estimation of probabilities)	<b>Discharge range frequency</b>	<b>Event probabilities</b>
Basis	Discharge exceedance frequency curve	Fragilities, estimated occurrence, ...



# Event Tree

Discharge range

Hydrograph

Initiating Event FL4	Weir Gates	Bridge 1 Clogs	Bridge 1 Driftwd	Bridge 2 Clogs	Bridge 2 Driftwd	Mean Freq. [1/a]	Mean WSPL Ref. Pt. D
2.6E-4	9.1E-1			1.9E-1		4.5E-5	327.64
	[all open]			8.1E-1	9.7E-1	1.8E-4	327.64
				[Level 1]	3.4E-2	6.4E-6	327.76
				[Level 2]	4.5E-5	8.6E-9	327.87
	[all clogged]	9.0E-2				2.4E-5	327.92
	[n-3]	3.0E-3				7.8E-7	328.45
	[n-n]	1.0E-3	8.7E-1			2.3E-7	328.82
			1.3E-1	9.8E-1		3.3E-8	328.82
			[Level 1]	2.1E-2		7.1E-10	328.20
			[Level 2]	6.0E-5		2.0E-12	328.14

IE Freq.

Event Probabilities

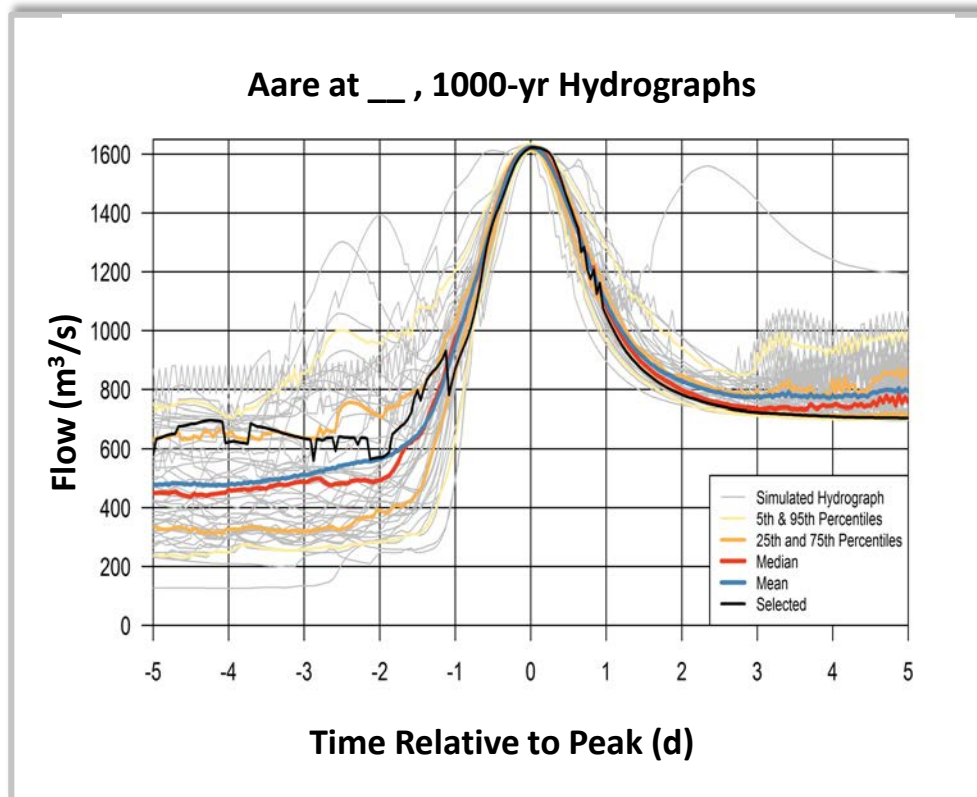
Scen. Freq

Hazard

Hydraulic  
Simulation

# Hydrograph selection

- Each initiating event is a discharge range with a frequency.
- To compute the hazard, a hydrograph is needed



## ➤ Three discharge ranges

Discharge range IE	Freq. [/yr]	Qpeak Fexc [ /yr]
FL3	~ 3E-3	1E-3
FL4	~ 3E-4	1E-4
FL5	~ 3E-5	1E-5

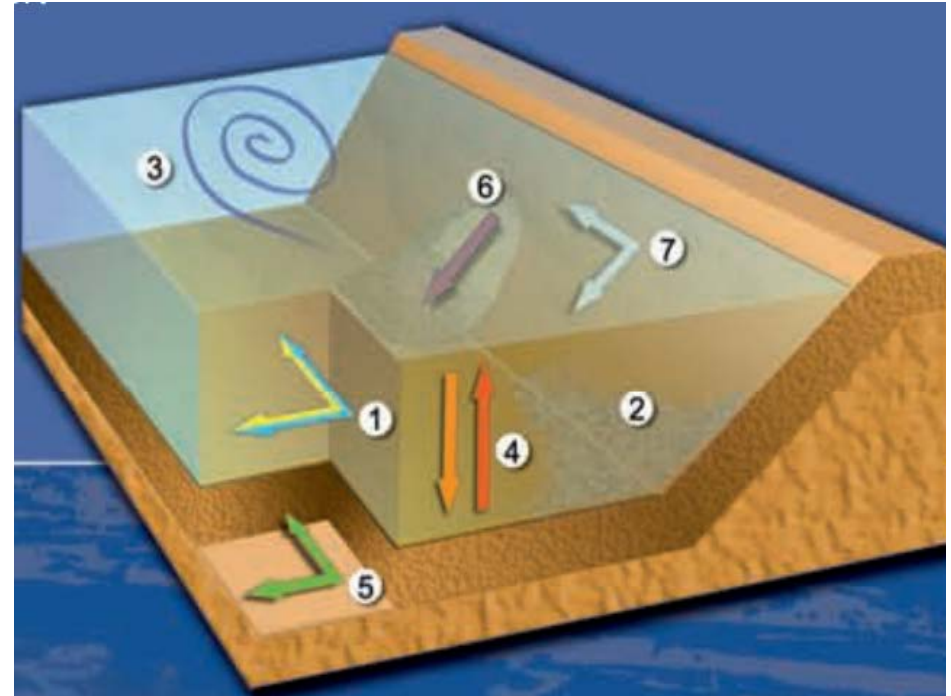
## ➤ More difficult cases: confluence, peak-duration

## Relevance criteria

- 1) ability to change downstream frequencies or hydrograph behavior
- 2) impact on hazard at local assessment site

- Weirs/Dams
  - Waves from collapse  
( $Q \rightarrow h[\text{reservoir}] \rightarrow P$ )
  - Backwater from closed/clogged gates  
(scoping  $P$ )
- Levees
  - ( $Q \rightarrow h \text{ at levee} \rightarrow P$ )
  - New flowpaths
  - Retention changing hydrograph timing  
or peak
- Landslides
  - (higher water table  $\rightarrow P$ )
  - Backwater from channel blockage
  - Local flowpaths
- Driftwood
  - ( $Q \rightarrow \text{flow at structure} \rightarrow P$ )
  - Backwater
  - Local flowpaths

- 2-D model of reach using BASEMENT v3 (<https://basement.ethz.ch/>)
  - Saint-Venant equations
  - Morphology model
  - Main inputs: DEM and roughness values
- Parameters calibrated using surrogate modeling
- Morphology capabilities used for small set of scenarios
  - bed load transport, aggradation, resuspension



Source: <https://basement.ethz.ch/about.html>

# Scenarios to hazard curves...

Initiating Event	Weir	Bridge 1	Bridge 1	Bridge 2	Bridge 2	Mean Freq.	Mean WSPL
Initiating Event	Weir	Bridge 1	Bridge 1	Bridge 2	Bridge 2	Mean Freq.	Mean WSPL
Initiating Event	Weir	Bridge 1	Bridge 1	Bridge 2	Bridge 2	Mean Freq.	Mean WSPL
FL4	Gates	Clogs	Driftwd	Clogs	Driftwd	[1/a]	Ref. Pt. D
2.6E-4	9.1E-1			1.9E-1		4.5E-5	327.64
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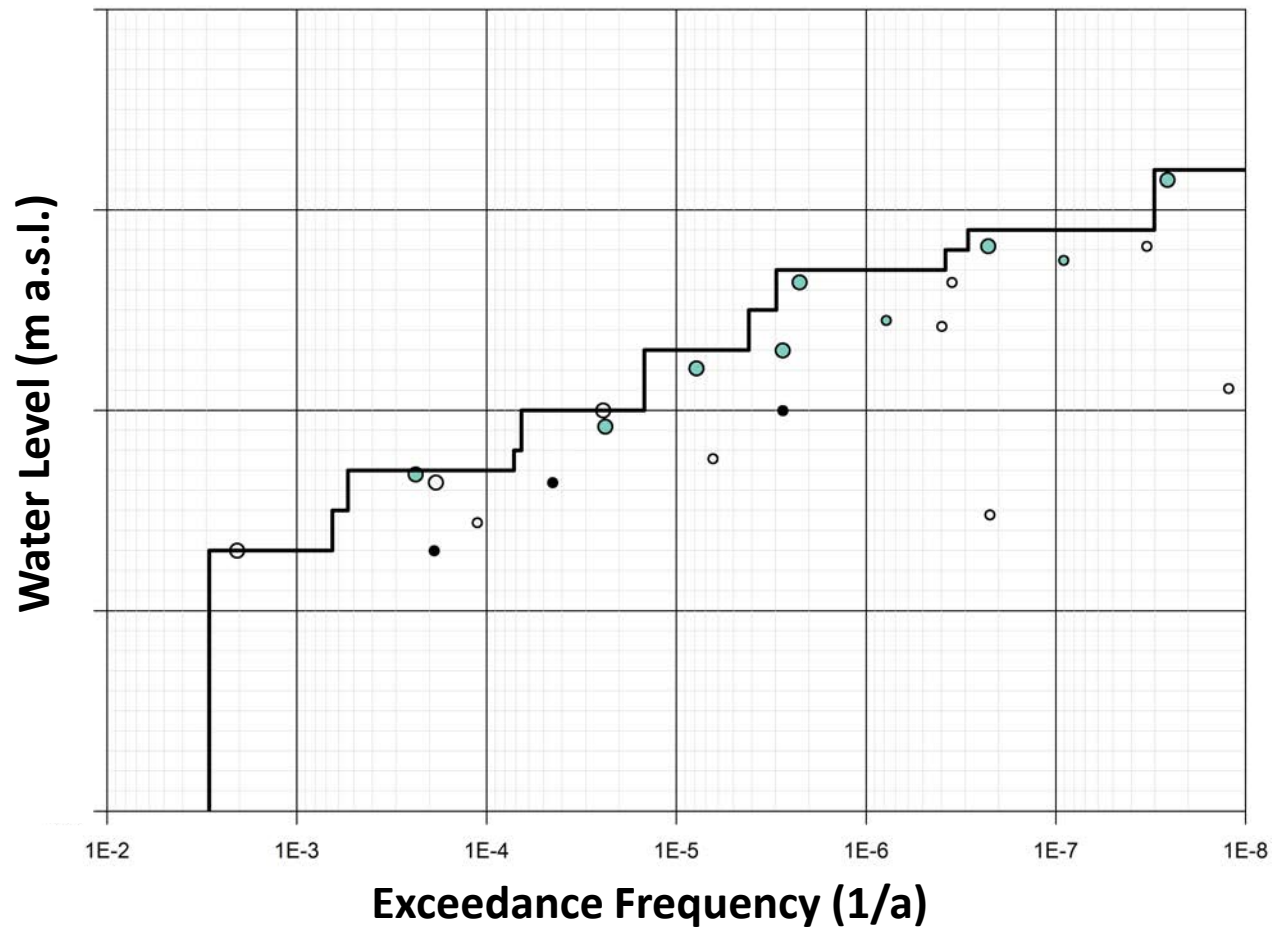


# Hazard Curve

*Point estimate hazard curve:*

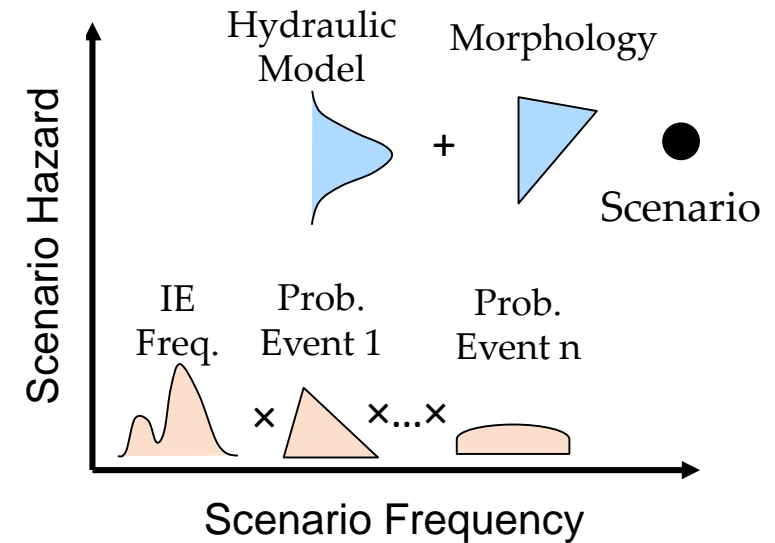
*Exceedance plotted from scenario points at (mean frequency, mean hazard value)*

## Hazard Curve (Site 5)



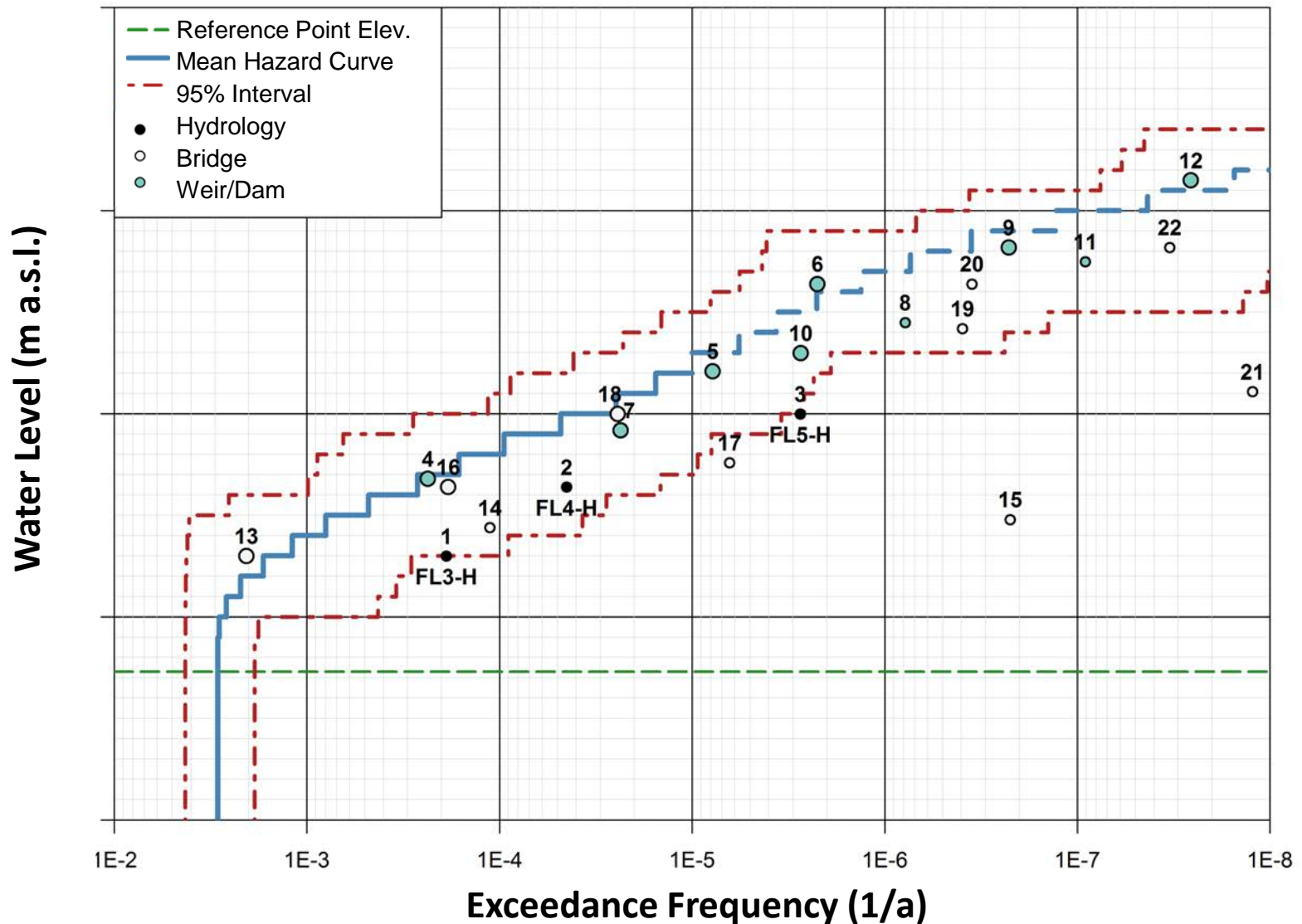
# Hazard Curve Uncertainty

- Uncertainties in frequency space
    - Initiating Event Frequency (HBV parameter set curves)
    - Probabilities (uncertainty of failure models, clogging models, etc.)
  - Uncertainties in hazard space
    - Water Levels (water levels from 2-D model and morphology)
- Need to transform hazard space uncertainty into frequency space
- Monte Carlo approach
    - Each sample of the set of uncertainty distributions => realization of the 3 event trees
    - 5000 samples => 5000 hazard curves
    - Statistics obtained from 5,000 curves : mean curve, frequency quantiles



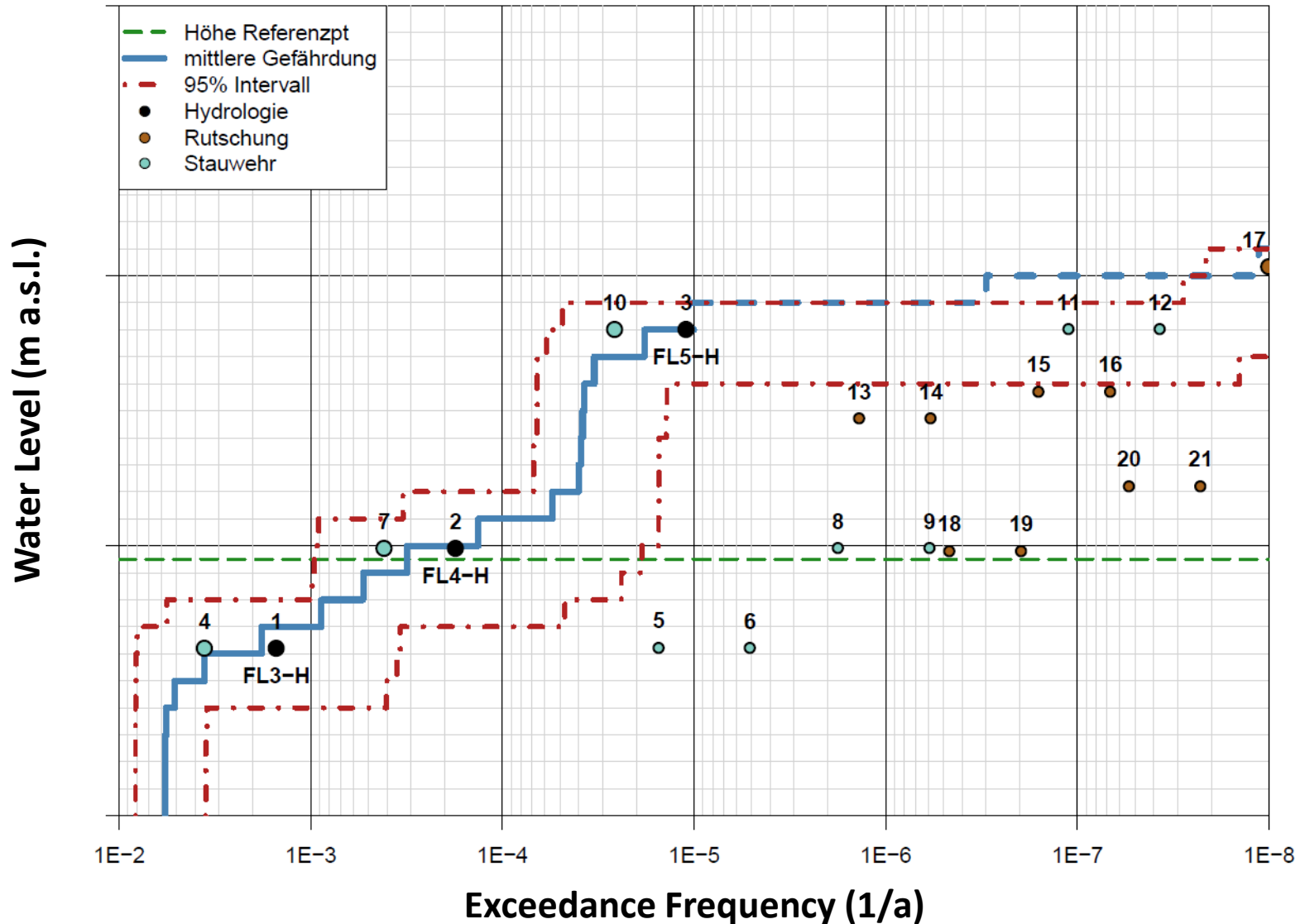
# Hazard Curve: Mean & Envelope from Uncertainty

## Hazard Curve (Site A)



# Hazard Curve: Mean & Envelope from Uncertainty

## Hazard Curve (Site B)



# Core findings – flood hazard

## Key Findings:

- Dominant sources of site hazard “hydrological” or “natural processes + engineered structures”
- Also dependent on frequency range of interest
- Some scenarios and results on hazard below 1E-5/yr but incomplete picture due to lack of credible estimate for 1E-6/yr hydrological flood

## Site-specific Findings

- For the assessed sites, levee failures are not dominant (and overtopping more important than duration/volume)
- No dominant scenarios with landslides (co-occurrence with flood event is low)
- At multiple sites, driftwood volume and clogging are important contributors
- Flood management failure important to risk (at extreme end of hazard curve) at one site.



# Summary & Outlook

- State-of-the-art models in hydrologic chain, in hydraulics, structural analysis
- Experts in the relevant disciplines periodically reviewed methodology and implementation and provided suggested modifications and verifications
- Interdisciplinarity enhanced verification and plausibility checks throughout project

- Measurement records essential but some difficulties (e.g. representation of extreme floods for calibration, engineering of the catchment)
- Discharge exceedance curves were judged to be plausible
- More hydrological parameter sets recommended to address (HBV) uncertainty better – at lowest frequencies
  - Rare/extreme hazard is based on top 0.1% of annual maxima (1E-3/yr, 300 events, 300'000 annual maxima)
- 3 discharge ranges (IEs) sufficient to characterize hazard

## Outlook

- Better characterization driftwood generation and retention, as well as clogging is required
- Flood management strategy and implementation during extreme floods
  - Modeling
  - Strategy
- Computational challenge for morphology
- Scope: Upper catchment floods (mountain regions) ; Rhine

My thanks go to the EXAR  
Team



Andres N., Badoux A., Hegg Ch. (Ed.) 2019: Grundlagen Extremhochwasser Aare. Hauptbericht Projekt EXAR. Methodik und Resultate. (*Bases for the extreme flood hazard on the Aare River. Main report of project EXAR.*) Swiss Federal Institute for Forest, Snow and Landscape Research WSL. (in German, forthcoming.)

### EXAR Detailed reports (in English)

- Staudinger, M., Viviroli, D. 2019: Extremhochwasser an der Aare. Detailbericht A Projekt EXAR. Hydrometeorologische Grundlagen [EN: *Hydrometeorological Elements*]. Universität Zürich. Zürich: 382 S.
- Sutter, A., Karrer, T., Whealton, C. 2019: Extremhochwasser an der Aare. Phase B. Detailbericht C: Rutschungen und Schwemmholz [EN: *Landslides and Driftwood*]. ARGE GEOTEST-HZP-IUB. Zollikofen: 85 S. [Landslides and part of Driftwood in English]
- Dang, V.N., Whealton, C. 2019: Extremhochwasser an der Aare. Detailbericht G Projekt EXAR. Ereignisbaumanalyse und Gefährdungskurven [EN: *Event Trees and Hazard Curves*]. Paul Scherrer Institut PSI. 113 S.

[Journal Articles in Preparation]



## References and further reading

### GWEX

- Evin, G.; Favre, A.C.; Hingray, B. (2018). Stochastic generation of multi-site daily precipitation focusing on extreme events. *Hydrology and Earth System Sciences* 22(1):655-672. doi: 10.5194/hess-22-655-2018

### HBV

- Bergström, S. (1992). The HBV Model: Its Structure and Applications, Swedish Meteorological and Hydrological Institute (SMHI), Hydrology, Norrköping, 35 pp.
- Seibert, J.; Vis, M.J.P., 2012: Teaching hydrological modeling with a user-friendly catchment-runoff model software package. *Hydrology and Earth System Sciences* 16: 3315-3325. doi:10.5194/hess-16-3315-2012

RS Minerve ([www.crealp.ch/fr/accueil/outils-services/logiciels/rs-minerve.html](http://www.crealp.ch/fr/accueil/outils-services/logiciels/rs-minerve.html))

- García Hernández, J., Paredes Arquiola, J., Foehn, A., Roquier, B., 2016: RS MINERVE – Technical Manual v2.7. For Software version 2.4.2.0. , Centre de recherche sur l'environnement alpin (CREALP); HydroCosmos SA [manuals in English].

BASEMENT ([basement.ethz.ch/about.html](http://basement.ethz.ch/about.html))

- Versuchsanstalt für Wasserbau, Hydrologie und Glaziologie (VAW) der ETH Zürich (2019). BASEMENT v3 Reference Manual [in English].

# PMP/PMF vs. Simulation

- EXAR hydrologic modeling chain is not based on the PMP/PMF concept
- Several studies have computed PMP/PMF for smaller catchments (table below)
- Maximum simulated floods from EXAR are close to PMP/PMF estimates, with larger differences being for the small catchments that have more variable precipitation distributions
- EXAR simulations are not implausible compared to PMP/PMF

River, location	Study	TP or catchment	PMF [m <sup>3</sup> /s]	Q <sub>max</sub> GWEX [m <sup>3</sup> /s]
Aare, Bern	Felder&Weingartner2016,2017, Zischg et al.2018	SSASSB	1296	1250
Emme, Wiler	Felder et al.2019	SSKSSD	1388	1356
Kander, Hondrich	Felder et al. 2019	KanHon	830	1050
Sihl, Zürich	Kienzler et al.2015	SihZue	975	772

EXAR Detailbericht A, Table 4

Felder G. & Rolf Weingartner R. (2016) An approach for the determination of precipitation input for worst-case flood modelling. *Hydrological Sciences Journal*, 61:14, 2600-2609. doi: 10.1080/02626667.2016.1151980

Felder G., Weingartner R. (2017) Assessment of deterministic PMF modelling approaches. *Hydrological Sciences Journal*, 62:10, 1591-1602. doi: 10.1080/02626667.2017.1319065

Felder G., Paquet E., Penot D., Zischg A., Weingartner R. (2019) Consistency of Extreme Flood Estimation Approaches. *J. Hydrol. Eng.*, 24(7): 04019018. doi: 10.1061/(ASCE)HE.1943-5584.0001797

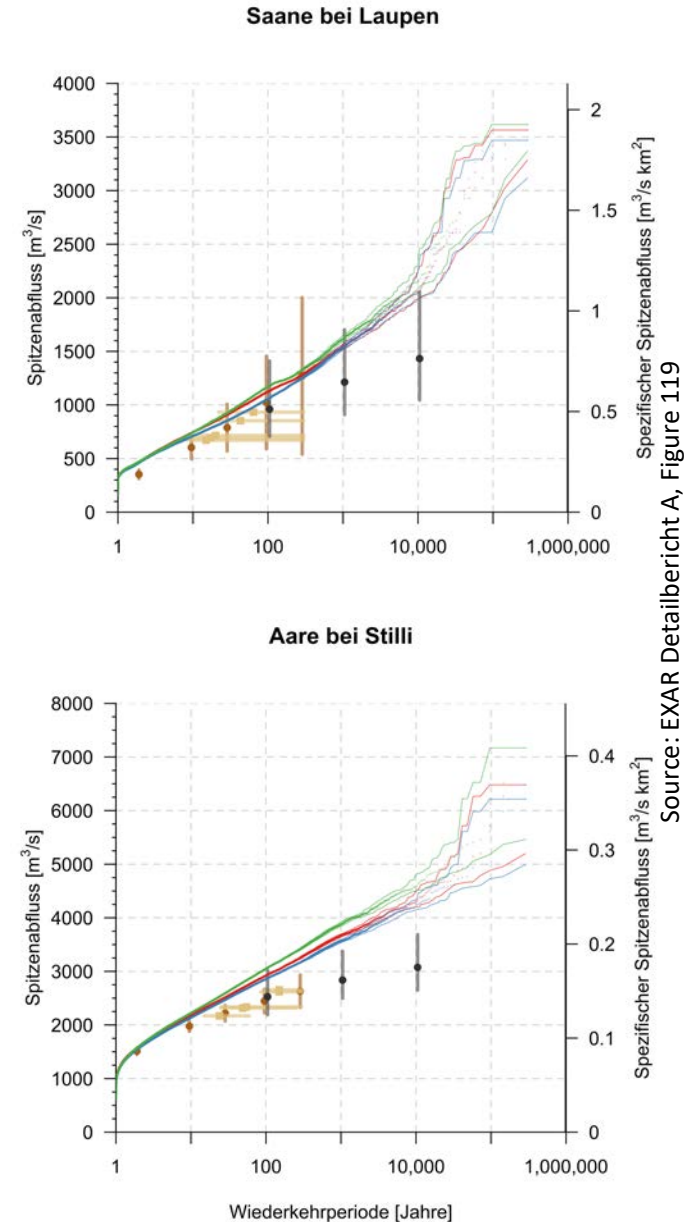
Kienzler P., Andres N., Näf-Huber D., Zappa M. (2015) Herleitung extremer Niederschläge und Hochwasser im Einzugsgebiet des Sihlsees für einen verbesserten Hochwasserschutz der Stadt Zürich. *Hydrologie und Wasserbewirtschaftung HyWa*, 59, 48-58. doi: 10.5675/HyWa\_2015,2\_1

Zischg A. P., Felder G., Weingartner R., Quinn N., Coxon G., Jeffrey N., Freer J., Bates P. (2018) Effects of variability in probable maximum precipitation patterns on flood losses. *Hydrol. Earth Syst. Sci.*, 22, 2759–2773. doi: 10.5194/hess-22-2759-2018



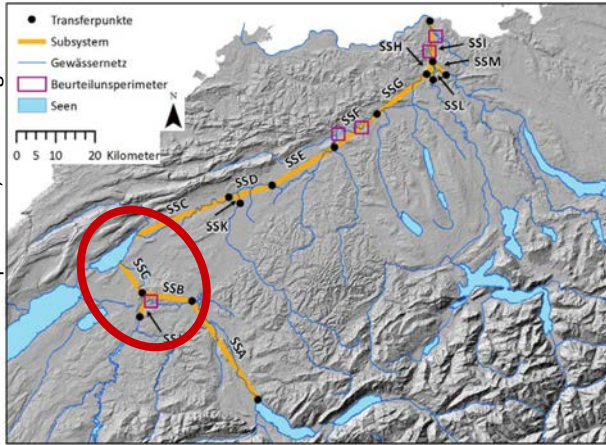
# Comparison of Simulation & Gauged Record

- Many transfer points show good agreement between the gauged record, extrapolations from the gauged record, and the simulations within that range
  - Aare above Saane confluence
  - Major Tributaries: Emme, Reuss, Limmat
- A few transfer points (Saane Outlet, Aare after Wasserschloss) show markedly higher simulation than extrapolation values (figures right)
  - Superposition is very strong in the extreme events, with over 95% being common
  - Superposition is not typically estimated for single gauge extrapolations



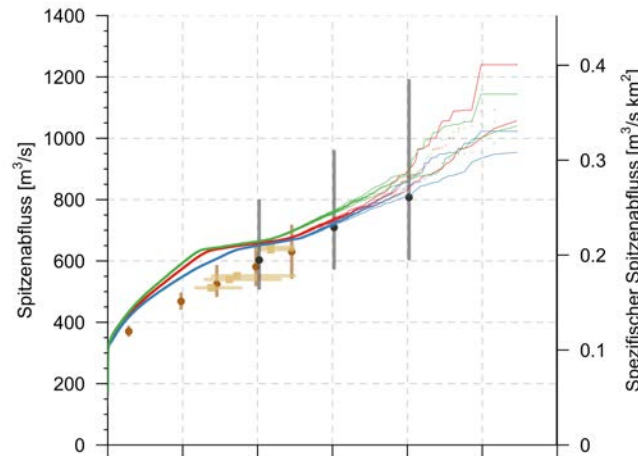
# Upper Aare: Simulation vs Gauge

Source: EXAR Hauptbericht, Abbildung 4

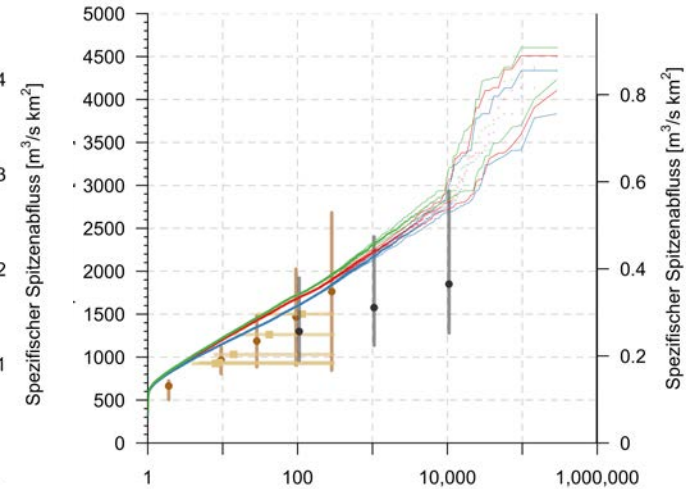


- Aare at Halen (SSASSB) is close to EPFL estimate
- Saane (SSJSSB) shows steeper trend than prediction
- Outflow of Bielersee is on low end of EPFL estimate

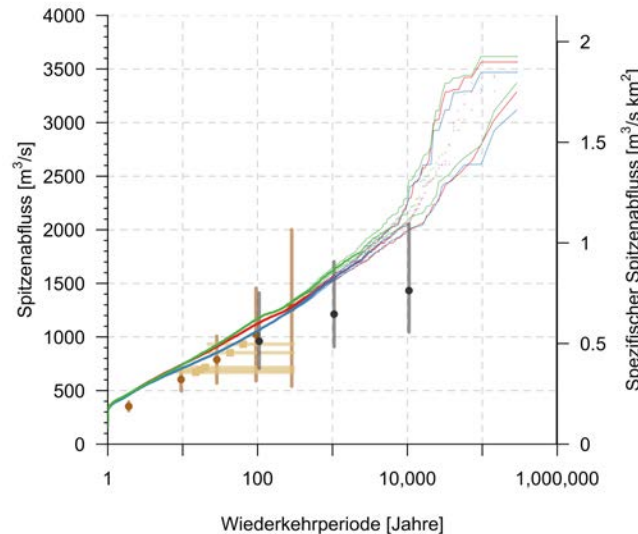
Aare bei Halen



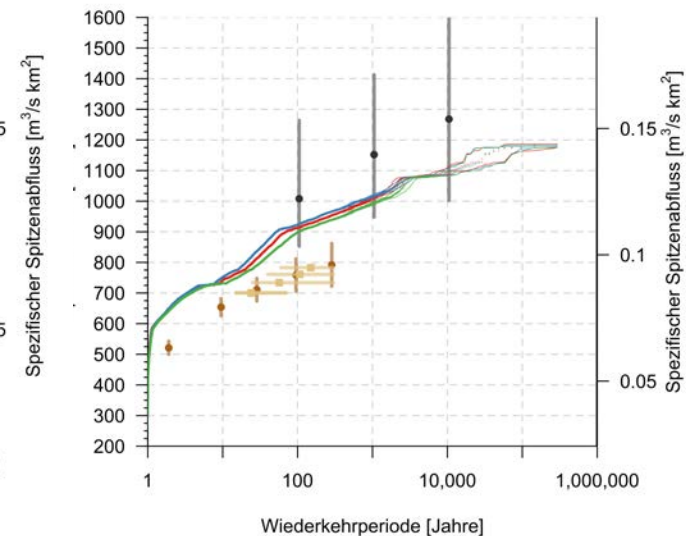
Aare bei Golaten



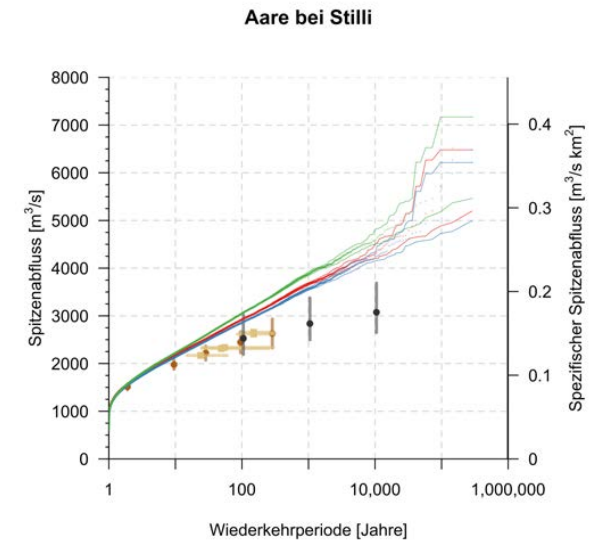
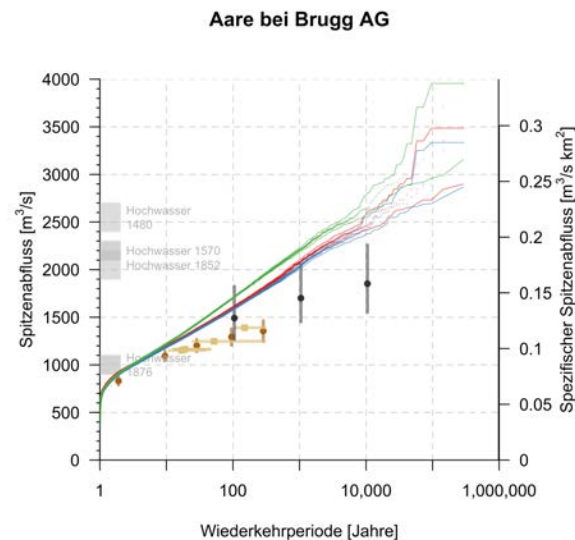
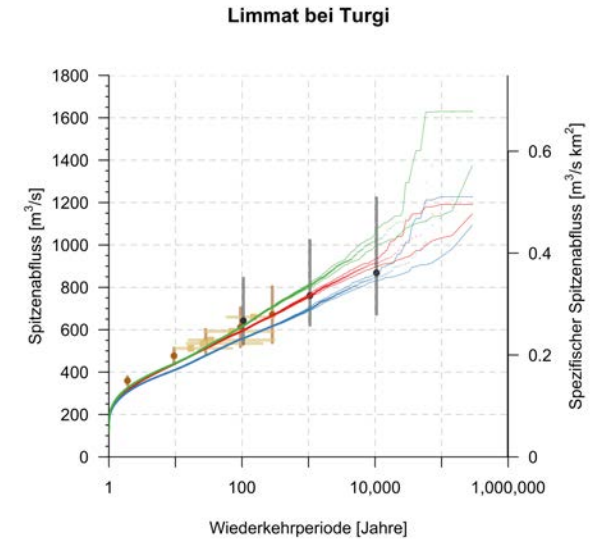
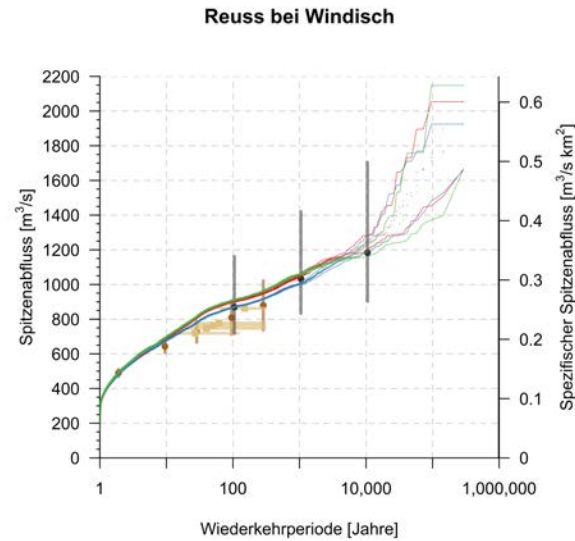
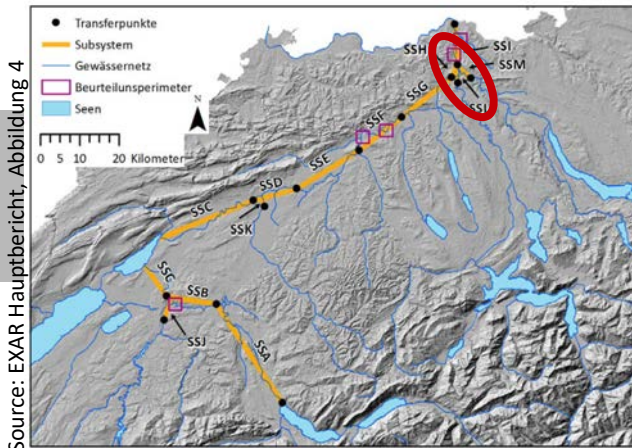
Saane bei Laupen



Ausfluss Bielersee



# Lower Aare: Simulation vs Discharge

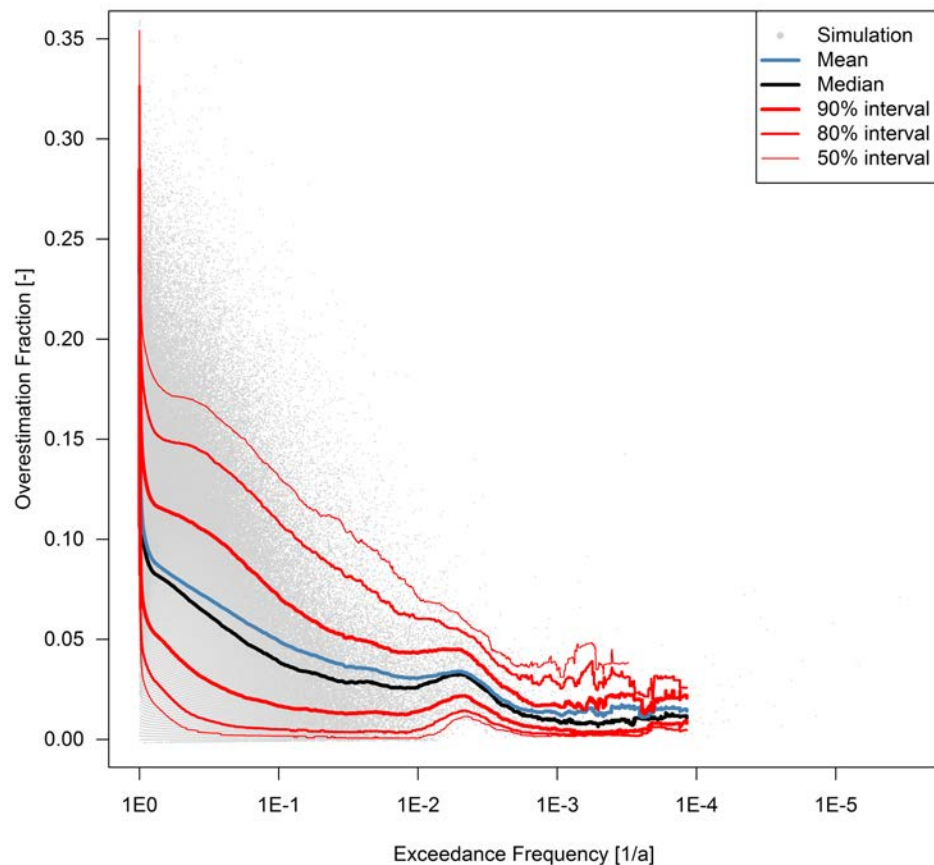


- Reuss and Limmat tributaries very close to estimates
- Aare shows steeper slope, diverges after 100-yr flood
- After confluence, major differences in estimates and simulation
- Analysis shows +95% superposition is common in extreme events

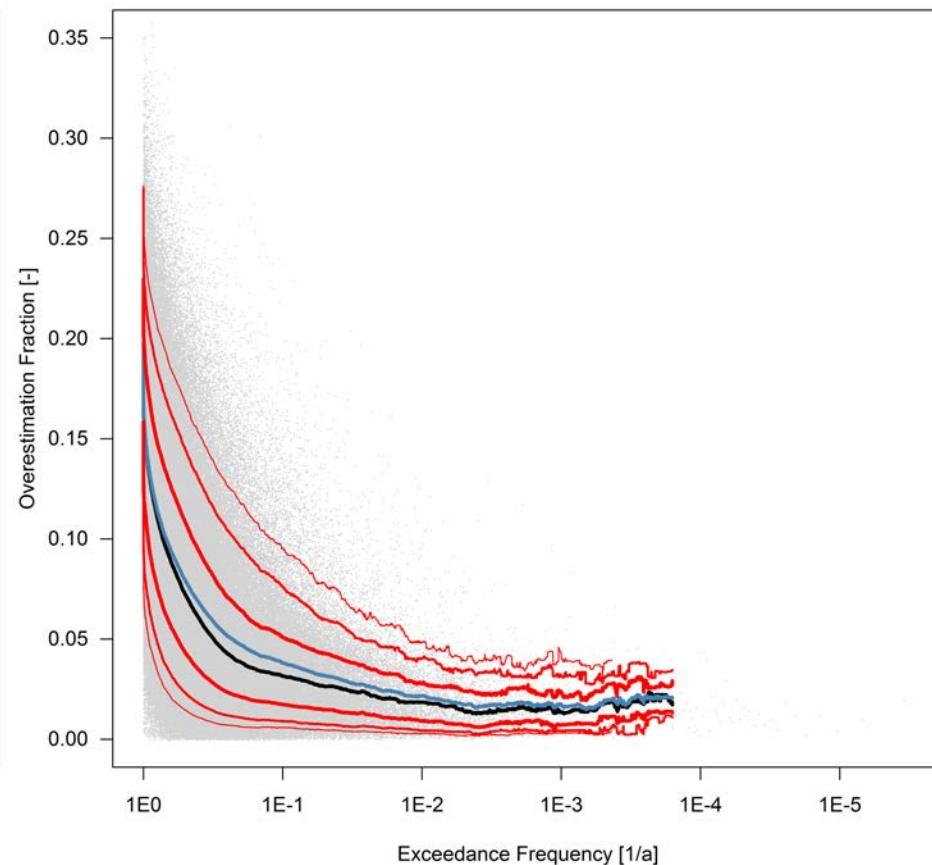
Source: EXAR Detailbericht A, Figure 119

# Superposition of Flood Peaks

## Aare & Saane Confluence



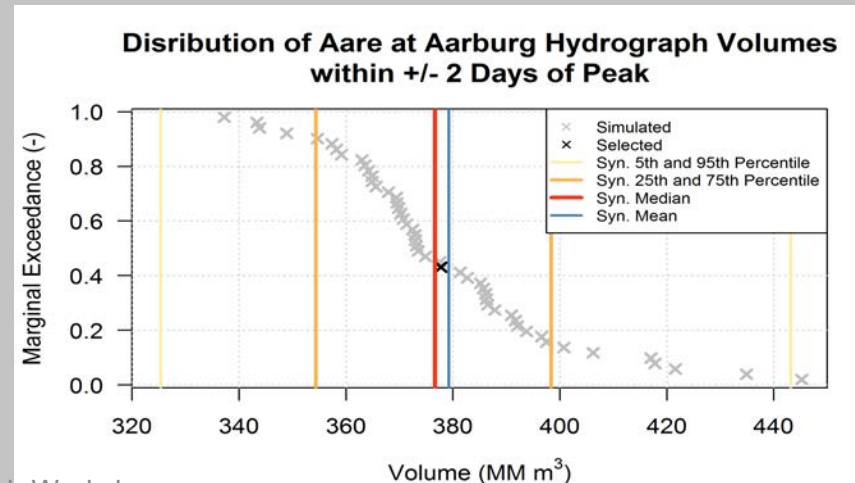
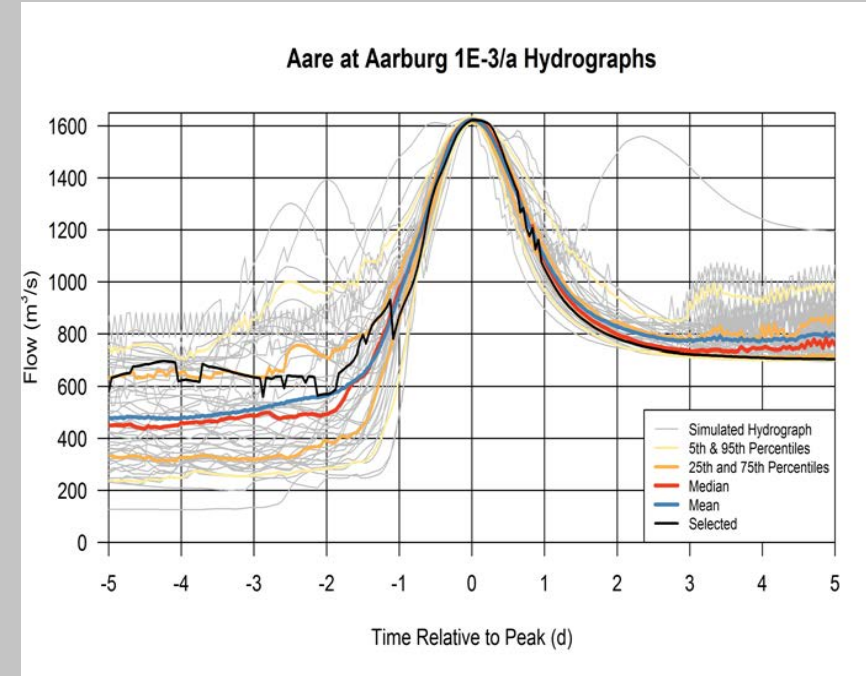
## Aare, Reuss & Limmat Confluence





# Hydrograph Selection

- Preliminary initiating events chosen to be 1E-3, 1E-4, and 1E-5/a floods (peak flow exceedance criteria)
- Representative or typical hydrographs had to be chosen
  - Project intended to provide best estimate
  - Avoids overly conservative approximations
- Failures and hazard levels dominated by peak flow mechanisms
  - Possible to select hydrograph based on volume, e.g. for levees
  - Analysis showed that most instances of volume/duration failure also peak flow failure





# Driftwood Model

$$P(\text{clog volume}) = P(\text{clog initiates}) * P(\text{wood volume})$$

- P(clog initiates) from Shalko's lab experiments

*depends on flow at site, number of pillars in the channel, distance between water surface and bridge deck, etc*

- P(wood volume) determined from the expected range of driftwood volume

*GIS analysis with factors for 30-year and 300-year driftwood volumes used to determine 5<sup>th</sup> and 95<sup>th</sup> percentiles of lognormal distribution*

Conservative principle applied (Bruttoprinzip)

- Lakes retain all driftwood from upstream
- No retention along the Aare River outside of lakes
- Some retention attributed to tributaries

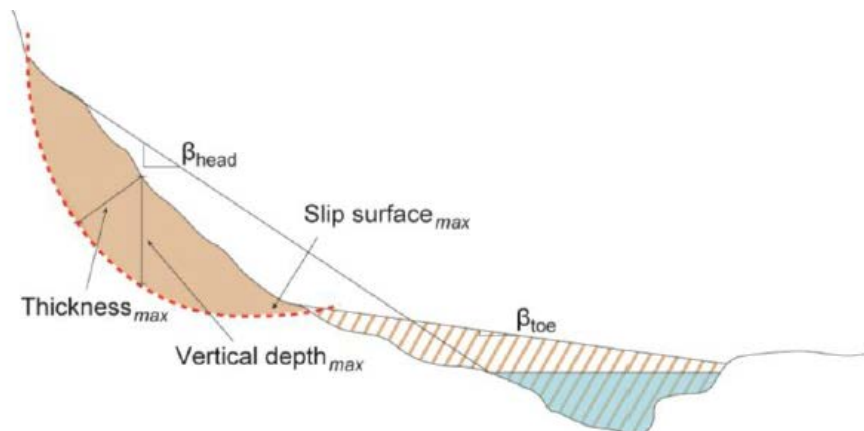
In event tree model, probability of clogging at downstream structures depends on whether clogging occurred at upstream structures that are in the same event tree

General frequency determined using a hazard mapping approach

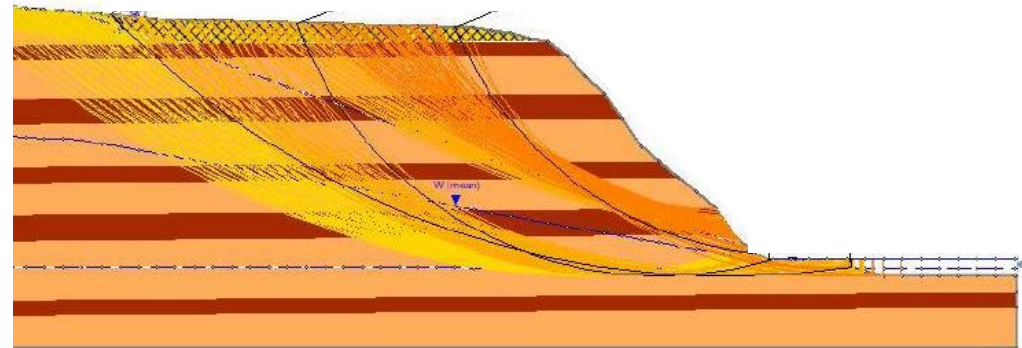
Method of slices with numerical model (Slide2D) for water table (WT) sensitivity

- Hazard mapping frequency assumed WT ~ 13.5 deg
- Elevated WT of 27 deg assumed for EXAR events
- Most landslides not sensitive to WT (<4x change in frequency)

## Estimation of Maximum Volume and Intrusion into Channel



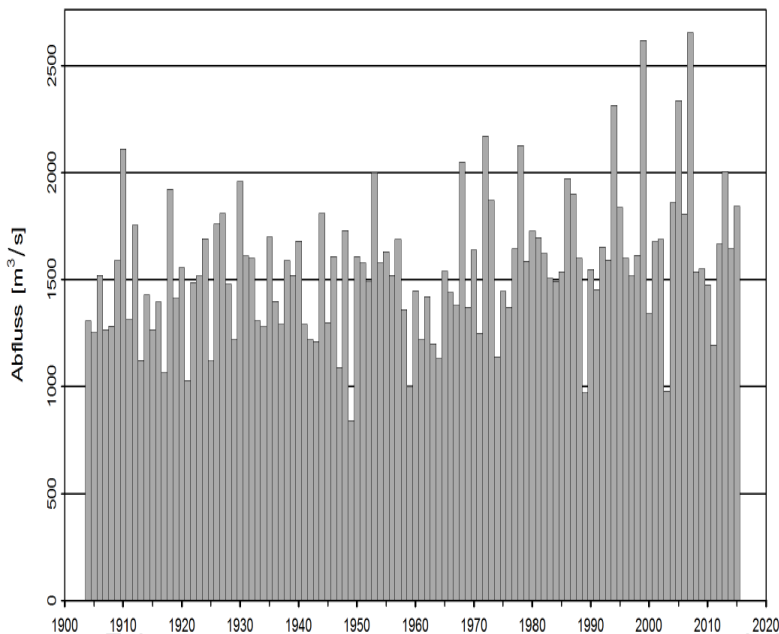
## Water Table Sensitivity Method of Slices for Different Volumes



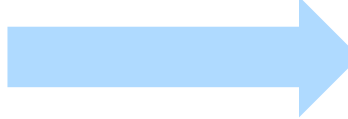
# Estimating Extreme Floods

- Stream gauge record is limited (<100 years in many places)
- Extrapolate stream record to estimate more extreme events
  - Requires choice of distribution (GEV, log-normal, gamma, log-gamma, LP3,...)
  - Issues of credibility with extrapolations beyond 2x the record length
  - Incorporation of historical data, paleo-flood data, regional precipitation,...
  - Stationarity of series (urbanization of catchment, climate,...)
  - Estimates are expected to be highly uncertain

Annual Maximum Series,  
Aare at Stilli (114 years)



GEV Distribution  
Only Gauge Record



Aare at Stilli, Discharge-Exceedance

