



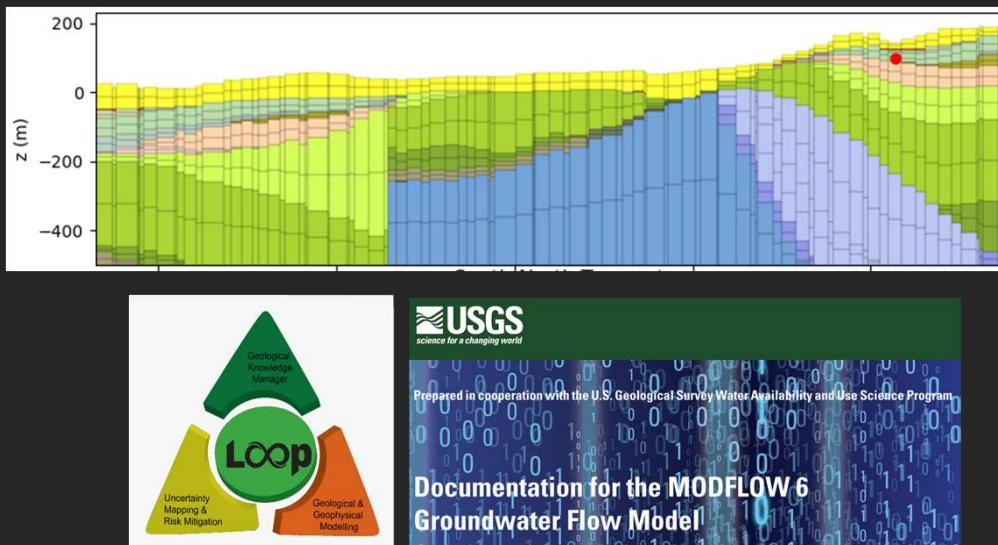
WORKSHOP

Improving Understanding and Treatment of Uncertainty in Groundwater Science and Management

11, 18, and 25 February 2025 • Virtual

Addressing structural uncertainty in groundwater models

LoopFlopy – A geo-flow modelling workflow to address structural uncertainty in groundwater models



K. Bardot^{a,*}, L. Grose^b, I. Camargo^a, G. Pirot^a, A. Siade^{a,c}, J.P. Pigois^d, C. Hampton^e, J. McCallum^a

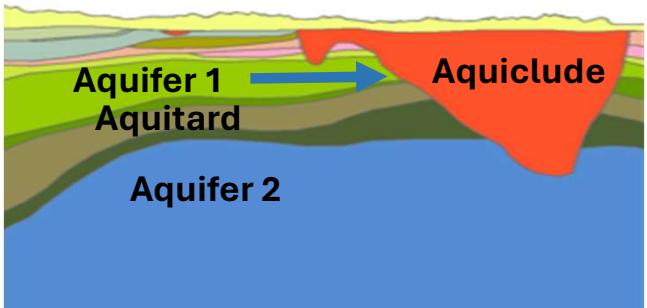
^a University of Western Australia, ^b Monash University, ^c CSIRO Australia, ^d Department of Water and Environmental Regulation, ^e Water Corporation

This is part of the Faults and Barrier study and financially supported by the Australian Research Council, Department of Water and Environmental Regulation of Western Australia, Water Corporation of Western Australia and Rio Tinto Iron Ore through Grant Number LP180101153.

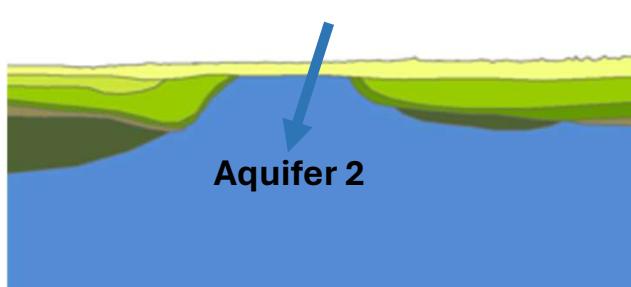


THE UNIVERSITY OF
**WESTERN
AUSTRALIA**

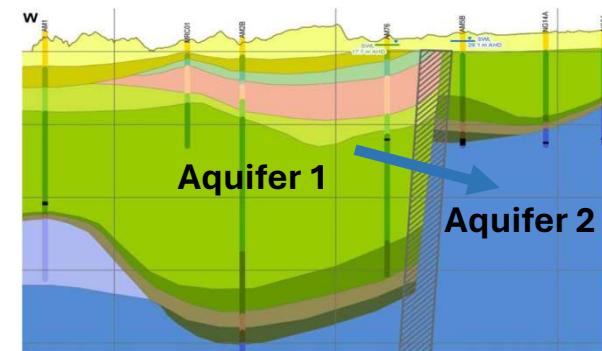
How important is structure for groundwater flow? VERY!



Intrusion



Pinchouts

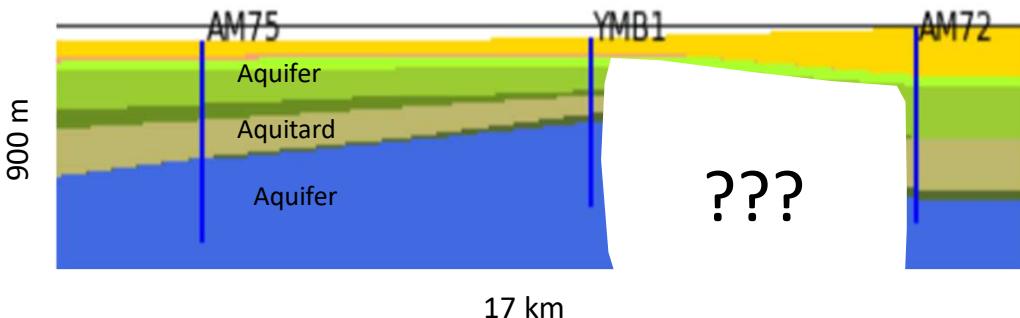


Faults

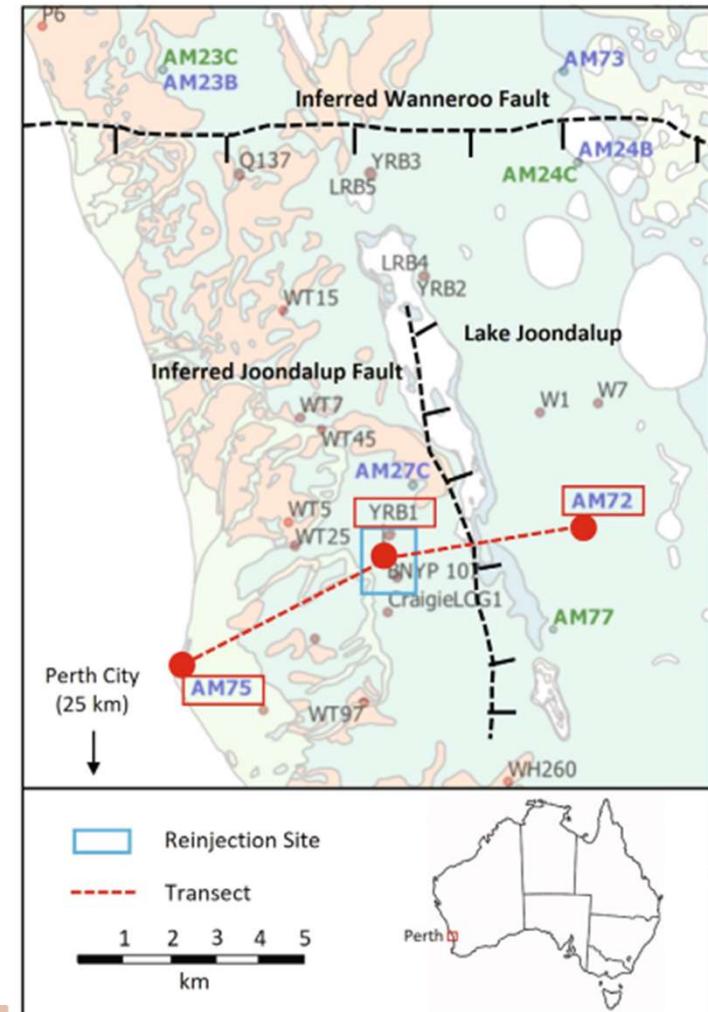
Gathering more data to characterise structure is always a good idea,
but there will always exist structural uncertainty.

Well known that you can't always compensate structural uncertainty with other parameters...

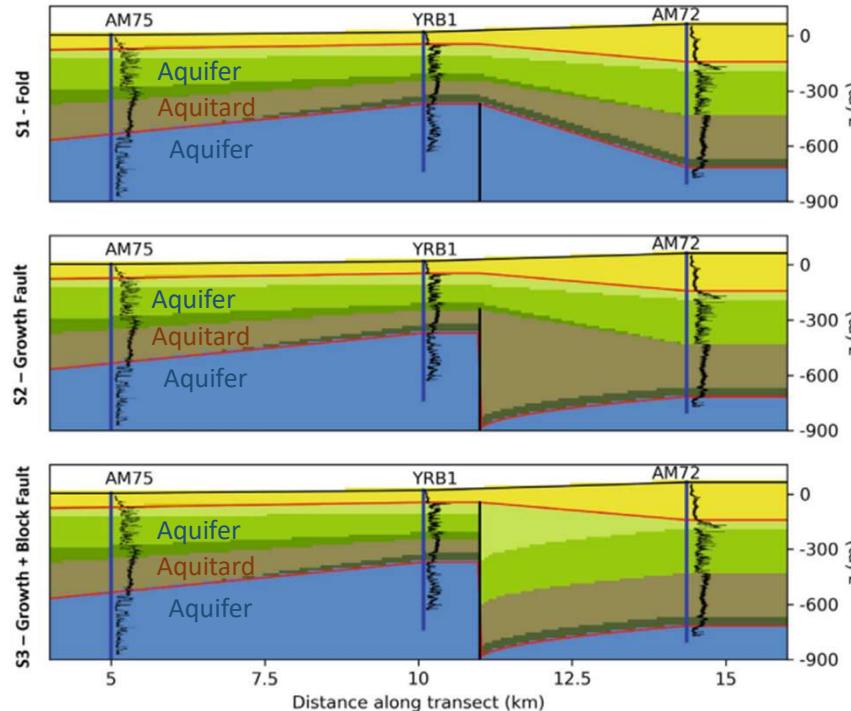
Take this transect for example...



- ❗️ Stratigraphy offset by up to 350 m over 4km
- ❗️ There's an elongated lake...
- ❗️ BUT... no seismic! Sparse boreholes!



Different structural interpretations...



Layer cake

Growth fault

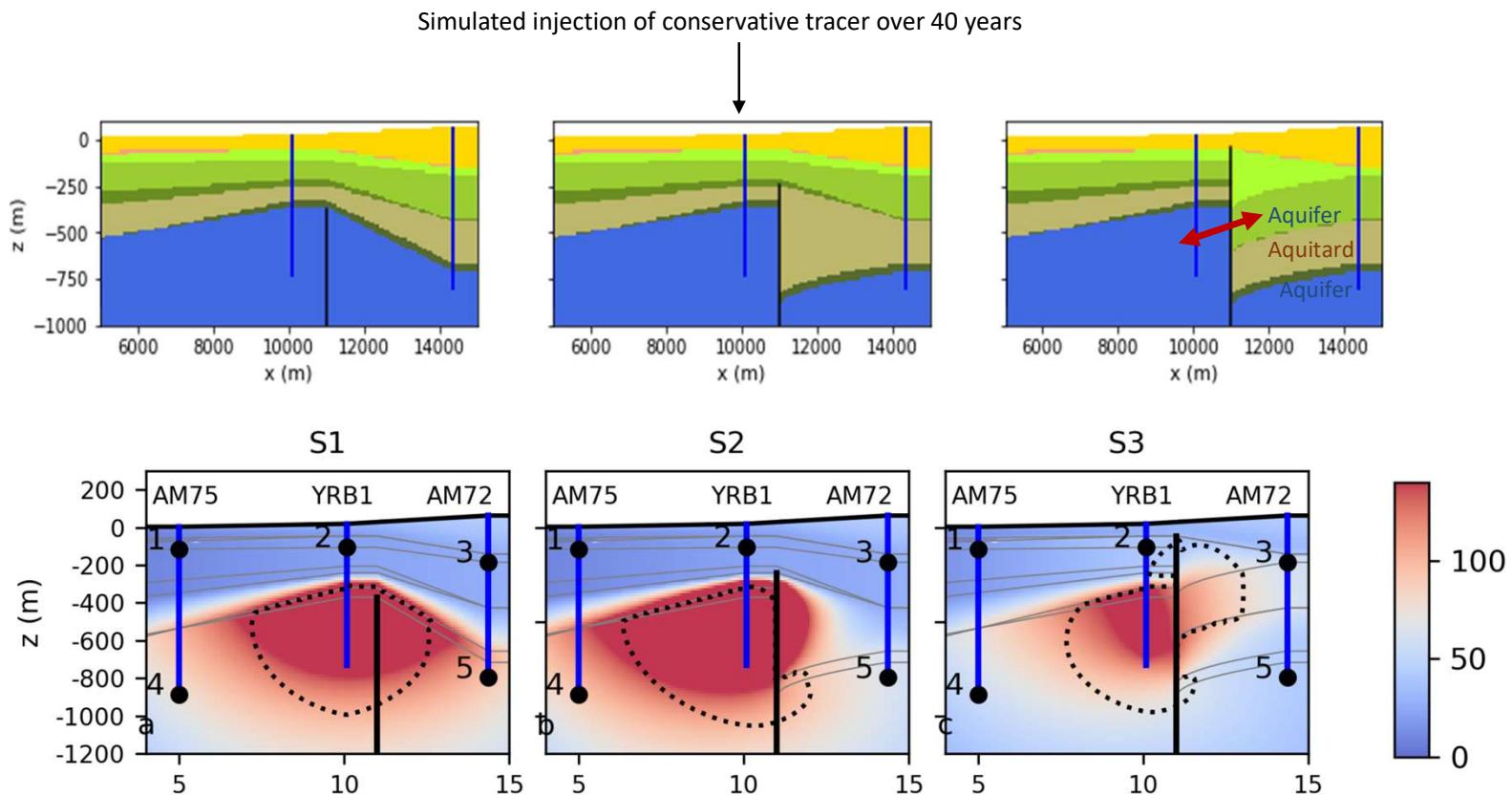
Block fault

Ma	AGE	STRATIGRAPHIC UNITS	AQUIFER	TECTONIC STAGE
60	CENOZOIC	Undifferentiated Cenozoic	Superficial Aquifer	
120	LATE CRETACEOUS	Undifferentiated Coolyena Group	Aquitard	
140	EARLY CRETACEOUS NEOCOMIAN	Warnbro Group	Leederville Aquifer	Uplift on basin margin
160	LATE JURASSIC	Parmelia Group	Aquitard	Post-rift II
		Yarragadee Formation	Yarragadee Aquifer	Breakup
				Rift II-2

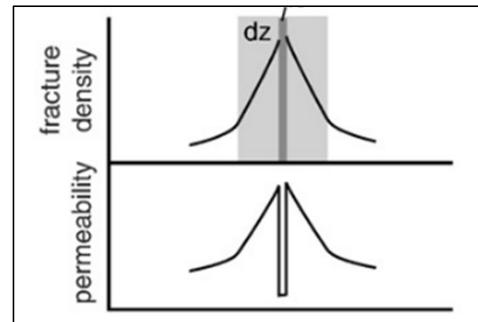
Note: Age scale is not linear

→ Duration of faulting for Structural Model 1
→ Duration of faulting for Structural Model 2
→ Duration of faulting for Structural Model 3

Consequences of different structural interpretations

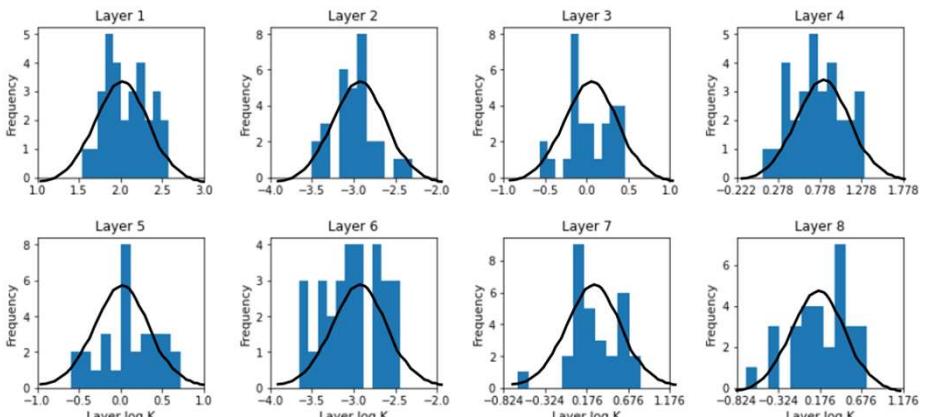


But how does **structural** uncertainty compare with **layer** and **fault zone** parameter uncertainty?



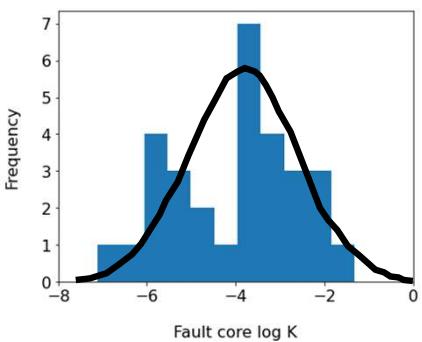
Conceptual diagram of
fault zone permeability
[Bense et al., 2013](#)

Effect of layer K
(100 realisations)



Two OOM either side of mean for each layer

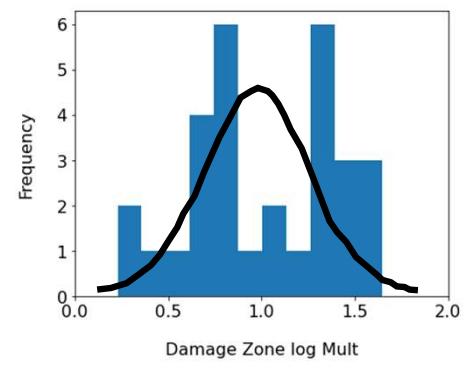
Effect of barrier behaviour
(100 realisations)



10^{-8} to 1 (mean of 10^{-4})

Horizontal Flow Barrier (HFB)
package used to set up fault core
(1m wide).

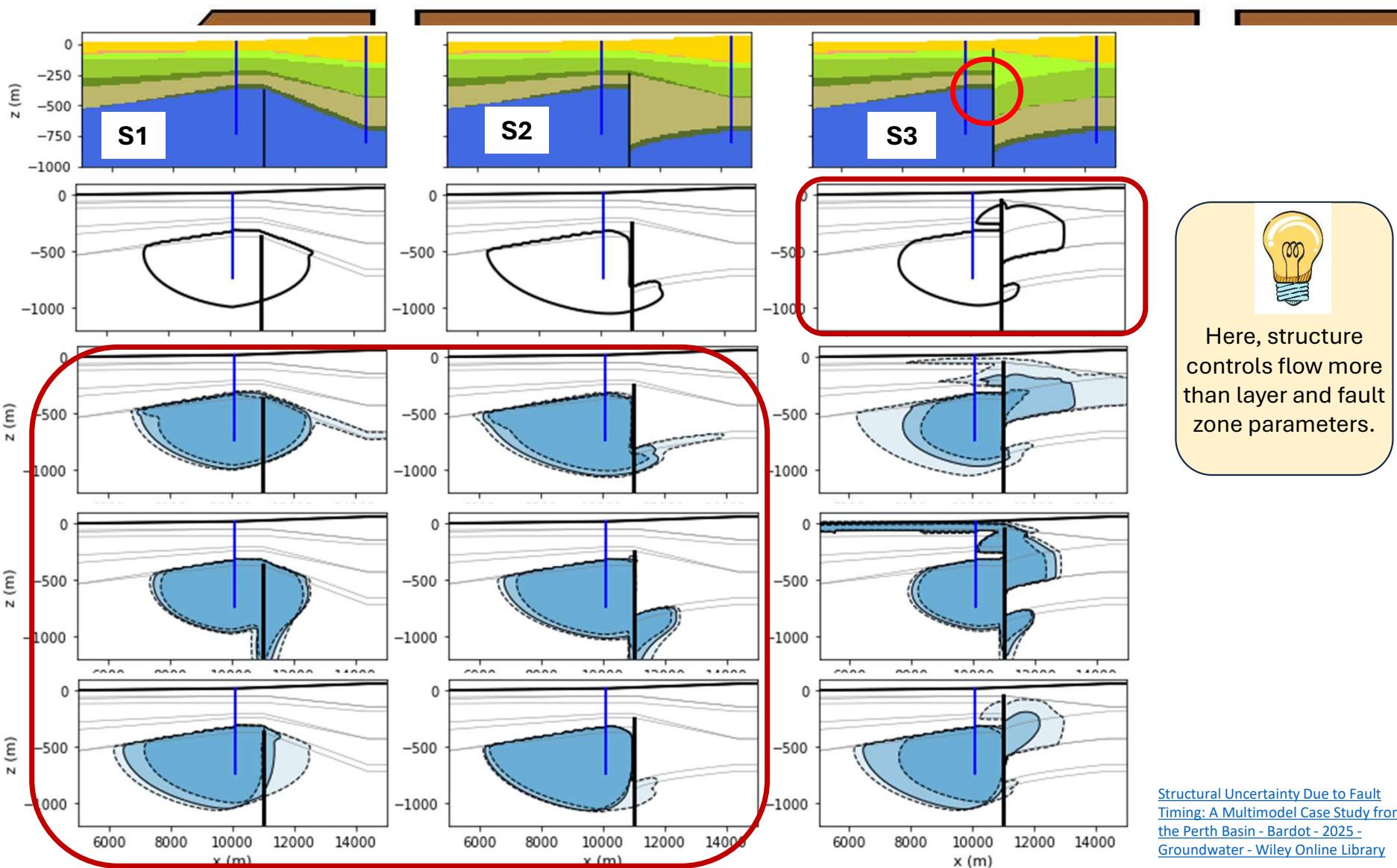
Effect of conduit behaviour
(100 realisations)



0 – 100 (mean of 10)

Damage Zone Multiplier was
used for 4 columns of cells
(270m wide)

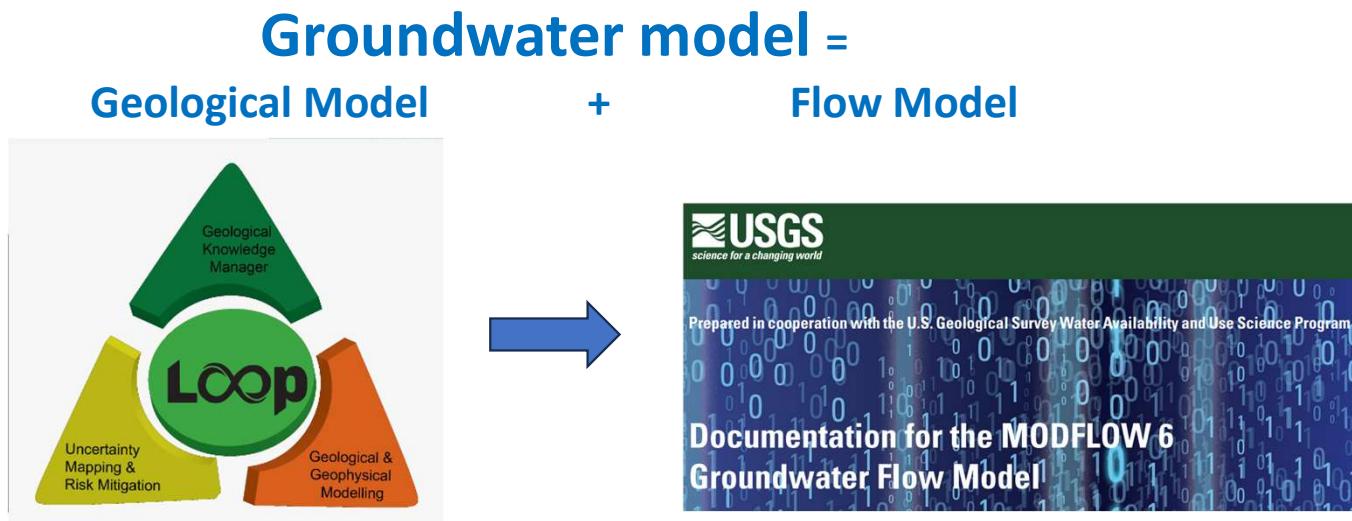
Predicted injection zones



Structural Uncertainty Due to Fault Timing: A Multimodel Case Study from the Perth Basin - Bardot - 2025 - Groundwater - Wiley Online Library

If so important, why is structural uncertainty rarely addressed?

- Lack of probabilistic geological modelling software
- Hard to update flow model when geological model changes with different interpretation (or new data).



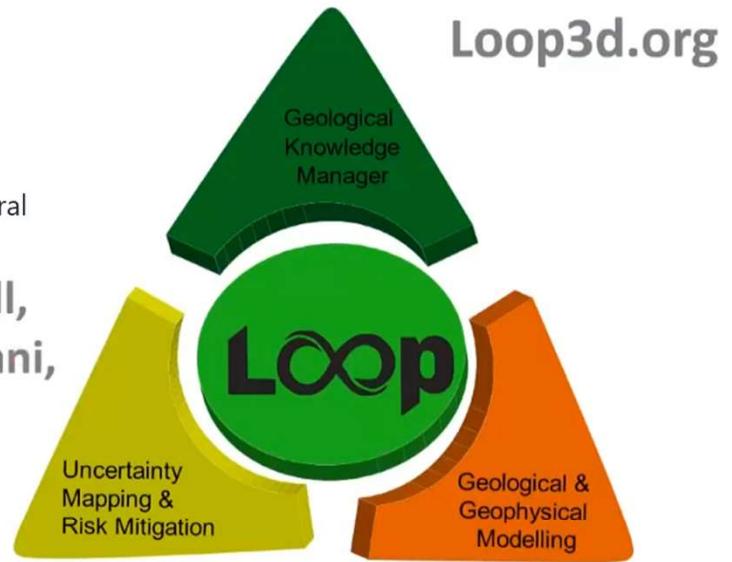


An integrated and interoperable platform enabling
3D stochastic geological modelling

An open-source, integrative 3D geological
modelling platform



Laurent Aillères, Lachlan Grose, Mark Jessell,
Fernanda Alvarado-Neves, Angela Rodrigues, Rabii Chaarani,
Vitaly Ogarko

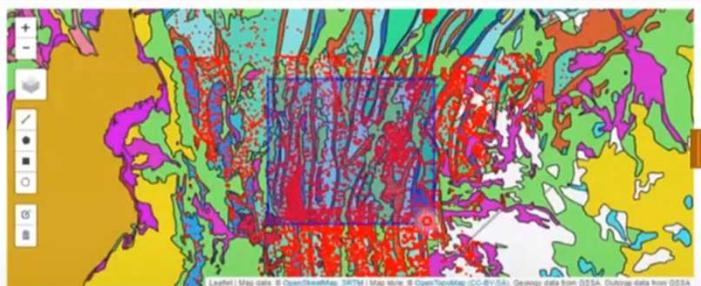


Loop3d.org



Automation of Geological Digital Twin(s)

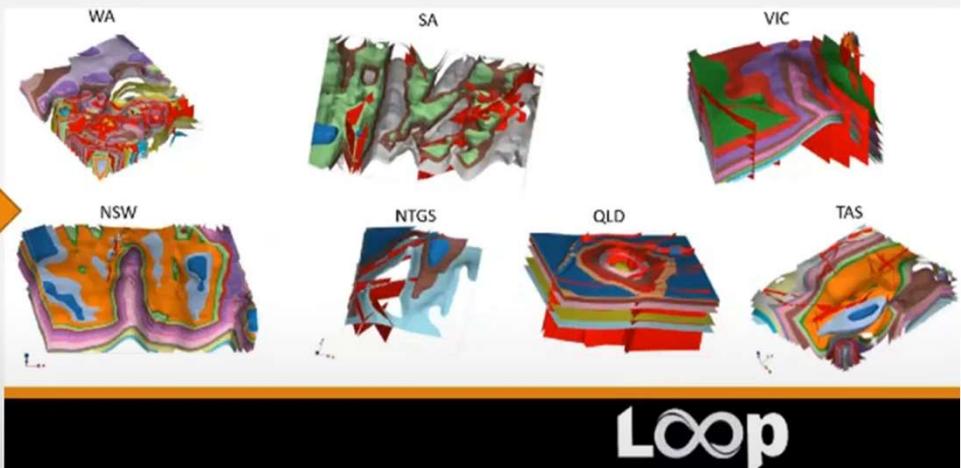
Automated 3D model creation with the link: map2loop -> LoopStructural



Data served by Geological Surveys in Australia

EGU European Geosciences Union
Geoscientific Model Development
Special issue
The Loop 3D stochastic geological modelling platform – development and applications
Editor(s): GMD topical editors | Coordinator: Laurent Allègre

m2l analysis
and data
augmentation



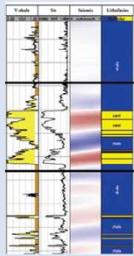
LoopStructural models calculated in a few minutes (inc. map2loop and loopstructural time) on a “normal” laptop
E.g. Flinders ranges: 10K+ orientation data points; overall time ~11 minutes (Dell Inspiron 15).



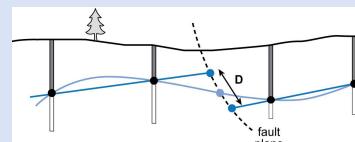
Main advantages of geo-flow workflow

GEO MODELLING (Loop Structural)

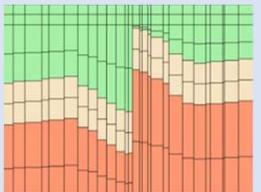
Flow model updates with new geo data



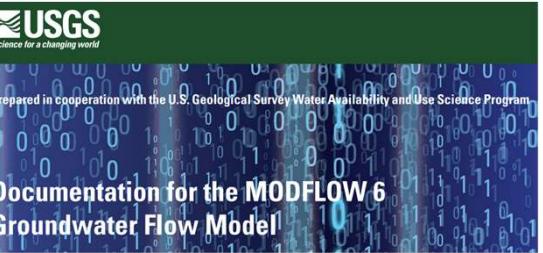
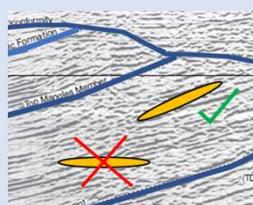
Multi-models using structural parameters



Unstructured grids adapt to structural model

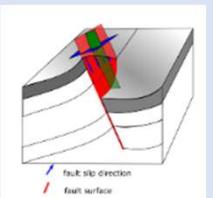


Generates dip angles for full 3D K tensor



FLOW MODELLING (MODFLOW 6)

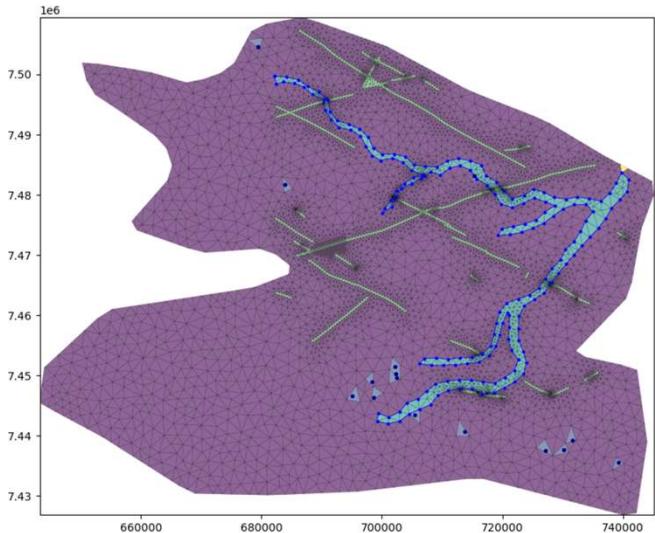
Can model complex geology (faults/folds)



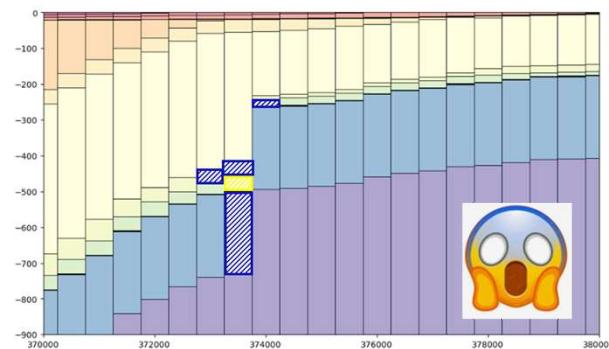
Open source!



**Unstructured Grids important part of the workflow.
Cells efficiently adapt to the structural model.**



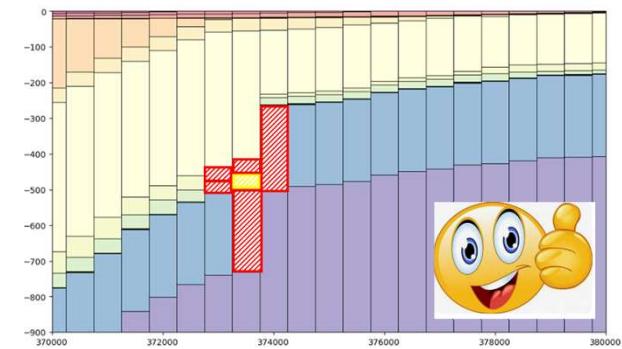
PLAN



"LAYERED CONNECTIVITY"

- MF2005
- DIS or DISV grid in MF6

TRANSECT

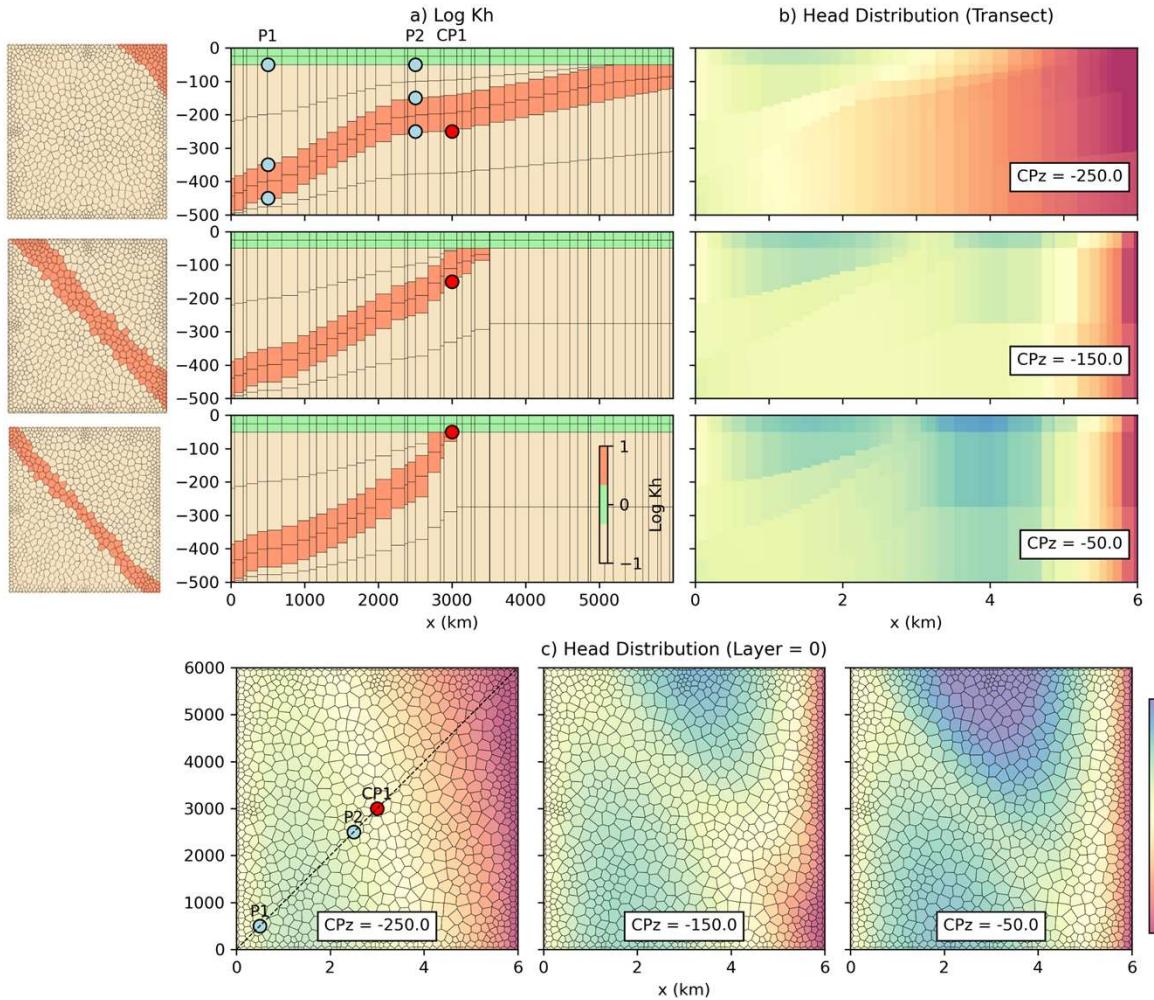
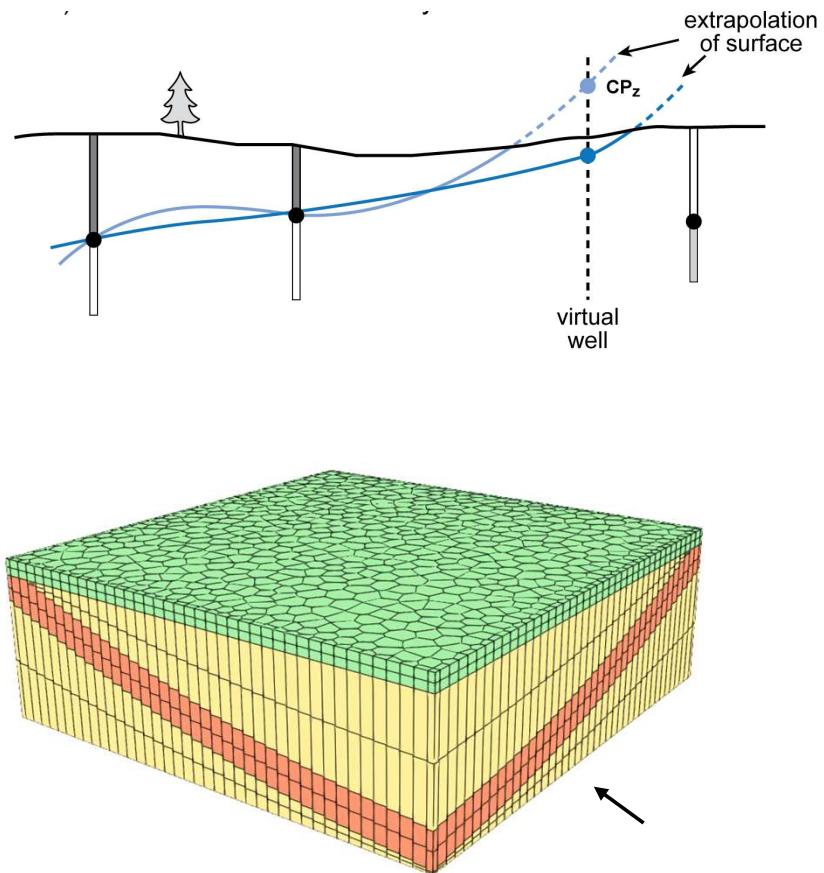


"FULL CONNECTIVITY"

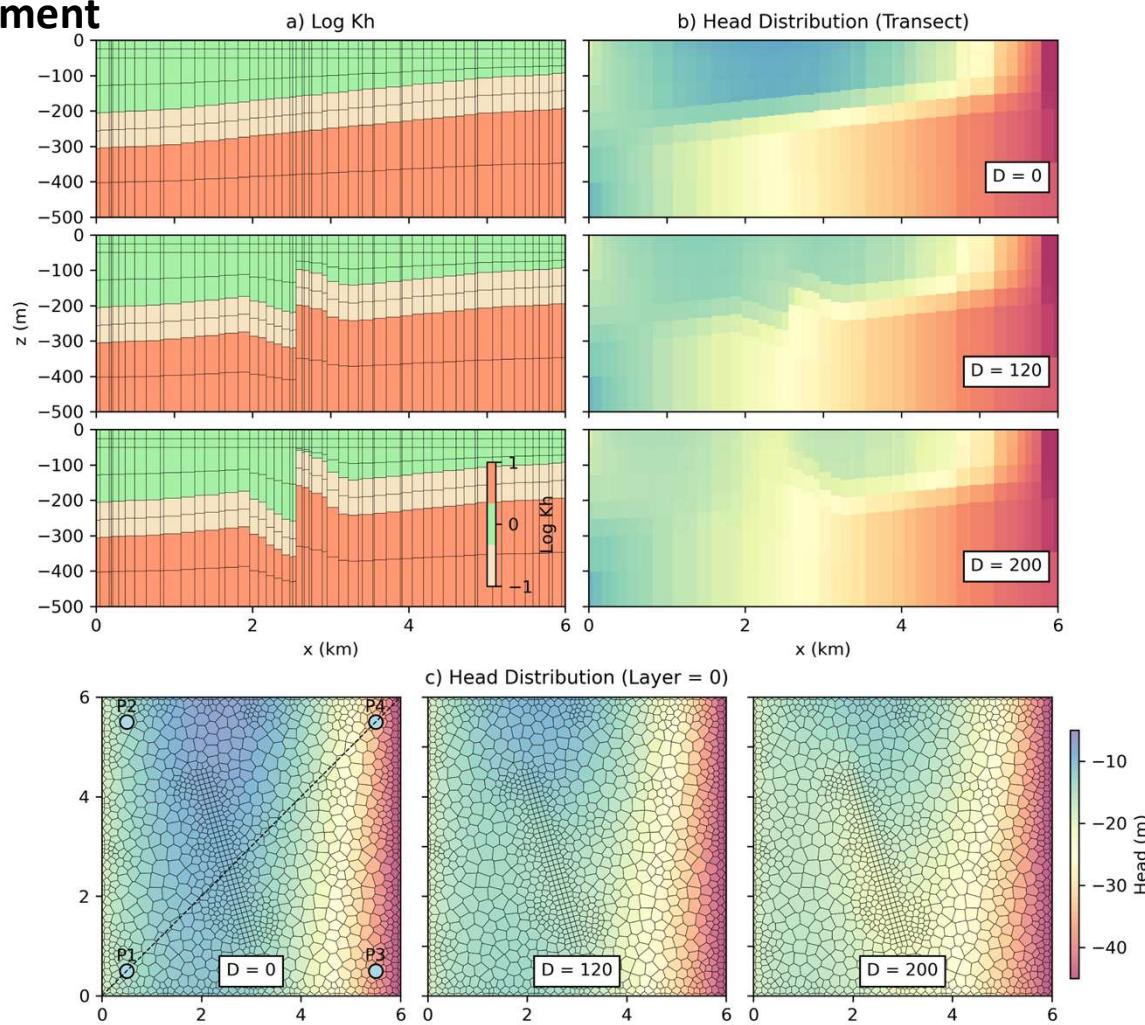
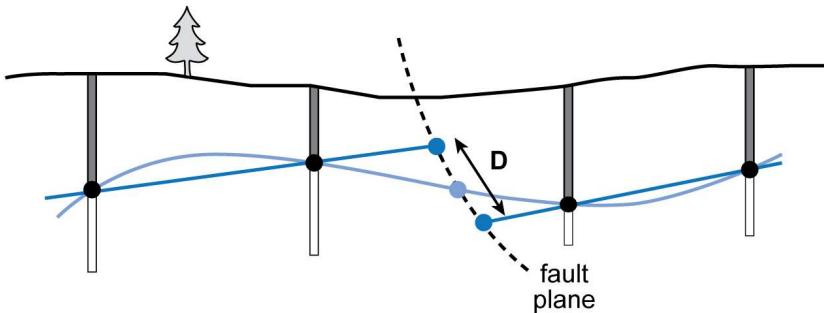
- MF-USG
- DISU grid in MF6

[Accurate Simulation of Flow through Dipping Aquifers with MODFLOW 6 Using Enhanced Cell Connectivity](#)

Simple Example: Uncertainty in subcropping location (extrapolation)

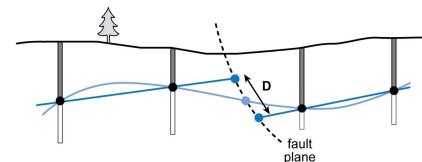
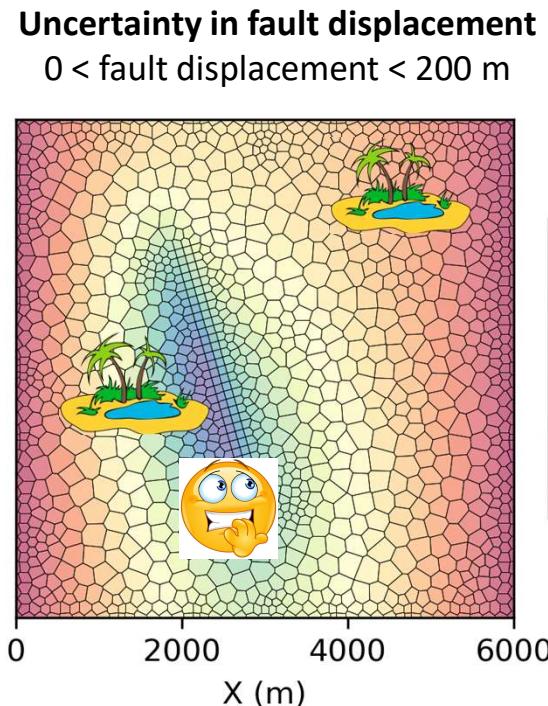
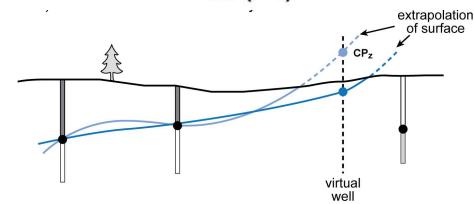
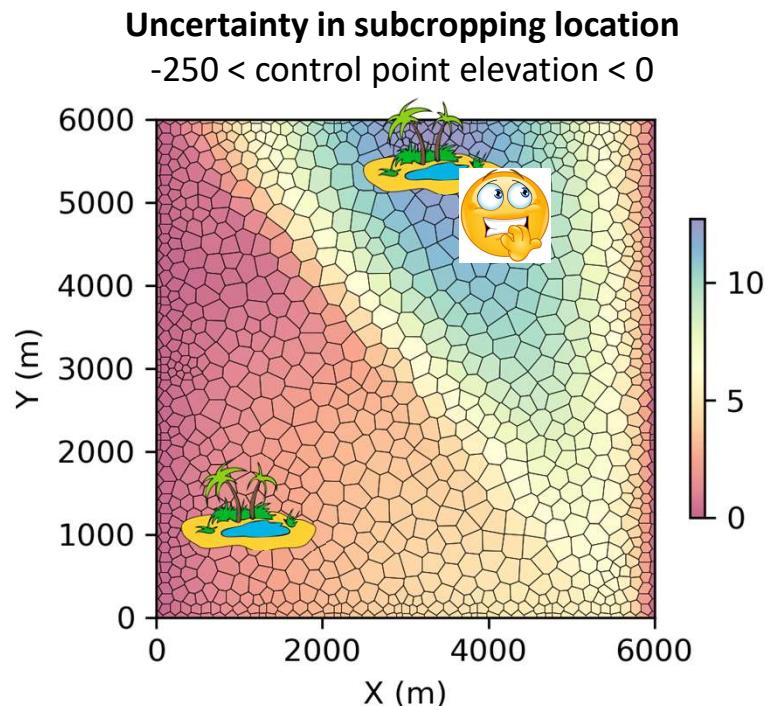


Simple Example: Uncertainty in fault displacement



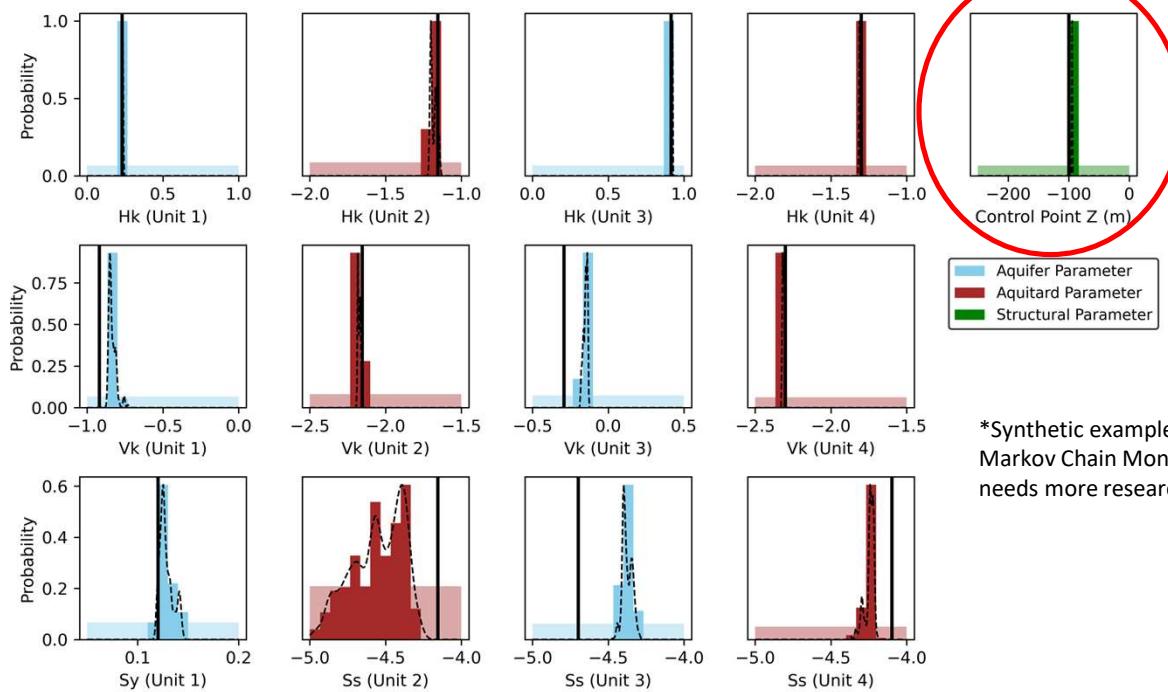
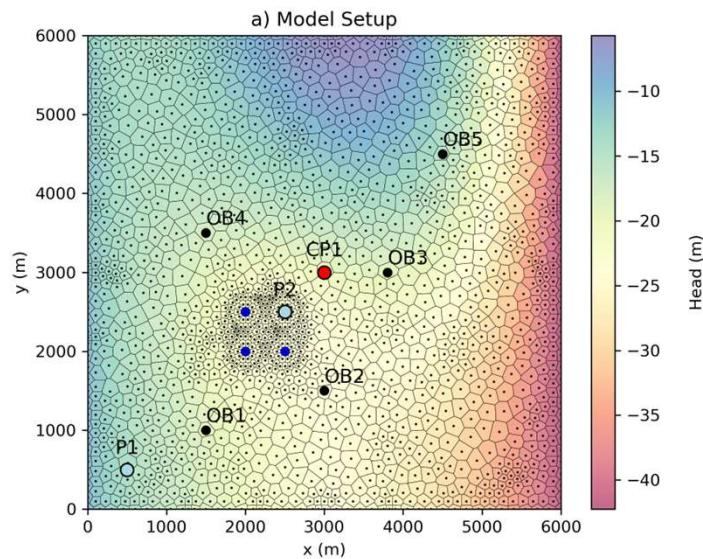
Here is a way to communicate structural uncertainty

Standard deviation in hydraulic head (100 realisations)



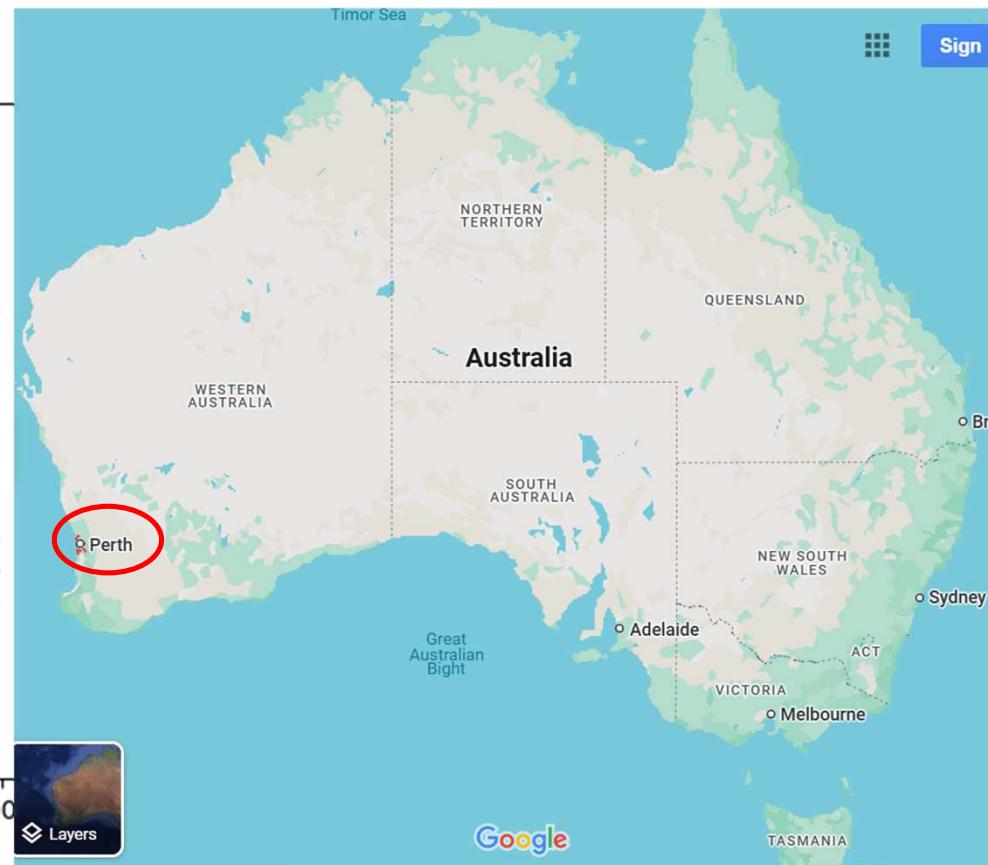
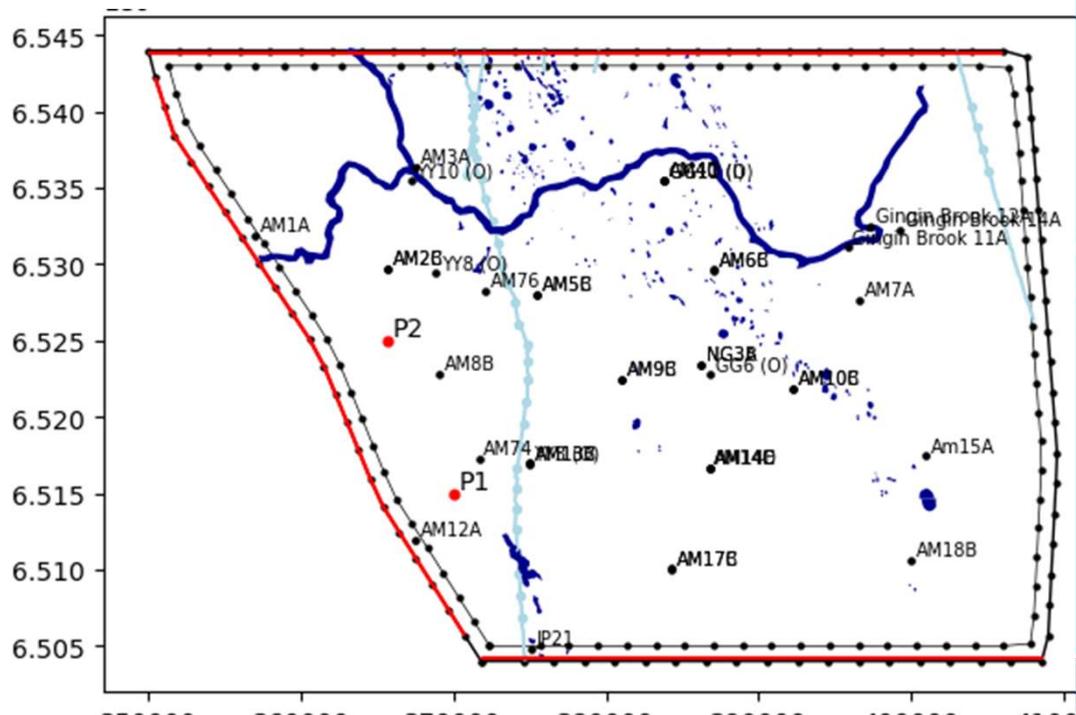
We're a bit excited because...

Managed to inverse model structure based on flow data!*



*Synthetic example,
Markov Chain Monte Carlo,
needs more research

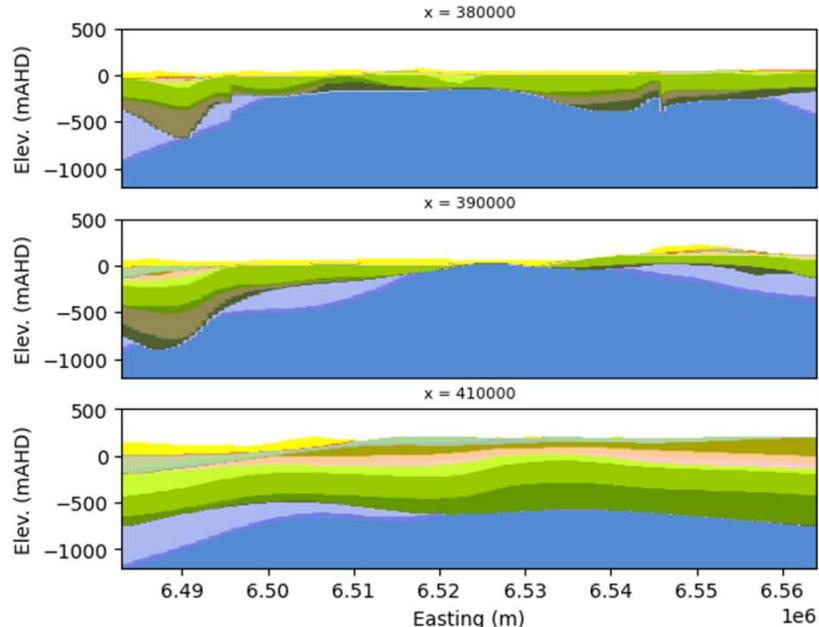
Applying to real-life – Perth Basin submodel



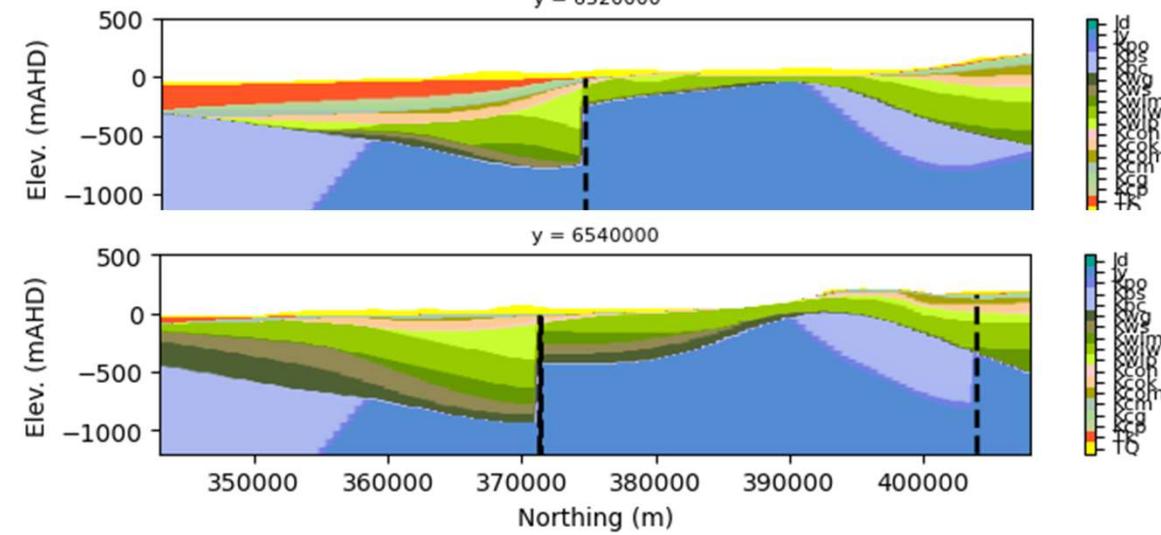
Structural Model

An implicit model created by LoopStructural of stratigraphic and fault surfaces

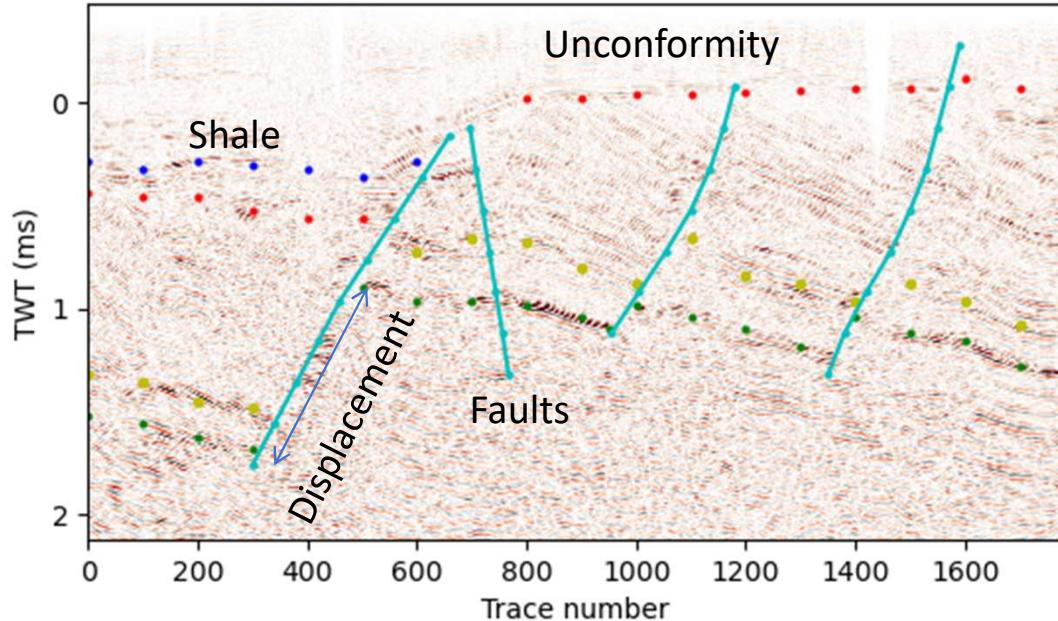
Inputs: Drilling data, topography, stratigraphic sequence (order), typical thickness of units, surface orientations, fault parameters (orientation, ellipse geometry), seismic



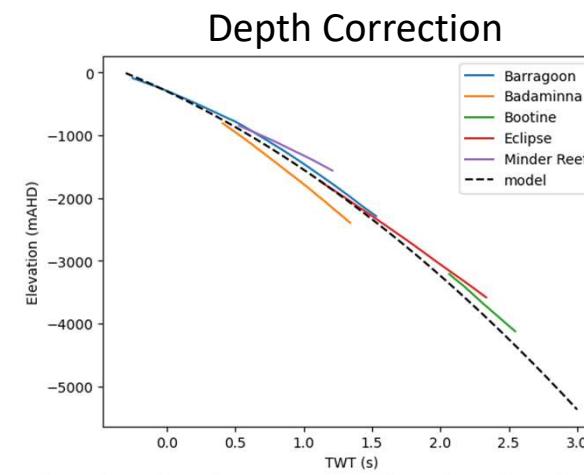
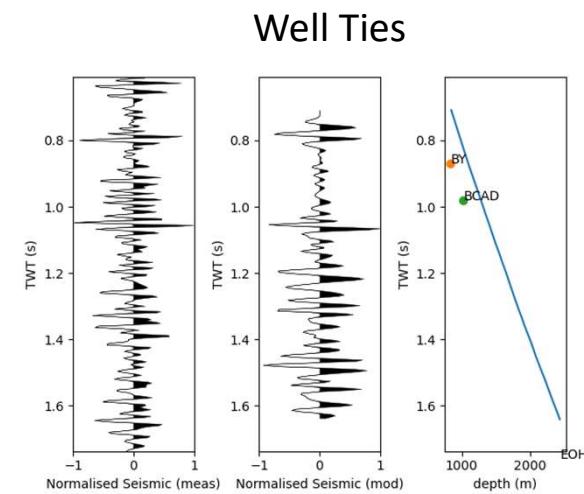
A	B	C	D	E	F	G	H	I	J
Easting	Northing	ID	Ground	Kcomoc	Kcoh	Kwlp	Kwlw	Kwlm	
372139	6569150	SN4134	75	-	-	-	78	114	
394489	6568750	GL7	146	-	120	150	372	392	
358839	6567950	GL3A	60	-	152	193	490	525	
368289	6566750	GL4A	78	-	-	129	417	595	
350439	6566450	GL2	131	-	-	262	607	856	
405139	6566150	GL8A	173	-	113	-	323	-	
342152	6564300	GL1A	5	-	-	86	206	236	



Additional data from Seismic – SO HELPFUL IF YOU CAN GET IT!

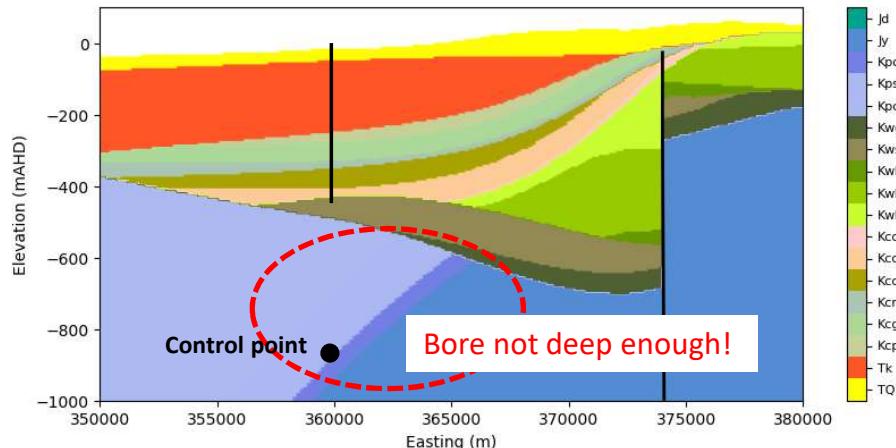


... but also some uncertainty involved in seismic interpretation, which we can account for in the workflow

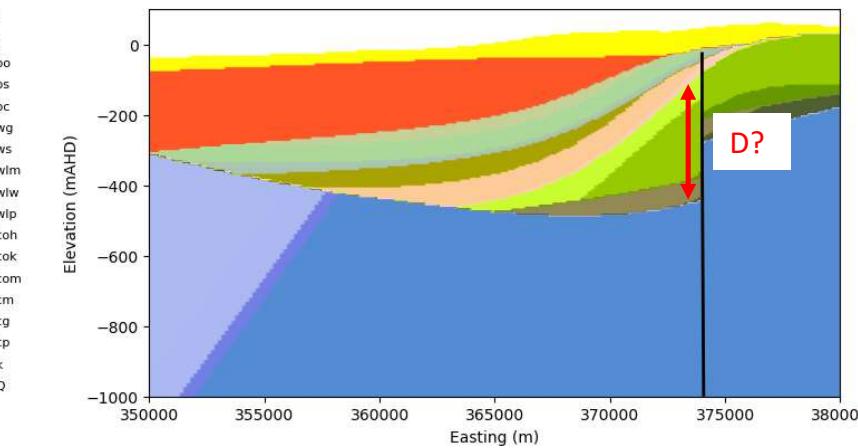
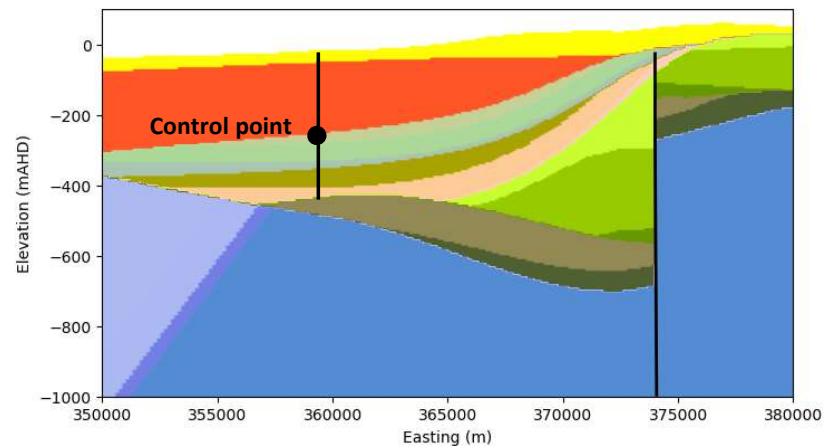
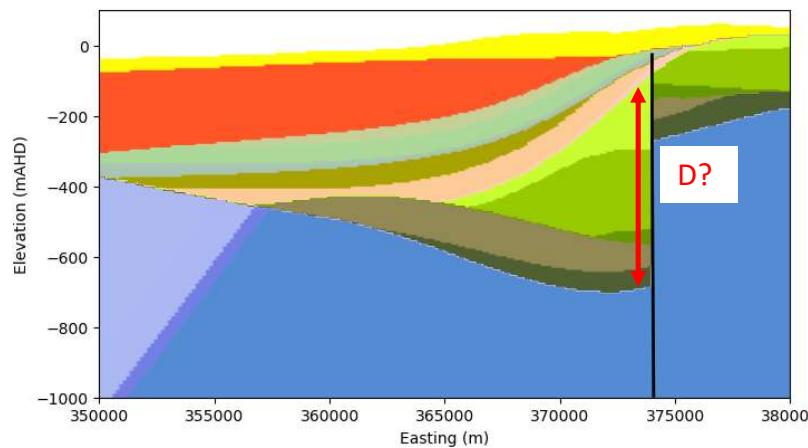


Control points – Uncertainty West of Badaminna Fault

Structural control points

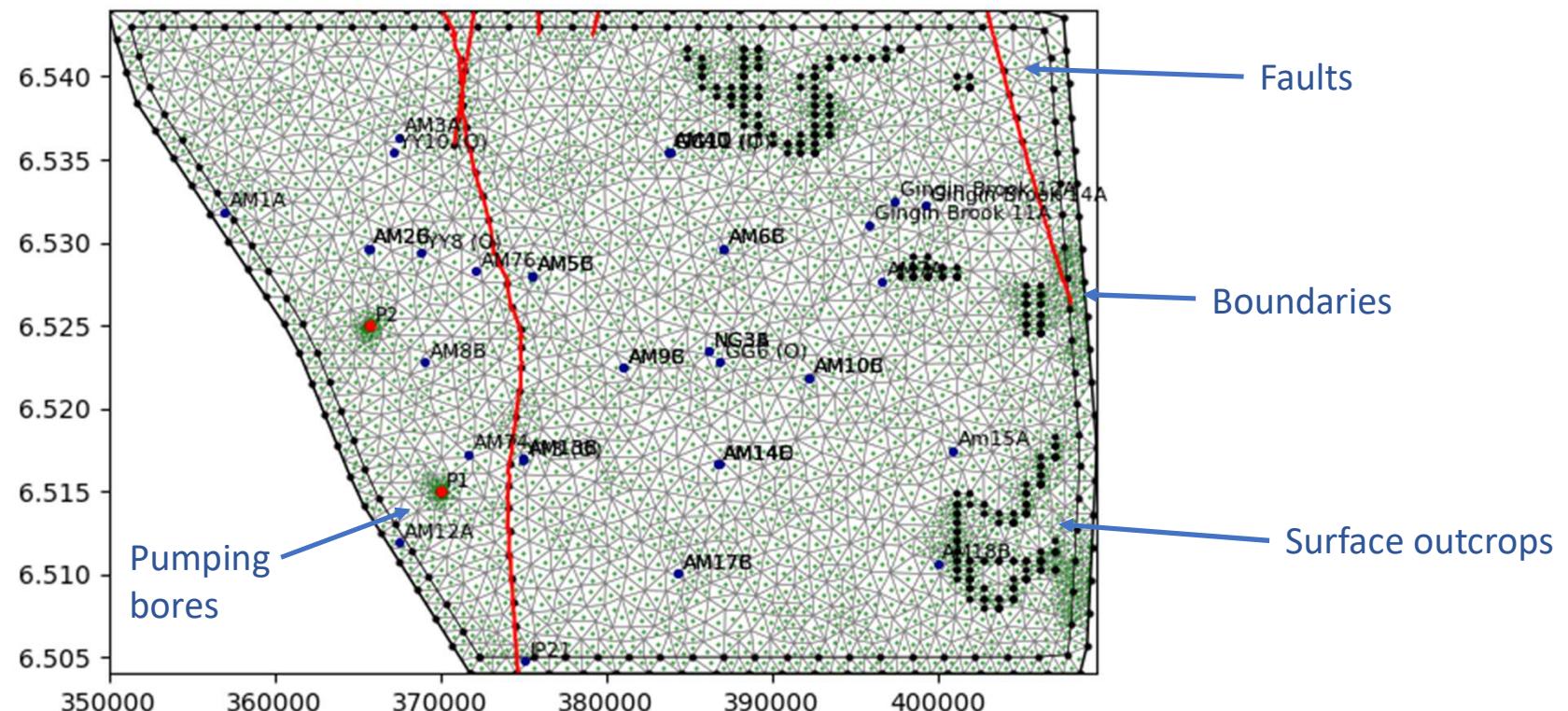


Fault Displacement



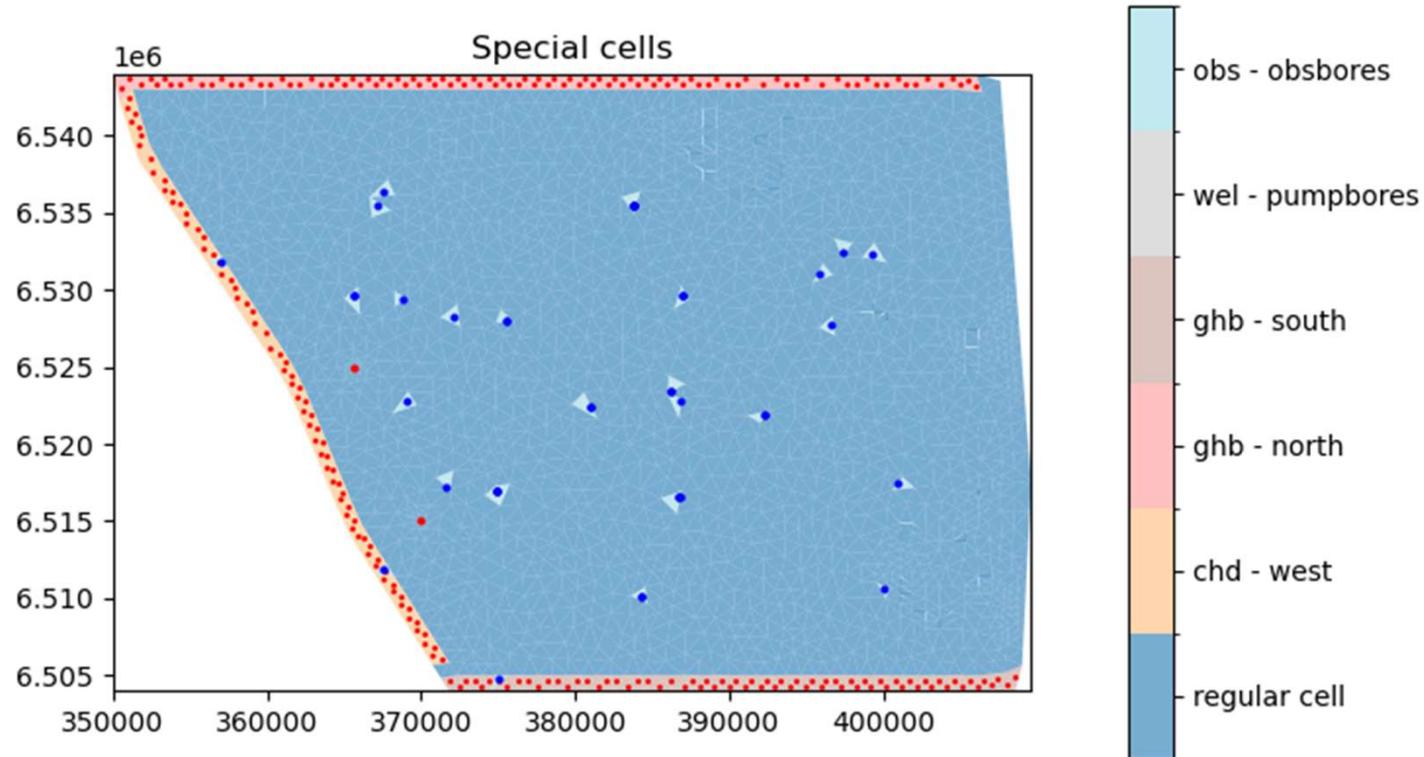
Meshing

Inputs – spatial objects(boundaries, fault traces, pumping bores, lithological outcrops, rivers) and refinement criteria



Identifying cells

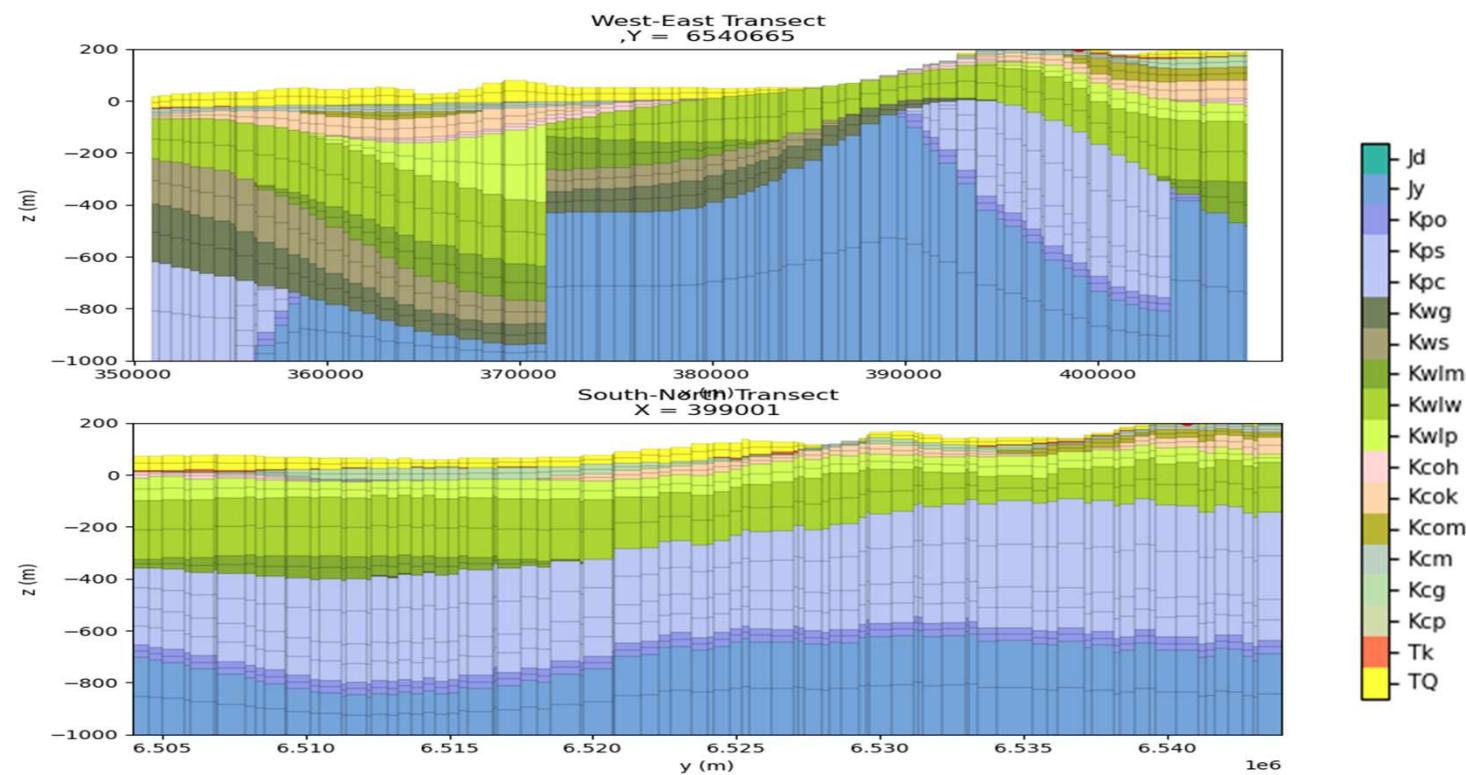
Cells identified based on xyz – NOT lay, row, col (gets messy when you use unstructured grids, but we've got you sorted)



Geomodel

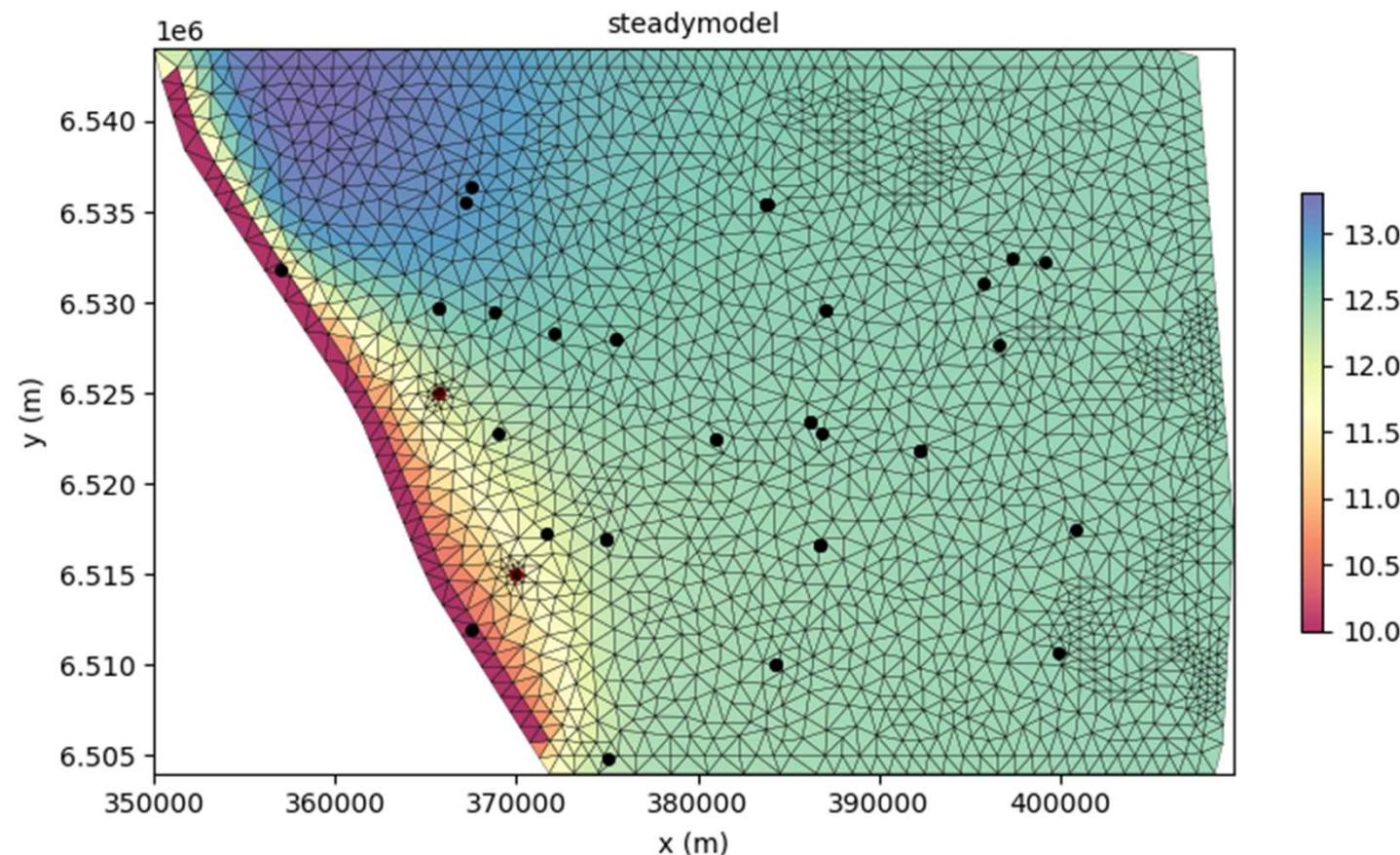
Structural model turned into a cell-based model with cells assigned hydrogeological properties

Inputs: Structural model, Mesh, grid type in transect (regular or conformable layers), number of sublayers



Flow model

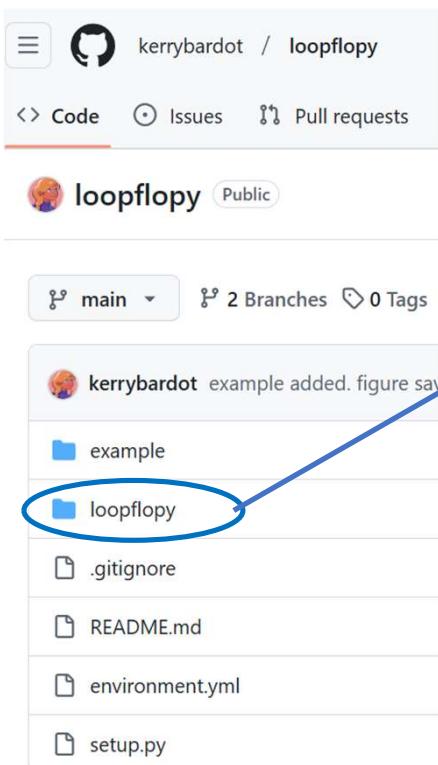
Geological model turned into a MODFLOW 6 model using unstructured grids in plan and section





Where it's at...

- All in Python
- Still under development, but usable
- Doesn't include option for geostatistics inside geometries – yet!



Under the hood modules:

- Project
- Spatial
- Mesh
- Structural (surface) model
- Geological (block) model
- Flow model
- Data and observations

DISV2DISU converter which turns MODFLOW 6 DISV “layered connectivity” grids to DISU “full connectivity” grids (by Christian Langevin USGS)

Where it's at...

A screenshot of a GitHub repository page for 'loopflopy'. The repository has 2 branches and 0 tags. A red arrow points from the 'example' folder in the file list to the 'Special cells' plot below.

- Code
- Issues
- Pull requests

loopflopy Public

main ▾ 2 Branches 0 Tags

kerrybardot example added, figure sav

example

loopflopy

.gitignore

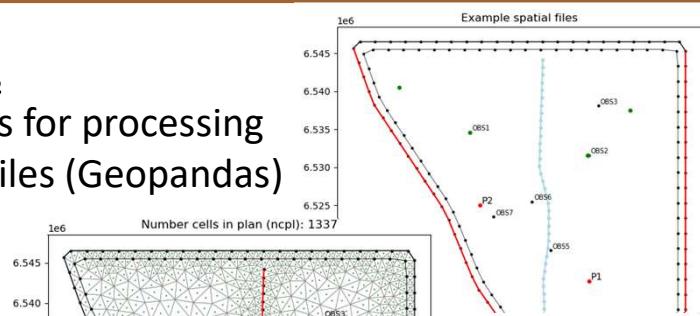
README.md

environment.yml

setup.py

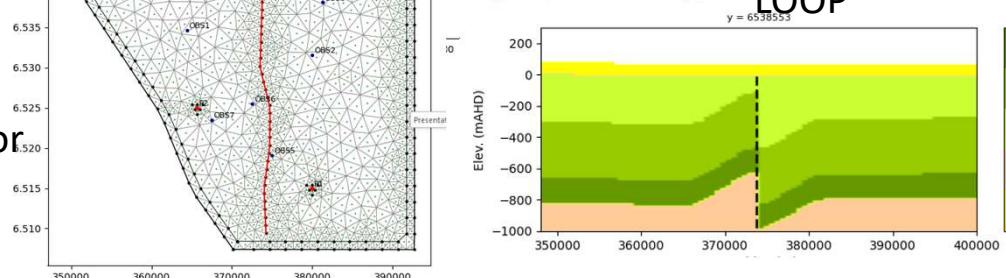
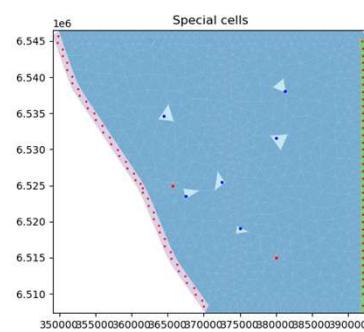
SPATIAL

Modules for processing spatial files (Geopandas)



MESH

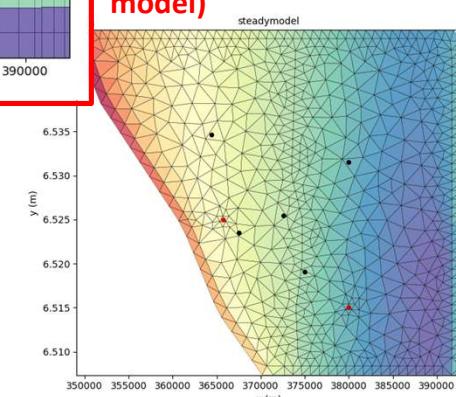
Modules for meshing



STRUCTURAL MODEL

Simple structural model example using LOOP

GEOMODEL
(converts mesh + structural model into lithology block model)



UTILS Modules for handling unstructured MODFLOW grids (cell IDs, plotting...)

Important Links

[LoopFlopy GitHub Repository](#)

[Loop Geological modelling Webpage](#)

[Flopy Documentation](#)

[Addressing Structural Uncertainty in Groundwater Models Using a Seamless Geological-Flow Modelling Workflow \(Pre-print\)](#)

[Full connectivity grids paper](#)

Would love your feedback moving forward – kerry.bardot@uwa.edu.au



Special thanks...

- Jim McCallum – worked on this together!
- Lachlan Grose – LoopStructural developer
- Christian Langevin - for DISV 2 DISU converter
- Florian Wellmann – pioneering work on structural uncertainty!

