











Max G. Rudolph¹, Raoul Collenteur⁵, Markus Giese⁴, Alireza Kavousi¹, Thomas Wöhling², Torsten Noffz⁶, Andreas Hartmann³, Steffen Birk⁵, Thomas Reimann¹

Evaluation of Transfer Function Noise Modelling and Dimensionality Reduction Techniques for Karst Systems

Brussels, 06.09.2021

¹ TU Dresden, Institute of Groundwater Management

- ² TU Dresden, Insitute of Hydrology and Meteorology
- ³ University of Freiburg, Chair of Hydrological Modelling and Water Resources
- ⁴ University of Gothenburg, Department of Earth Sciences
- ⁵ University of Graz, Institute of Earth Sciences
- ⁶ University of Göttingen, Department of Applied Geology

Approach, Motivation and Aim

- **Modelling** and forecasting of karst system spring discharge still poses a challenge
- Distributed modelling approaches often suffer from insufficiently available data
- Lumped parameter models often do not reflect physical system understanding

Conceptually and (partially) physically interpretable data-driven model







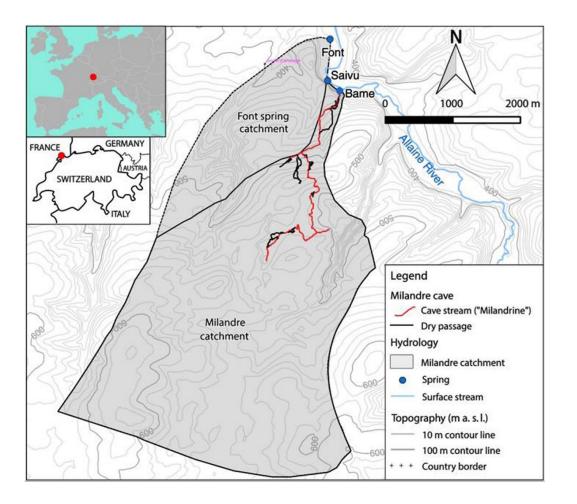
GÖTTINGEN

48th IAH Congress – Brussels, BG TFN Modelling and Dim.-Reduction for Karst Systems GEORG-AUGUST-UNIVERSITÄT 06.09.2021 Max Gustav Rudolph





Milandre Karst System



- Rauracian Limestone overlying Oxfordian Marls
- Catchment area approx. 13 km²
- Two perennial springs (Font, Saivu)
- One overflow-spring (Bâme)
- Autogenic, diffuse recharge regime

Heavily studied and subject to the Karst Modelling Challenge (Jeannin et al., 2021)



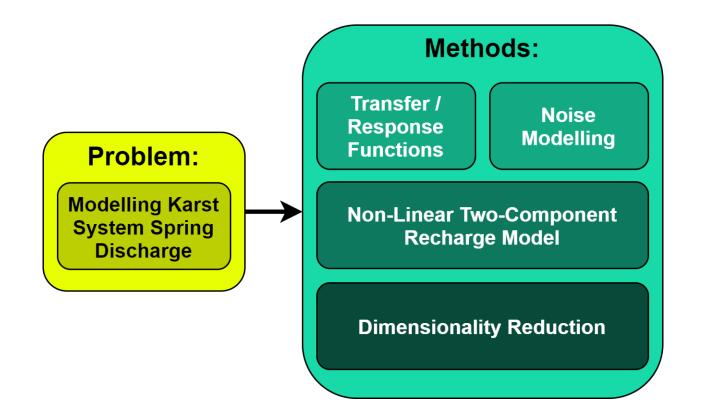
















FREIBURG

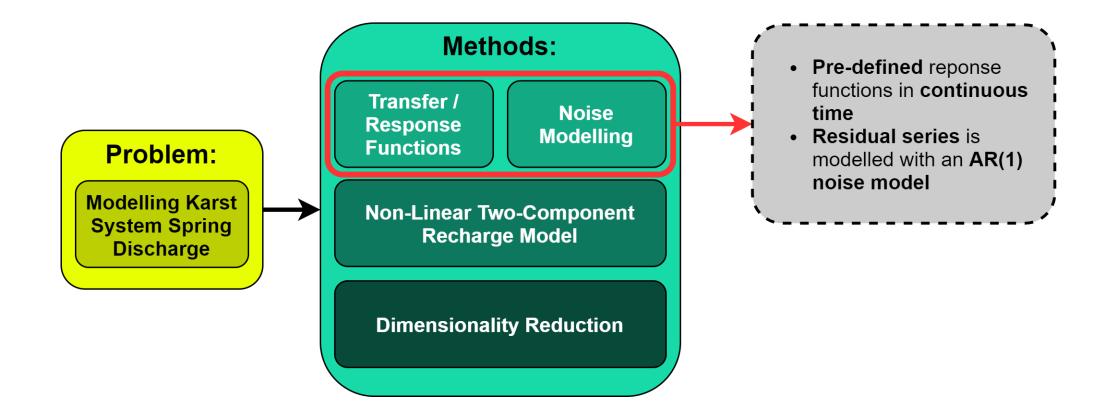




48th IAH Congress – Brussels, BG TFN Modelling and Dim.-Reduction for Karst Systems 06.09.2021 Max Gustav Rudolph

Slide 4 / 19











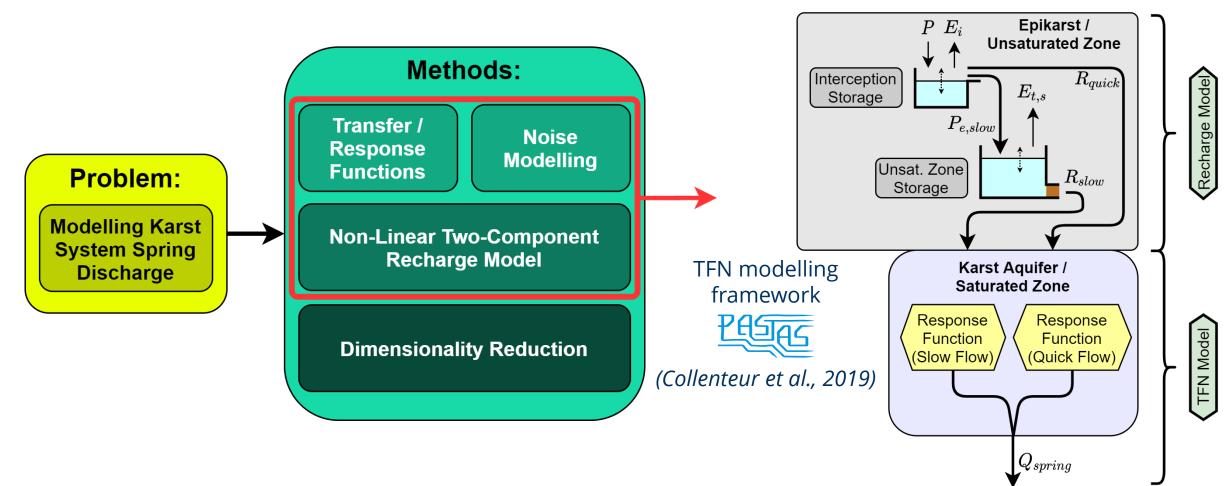


48th IAH Congress – Brussels, BG TFN Modelling and Dim.-Reduction for Karst Systems 06.09.2021 Max Gustav Rudolph

Slide 5 / 19



RM based on FlexModel introduced by *Collenteur et al. (2021)*







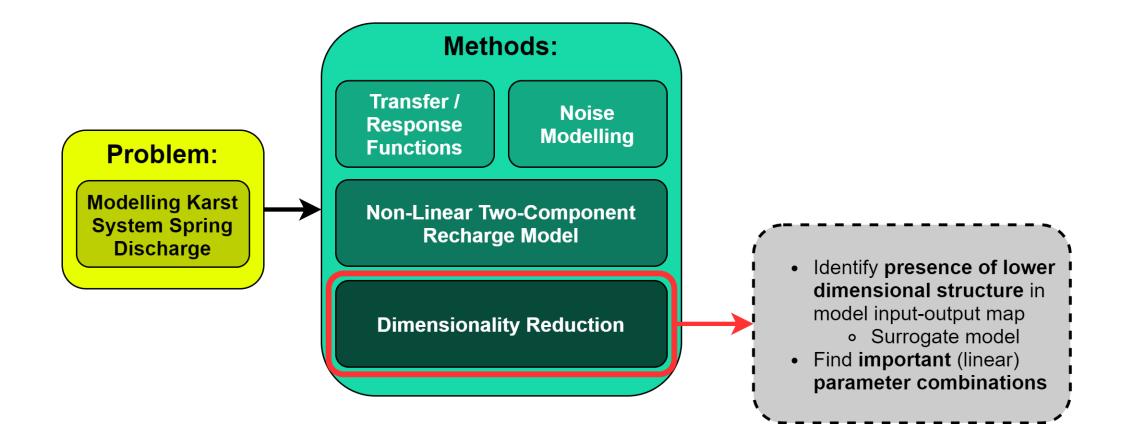




48th IAH Congress – Brussels, BG TFN Modelling and Dim.-Reduction for Karst Systems 06.09.2021 Max Gustav Rudolph

Slide 6 / 19













48th IAH Congress – Brussels, BG TFN Modelling and Dim.-Reduction for Karst Systems 06.09.2021 Max Gustav Rudolph

Slide 7 / 19



General Results

No Recharge Model / Linear Recharge Model

Better fit with increasing response function complexity

System characteristics poorly represented







UNI GRAZ







General Results

No Recharge Model / Linear Recharge Model

Better fit with increasing response function complexity

System characteristics poorly represented

Non-Linear One Component Recharge Model (Diffuse)

Not neccessarily better fit with increasing response function complexity

System characteristics were represented well











General Results

No Recharge Model / Linear Recharge Model

Better fit with increasing response function complexity

System characteristics poorly represented

Non-Linear One Component Recharge Model (Diffuse)

Not neccessarily better fit with increasing response function complexity

System characteristics were represented well

Non-Linear Two Component Recharge Model

Not neccessarily better fit with increasing response function complexity

System characteristics were represented well





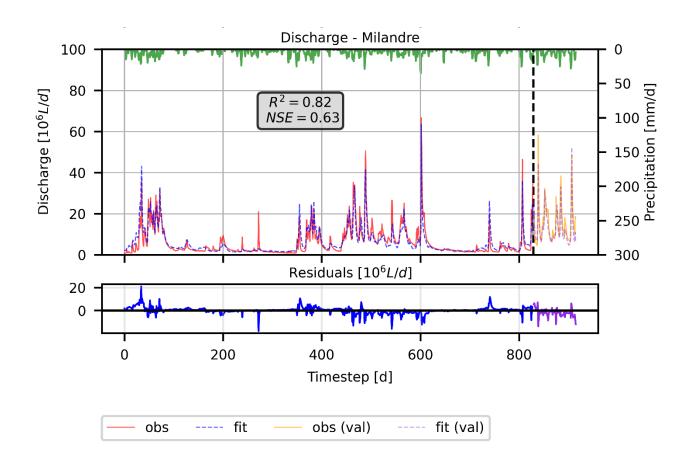








Results – Milandre Karst System



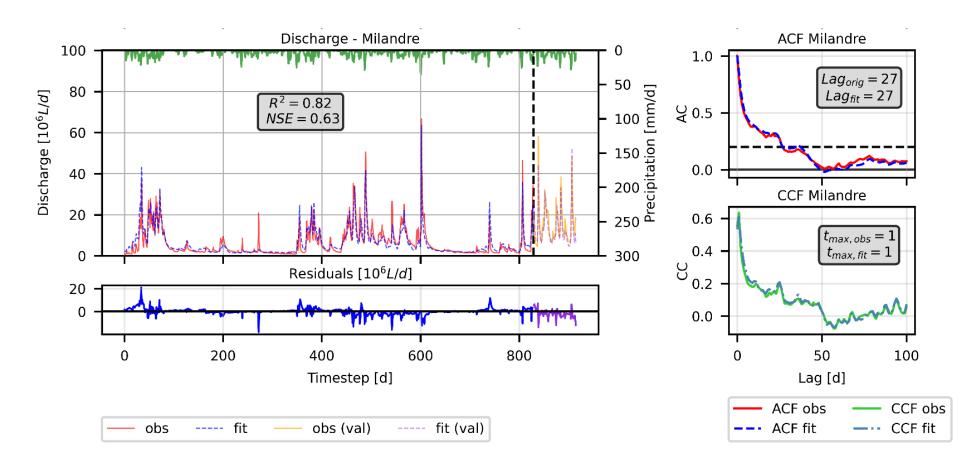


GEORG-AUGUST-UNIVERSITÄT GÖTTINGEN 48th IAH Congress – Brussels, BG TFN Modelling and Dim.-Reduction for Karst Systems 06.09.2021 Max Gustav Rudolph

Slide 11 / 19



Results – Milandre Karst System







FREIBURG



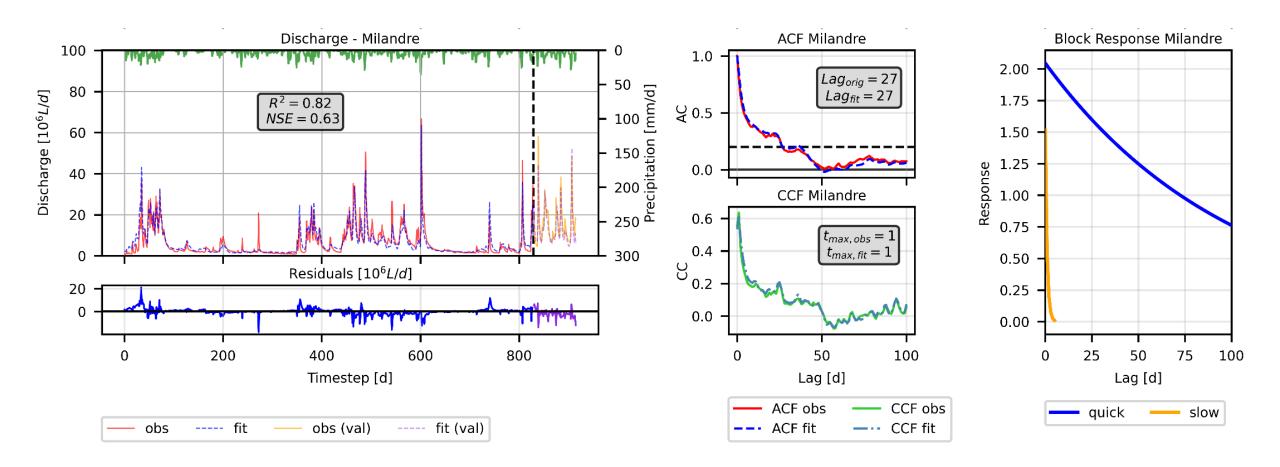


48th IAH Congress – Brussels, BG TFN Modelling and Dim.-Reduction for Karst Systems 06.09.2021 Max Gustav Rudolph

Slide 12 / 19



Results – Milandre Karst System







FREIBURG





48th IAH Congress – Brussels, BG TFN Modelling and Dim.-Reduction for Karst Systems 06.09.2021 Max Gustav Rudolph

Slide 13 / 19



Results – Comparison to Other Modelling Approaches (KMC)

		KGE	VCC	NSE	Effort	Score
BRGM France	Gardenia	0.83	0.854	0.83	1day	0.84
Uni-Freiburg	Varkarst	0.80	0.85	0.79	1day	0.82
This Study	TFN Model / Pastas	0.76	0.89	0.72	1day	0.804
IMT Mines-Alès	ANN / rec_MLP	0.72	0.84	0.61	≈1day	0.75
SISKA-Switzerland	KRM_1	0.71	0.78	0.63	≈1day	0.72
IGME Madrid	KarstFLOW	0.71	0.78	0.63	3 days	0.72
TCD Dublin	InfoWorks	0.70	0.82	0.58	2-5 days	0.72
KIT-Karlsruhe	CNN	0.69	0.87	0.40	≈1day	0.71
KIT-Karlsruhe	NARX	0.68	0.90	0.35	≈1day	0.70
SNO KARST	KarstMod	0.68	0.72	0.65	1day	0.69
TU-Dresden	CFP-modified	0.54	0.72	0.25	≈7 days	0.55
TU-Freiberg	RCD-Seasonal	0.47	0.69	0.04	1day	0.47
Uni-Zürich	CHLEM	0.45	0.71	-0.10	1day	0.44
KIT-Karlsruhe	LSTM	0.37	0.59	-0.24	1day	0.34
	Color					
	Rating	Very Good	Good	Fair	Medium	Low

Fit evaluated for a validation period not available for calibration!







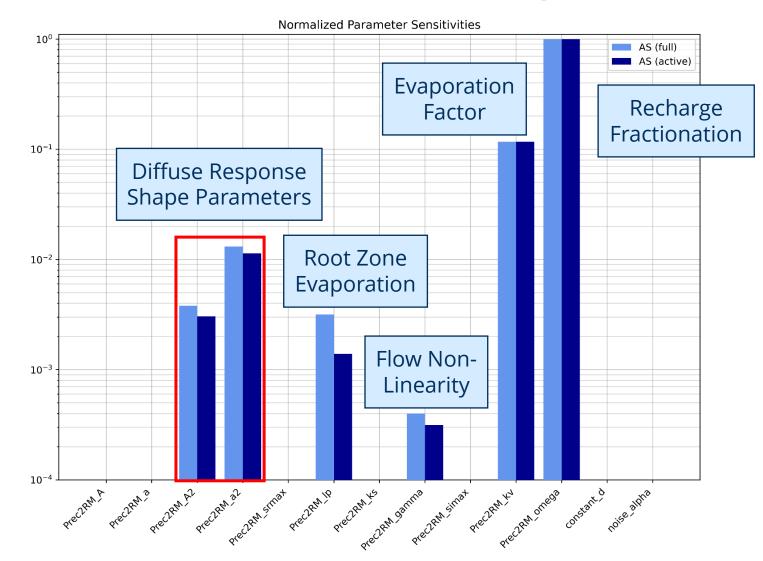


48th IAH Congress – Brussels, BG TFN Modelling and Dim.-Reduction for Karst Systems 06.09.2021 Max Gustav Rudolph

Slide 14 / 19



Results – Parameter Sensitivities (Active Subspaces)









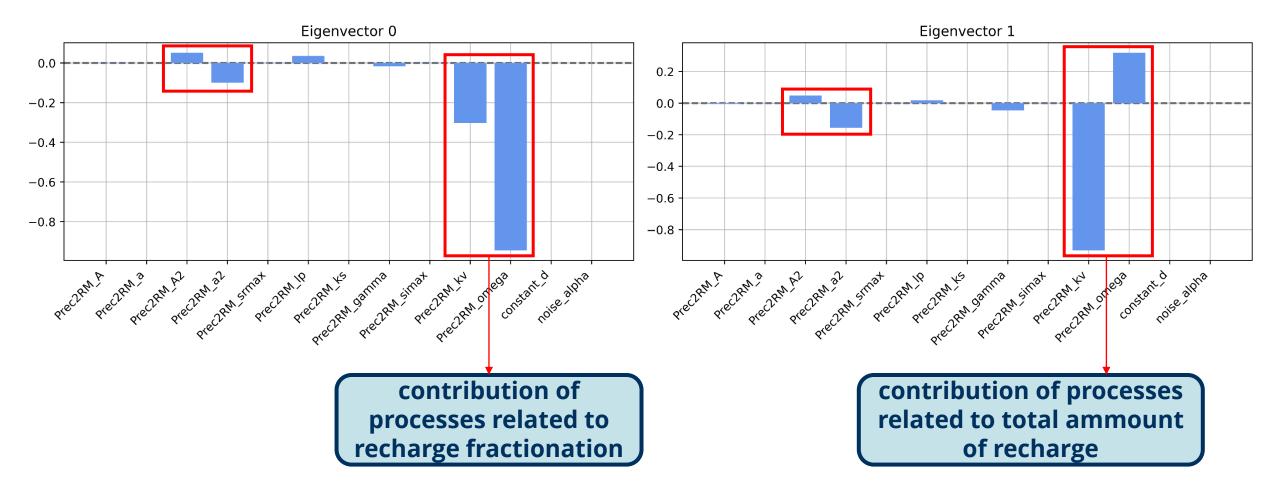


48th IAH Congress – Brussels, BG TFN Modelling and Dim.-Reduction for Karst Systems 06.09.2021 Max Gustav Rudolph

Slide 15 / 19



Results – Linear Combinations (Active Subspaces)



GEORG-AUGUST-UNIVERSITÄT

GÖTTINGEN



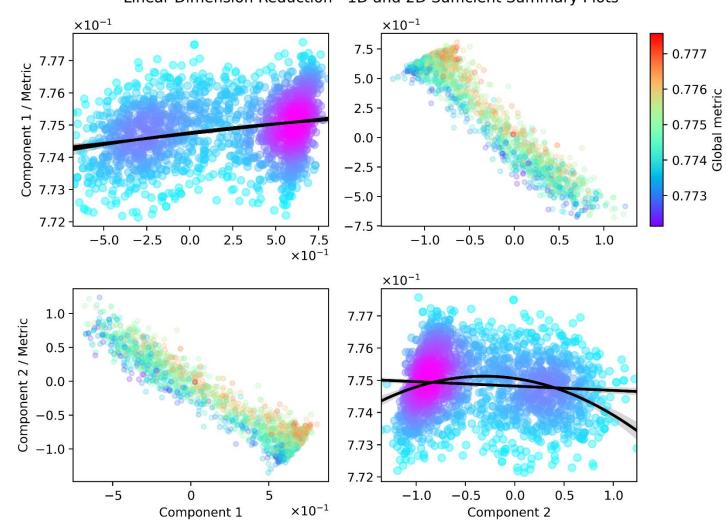
Slide 16 / 19







Results – Sufficient Summary Plots (Active Subspaces)



Linear Dimension Reduction - 1D and 2D Sufficient Summary Plots









48th IAH Congress – Brussels, BG TFN Modelling and Dim.-Reduction for Karst Systems 06.09.2021 Max Gustav Rudolph

Slide 17 / 19



Summary

- Recharge process representation is highly important and sensitive
- Non-linear recharge model compensates for karst system non-linearity
- Method is generally **suitable**
- Model outperformed most other approaches in the Karst Modelling Challenge













Thank You For Your Attention!

Contact:

max_gustav.rudolph@tu-dresden.de

Python

• programming language



Pastas

- open source TFN-model for Python
- available on GitHub



















48th IAH Congress – Brussels, BG TFN Modelling and Dim.-Reduction for Karst Systems 06.09.2021 Max Gustav Rudolph

Slide 19 / 19

