

# Introduction to unconstrained inversion and petrophysical constraints using Tomofast-x

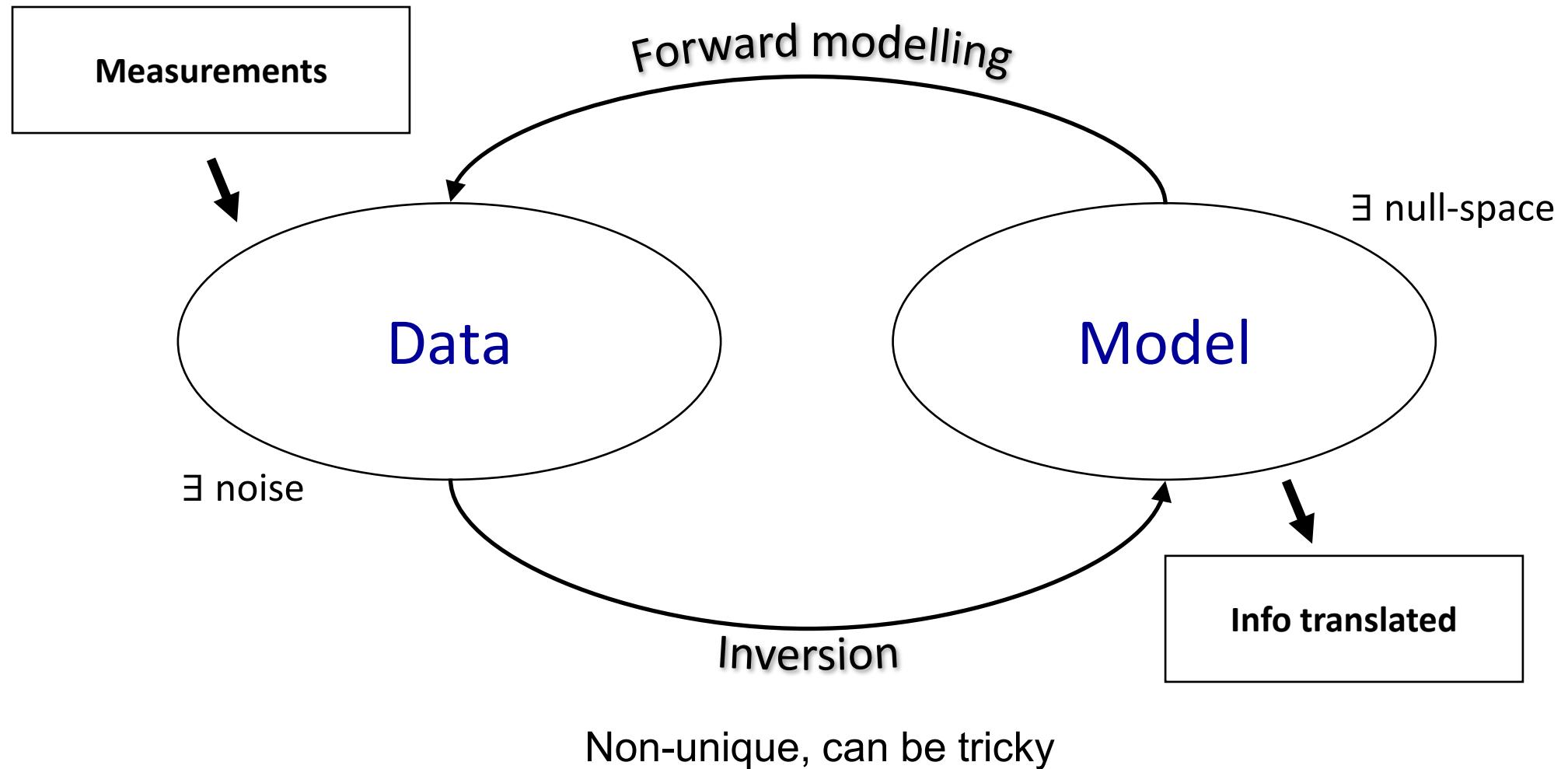
Vitaliy Ogarko, Kim Frankcombe (ExploreGeo), Taige Liu,  
Jeremie Giraud, Roland Martin, Mark Jessell



THE UNIVERSITY OF  
**WESTERN**  
**AUSTRALIA**



# Inversion in a nutshell





# Tomofast-x 2.0: an open-source parallel code for inversion of potential field data with topography using wavelet compression

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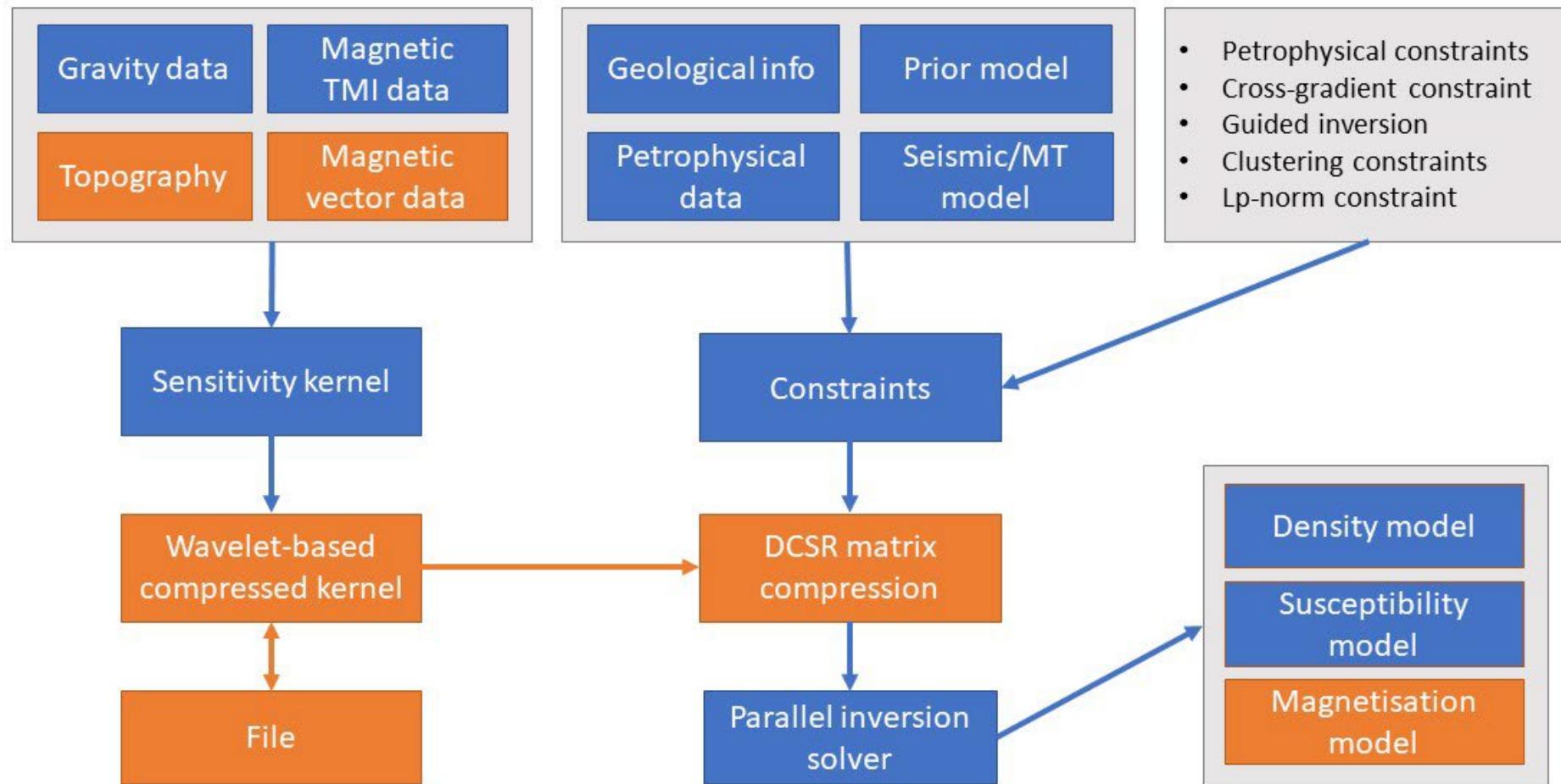
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Received: 2 October 2023 – Discussion started: 26 October 2023

Revised: 18 January 2024 – Accepted: 26 January 2024 – Published: 21 March 2024

<https://github.com/TOMOFAST/Tomofast-x>

# Tomofast-x 2.0 inversion workflow



# Formulation

$$\theta(\mathbf{d}, \mathbf{m})$$

$$= \alpha_d \left\| \mathbf{W}_d (\mathbf{d} - \mathbf{g}(\mathbf{m})) \right\|_{L_2}^2 \quad \leftarrow \text{Data}$$

$$+ \alpha_m \left\| \mathbf{W}_m (\mathbf{m} - \mathbf{m}_{pr}) \right\|_{L_p}^2 \quad \leftarrow \text{Prior model}$$

$$+ \alpha_g \left\| \mathbf{W}_g \nabla \mathbf{m} \right\|_{L_2}^2 \quad \leftarrow \text{Smoothness}$$

$$+ \alpha_x \left\| \mathbf{W}_x (\nabla \mathbf{m}_1 \times \nabla \mathbf{m}_2) \right\|_{L_2}^2 \quad \leftarrow \text{Cross-gradient}$$

$$+ \alpha_{pe} \left\| \mathbf{W}_{pe} \mathbf{P}(\mathbf{m}) \right\|_{L_2}^2 \quad \leftarrow \text{Petrophysics (clustering)}$$

$$+ \alpha_a \left\| \mathbf{W}_a (\mathbf{m} - \mathbf{v} + \mathbf{u}) \right\|_{L_2}^2 \quad \leftarrow \text{Petrophysics (ADMM)}$$

Each term = Parameter file section

# Formulation

$$\theta(d, m)$$

$$= \alpha_d \|W_d(d - g(m))\|_{L_2}^2 \leftarrow \text{Data}$$

$$+ \alpha_m \|W_m(m - m_{pr})\|_{L_p}^2 \leftarrow \text{Prior model}$$

```
=====
DATA parameters
=====
forward.data.grav.nData      = 256
forward.data.grav.dataGridFile = data/gravmag/mansf_slice/data_grid.txt
forward.data.grav.dataValuesFile = output/mansf_slice/grav_calc_read_data.txt

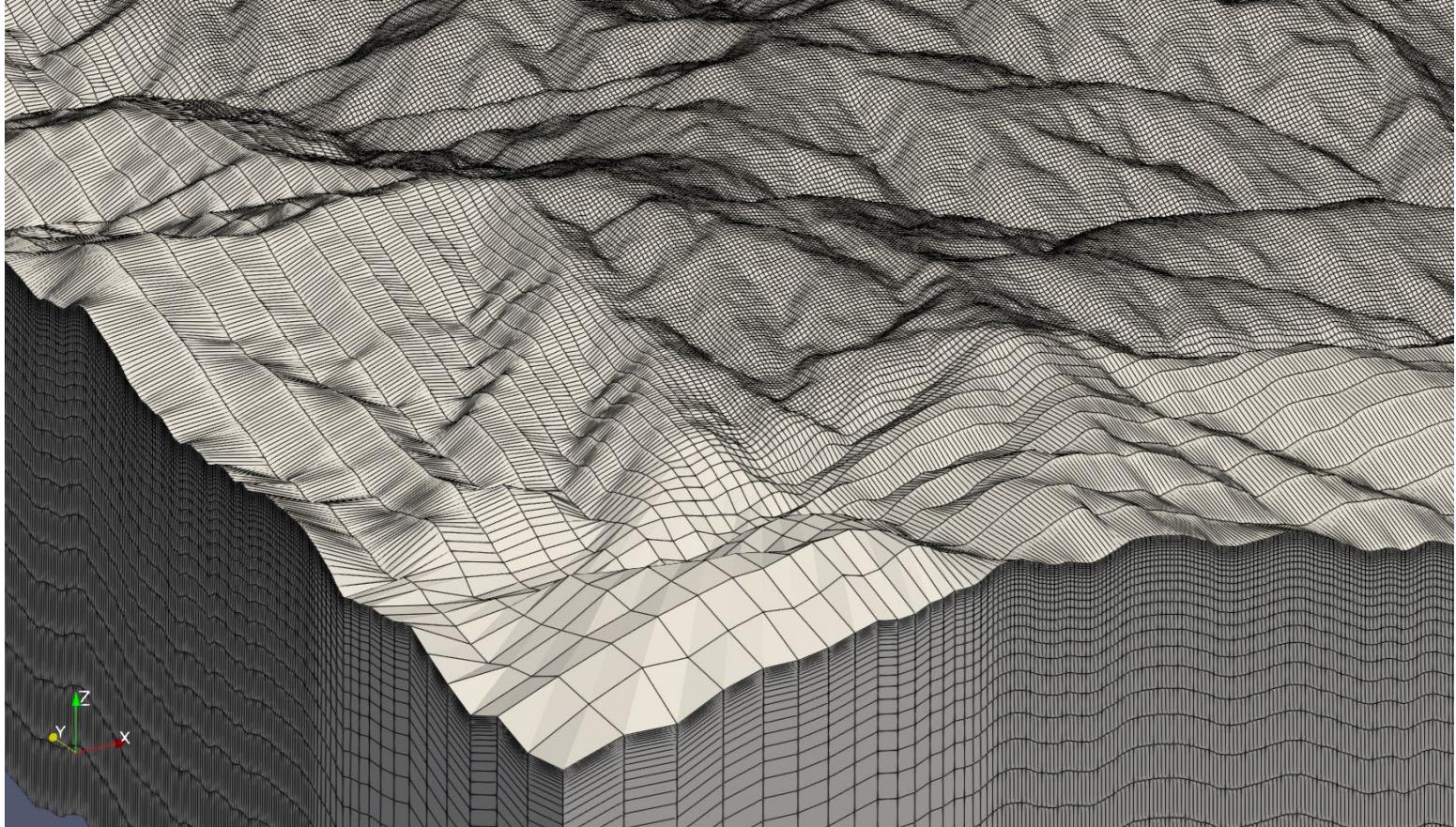
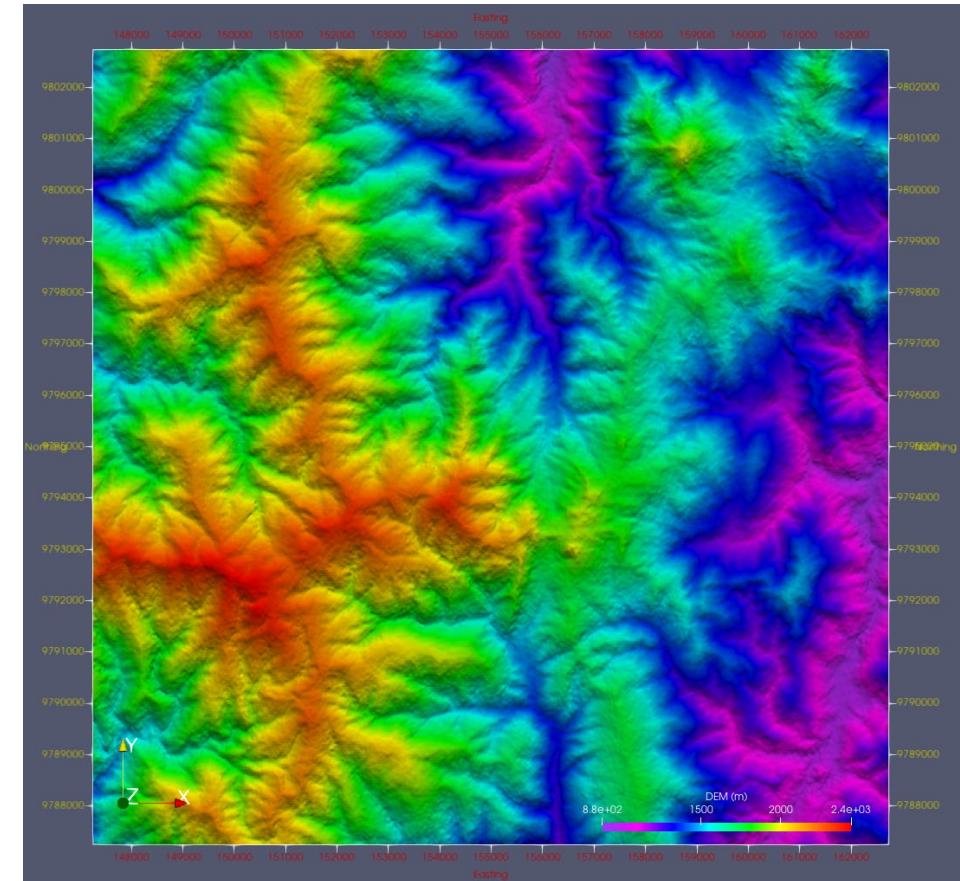
=====
MODEL DAMPING (m - m_prior)
=====
inversion.modelDamping.grav.weight = 1.d-11
inversion.modelDamping.normPower = 2.0d0
```

ustering)

DMM)

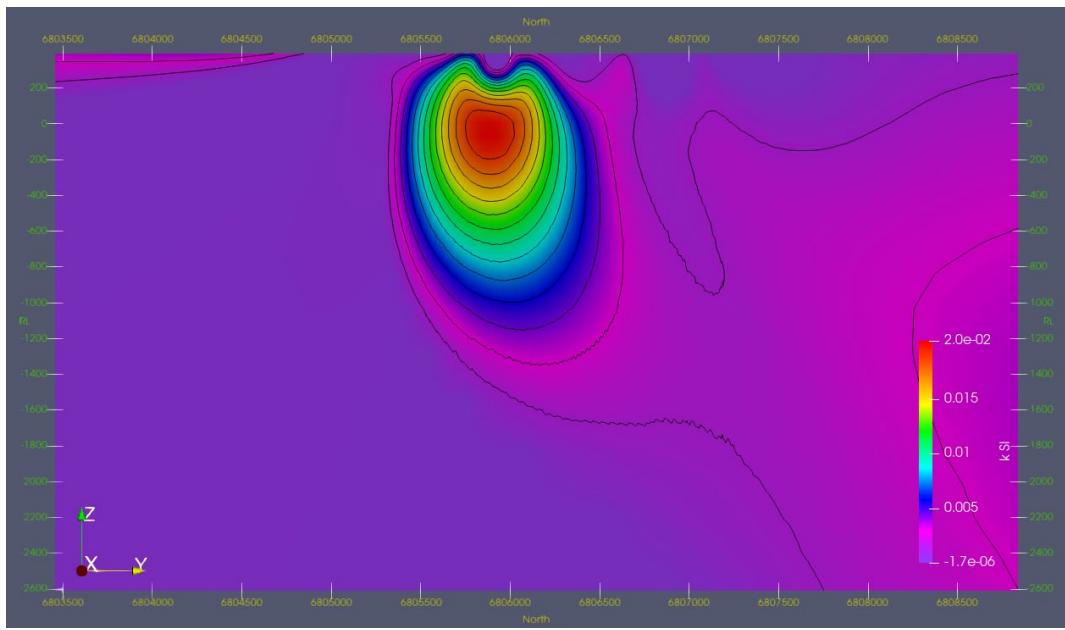
Each term = Parameter file section

# Topography

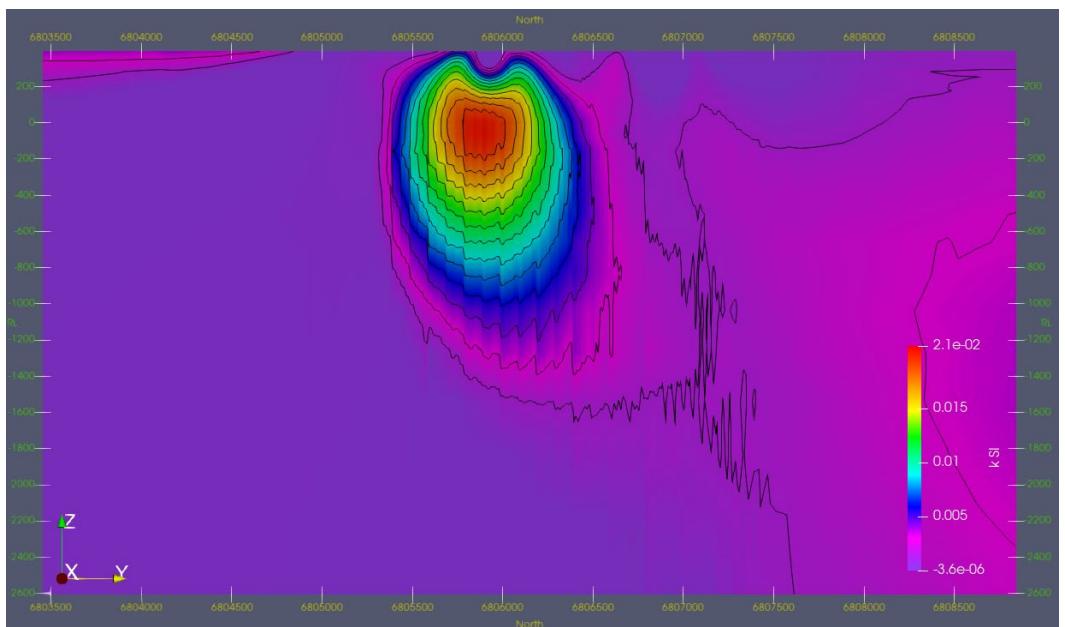


# Wavelet compression

- Can be used to reduce the size of the problem by up to **three orders of magnitude** without seriously impacting on the solution.
- Speeds up the inversion by **an order of magnitude**.
- Compressed kernel can be later reused (e.g. imported in Python code).



Compression = 5%

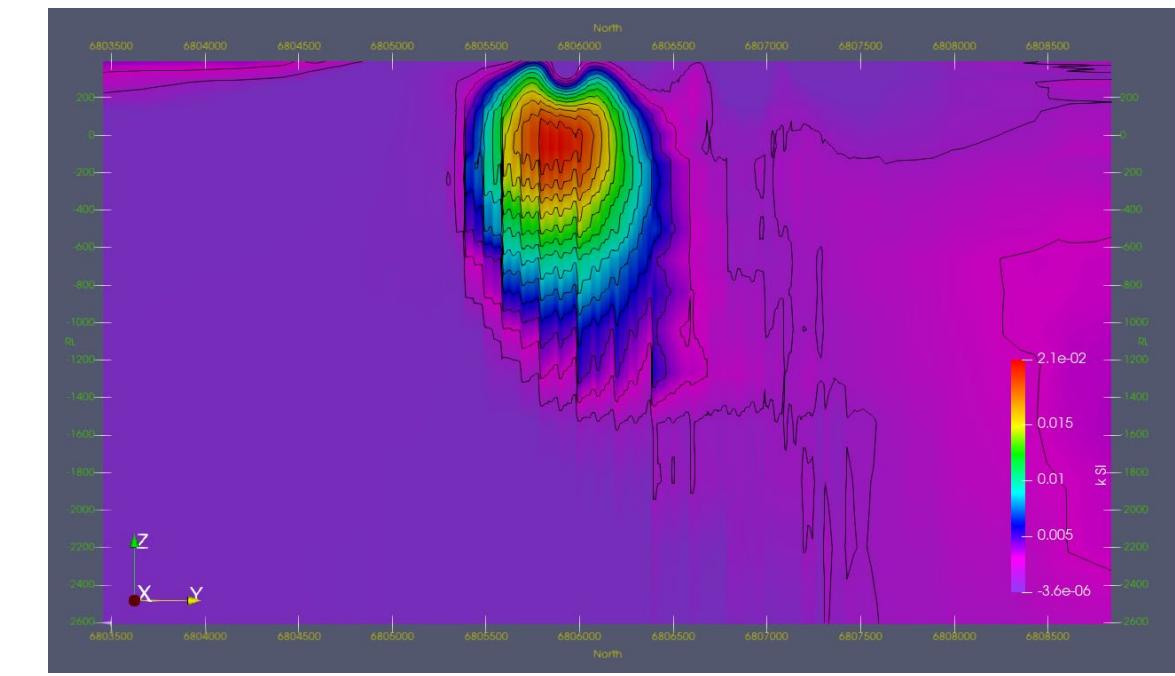


Compression = 1%

## Magnetic field data example

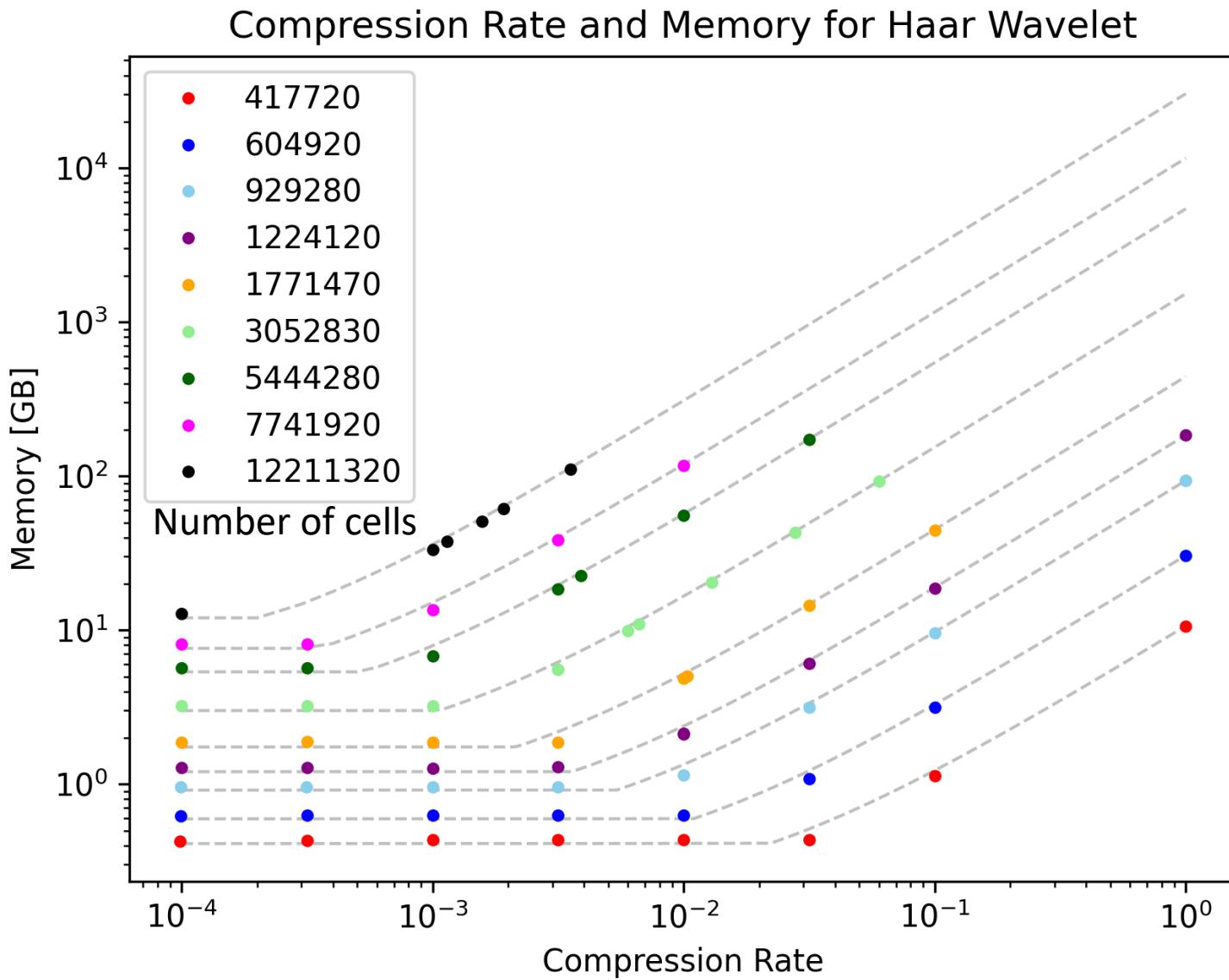
Model size = 242 x 218 x 27 cells

Number of data = 35,200



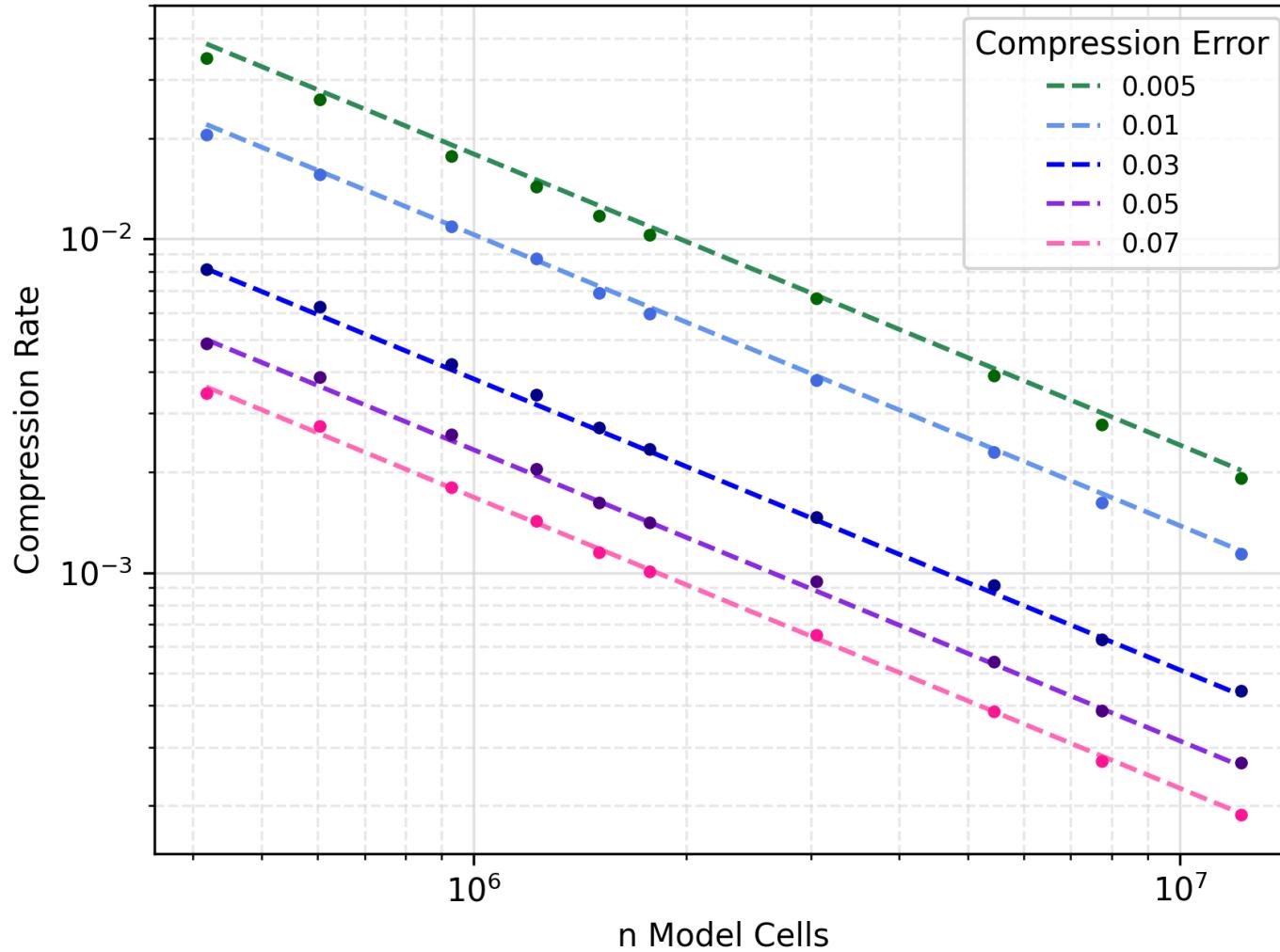
Compression = 0.5%

# Memory usage for different compression rates



- Accurate memory prediction.
- Can reduce memory by 3 orders of magnitude.

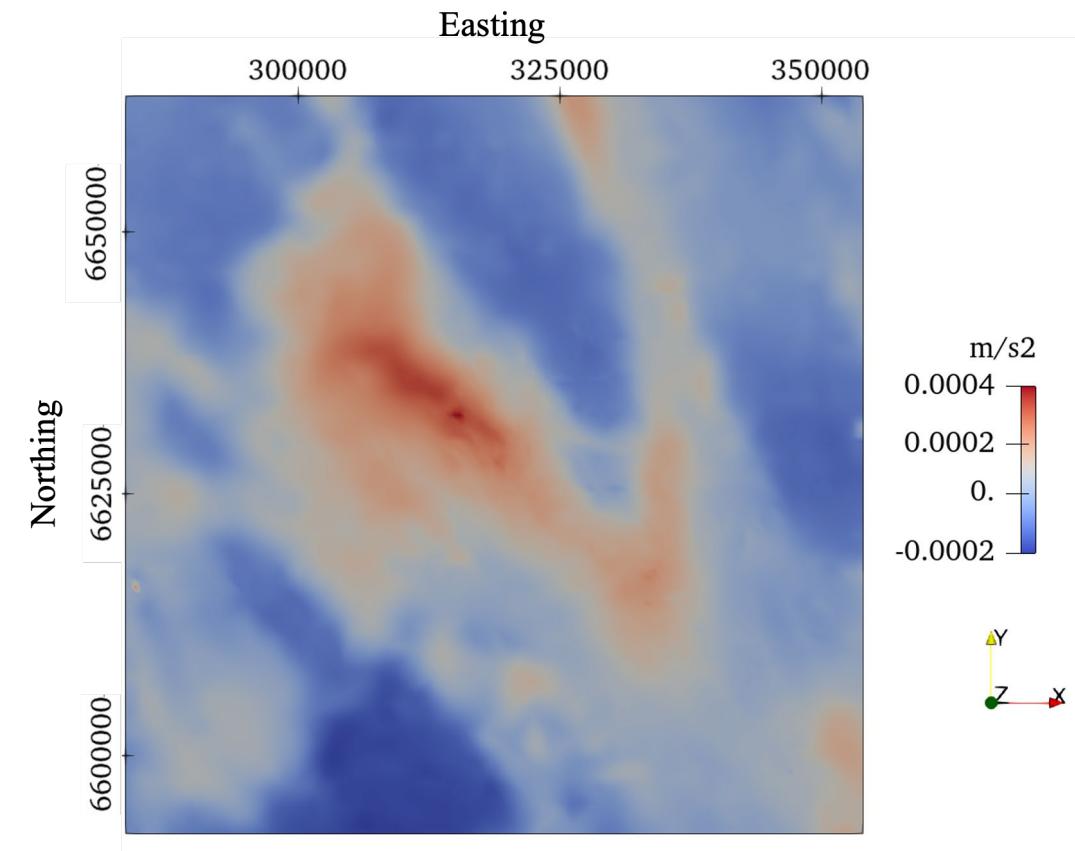
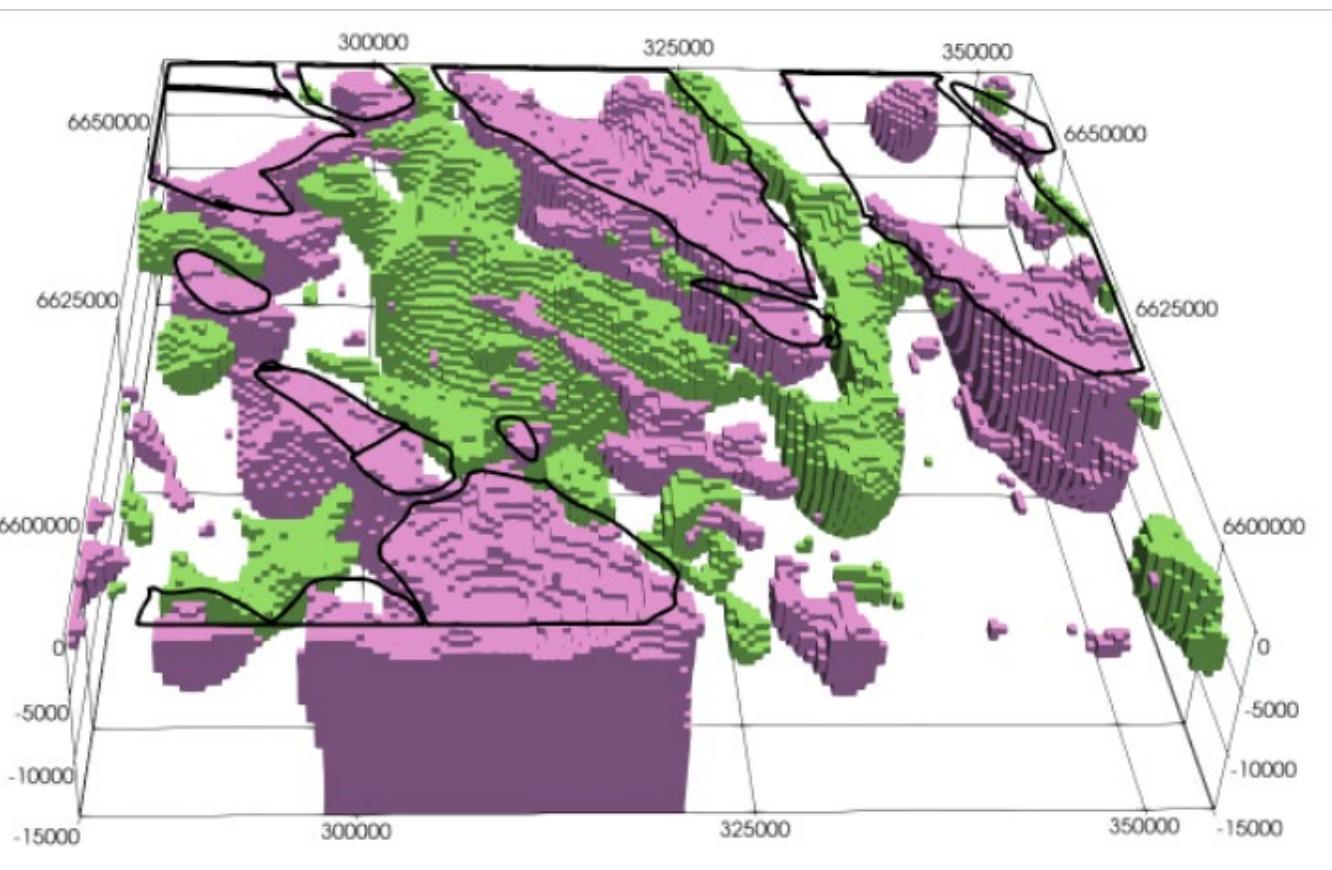
# Compression rate for different compression errors



Compression error =  $\frac{\|S_{true} - S_{comp}\|}{\|S_{true}\|}$ ,  
where  $S$  is sensitivity matrix.

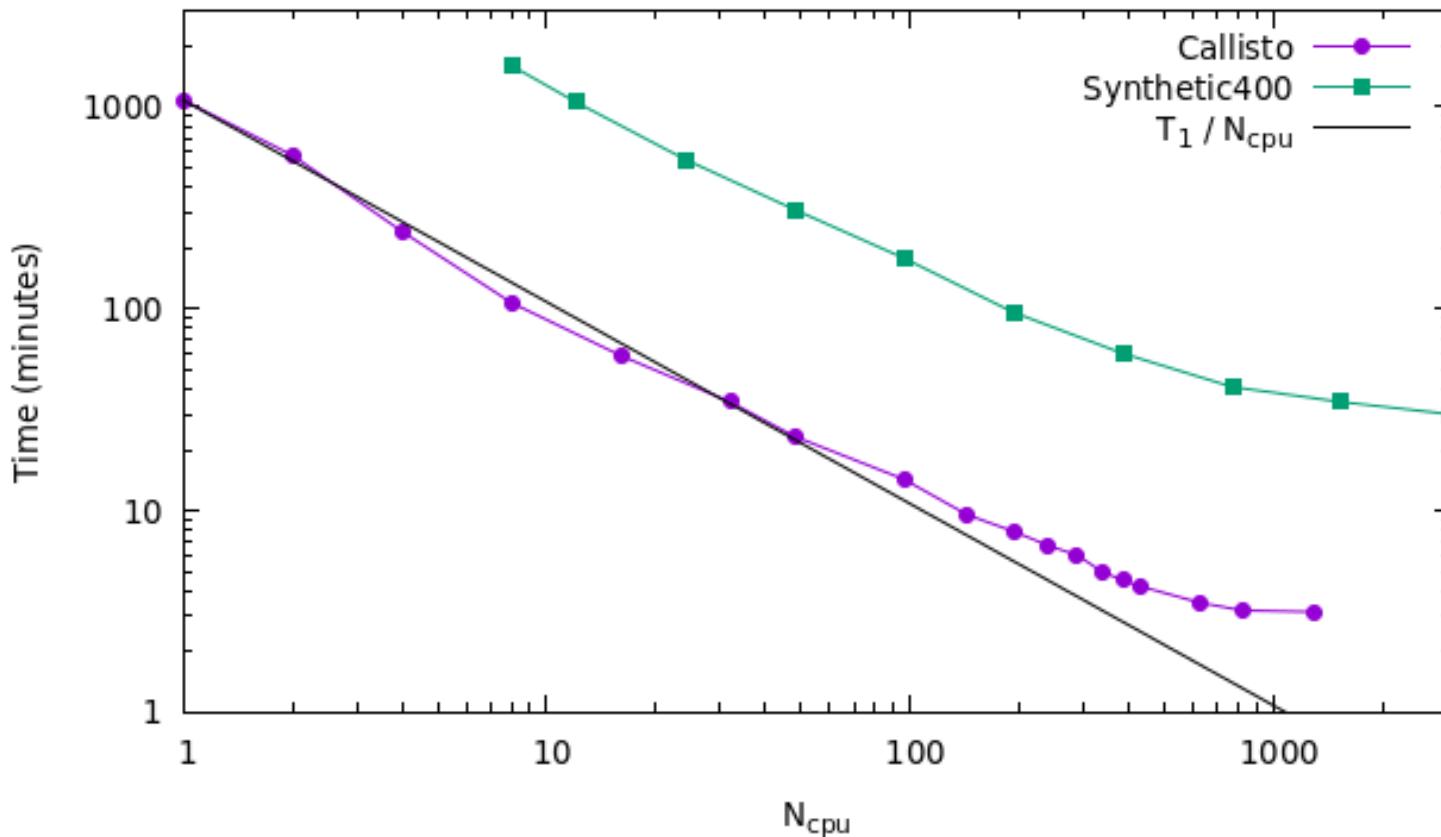
- Power laws scaling for a fixed compression error.
- Can predict optimal compression rate for any model size.

# Inverted density model example



In black is the different Yilgarn Craton granites from the 1:2.5M State interpreted bedrock geology.  
Pink = density anom.  $< -100 \text{ kg/m}^3$  = granite  
Green = density anom.  $> +80 \text{ kg/m}^3$  = greenstones

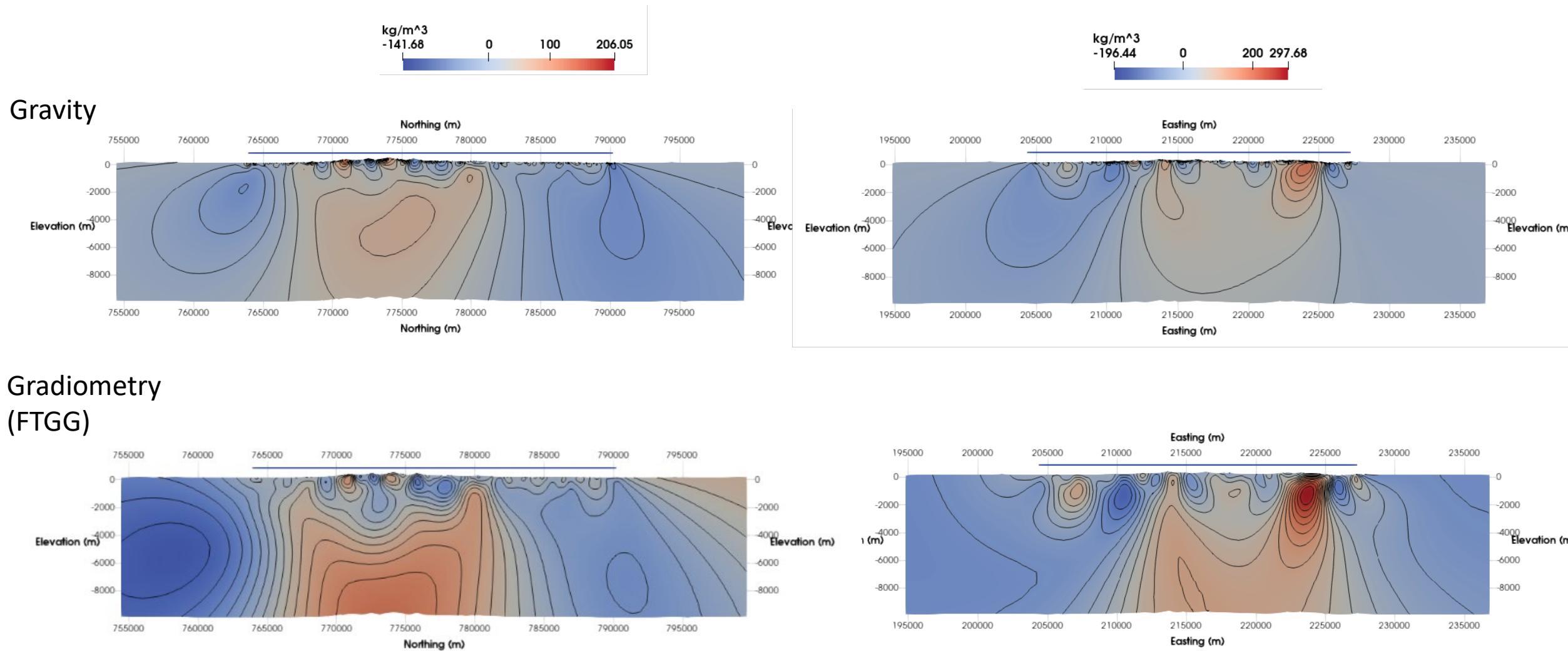
# Parallel tests using supercomputer Gadi (NCI)



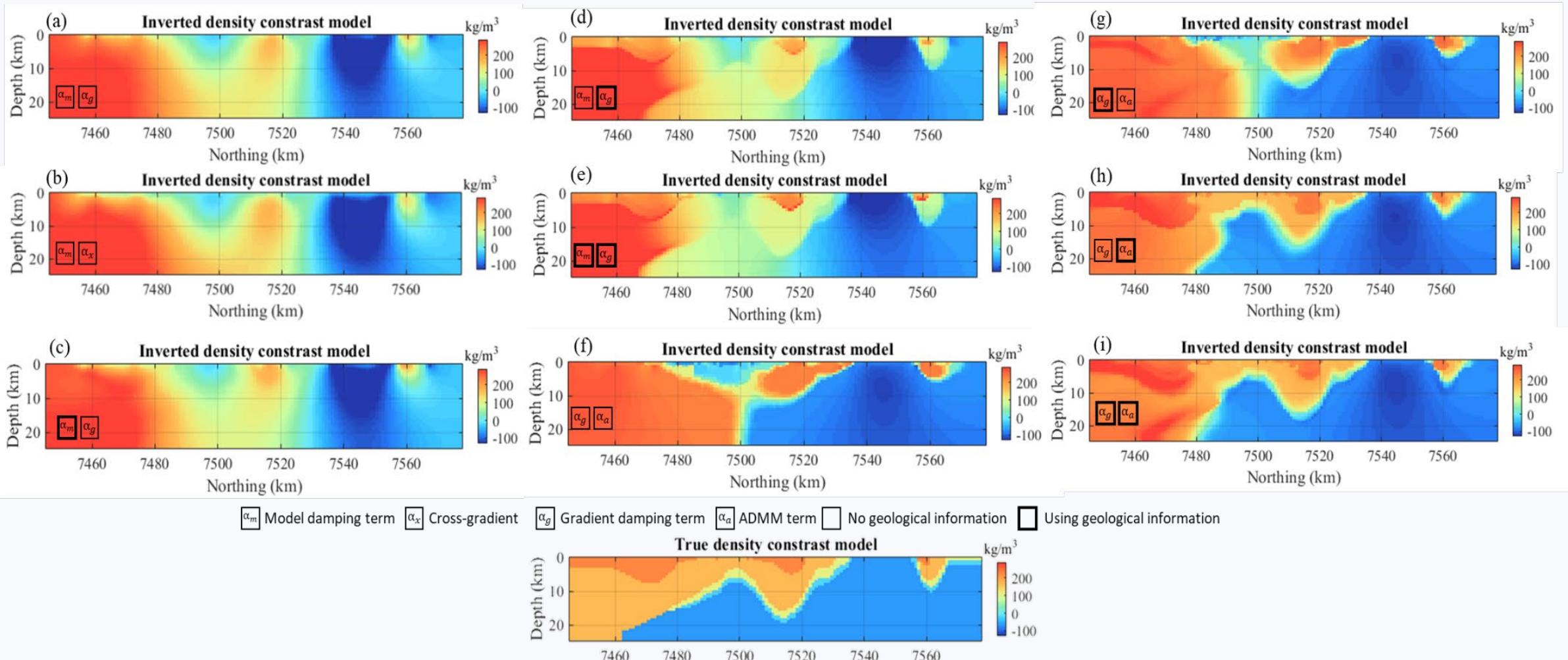
- Efficient parallelisation.
- Can save time by 2 orders of magnitude.

Name	$\Delta$ East	$\Delta$ North	Depth	Releif	Nz	<th>Nz</th> <th>Ndata</th>	Nz	Ndata
Synthetic400	10000 (+5904)	10000 (+5904)	3290	1457.6	400 (+40)	400 (+40)	28	158006
Callisto	2500 (+3402)	2200 (+3402)	3290	24.6	200 (+42)	176 (+42)	27	35200

# Gravity vs Full tensor gravity gradiometry

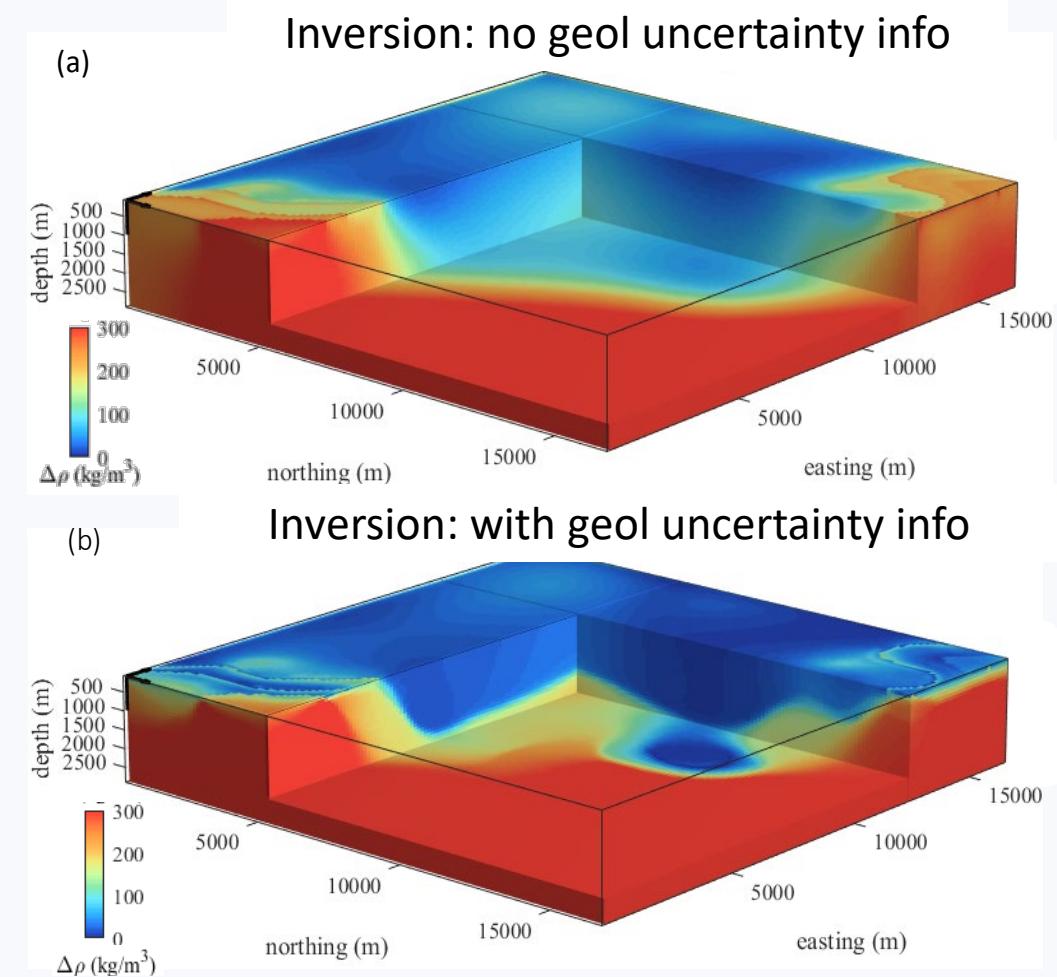
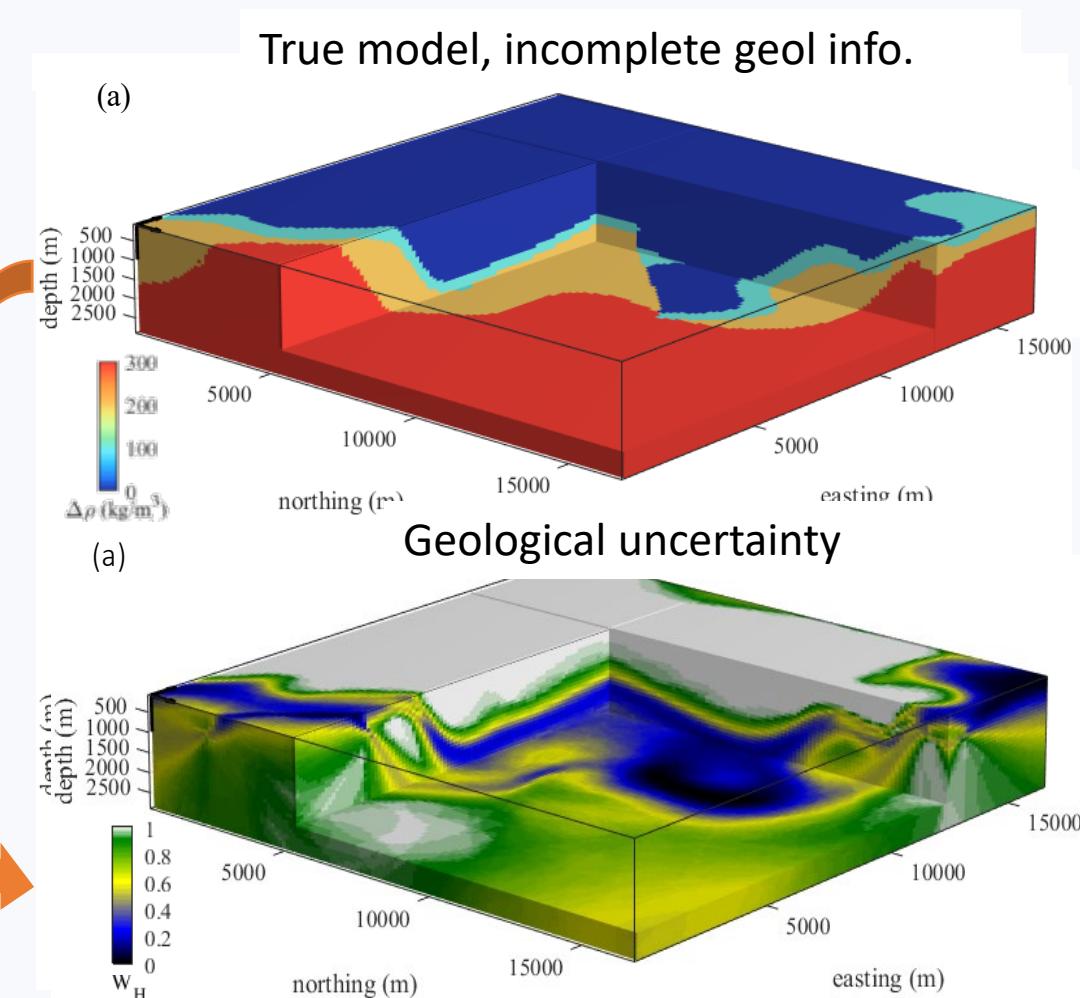


# Different types of constraints

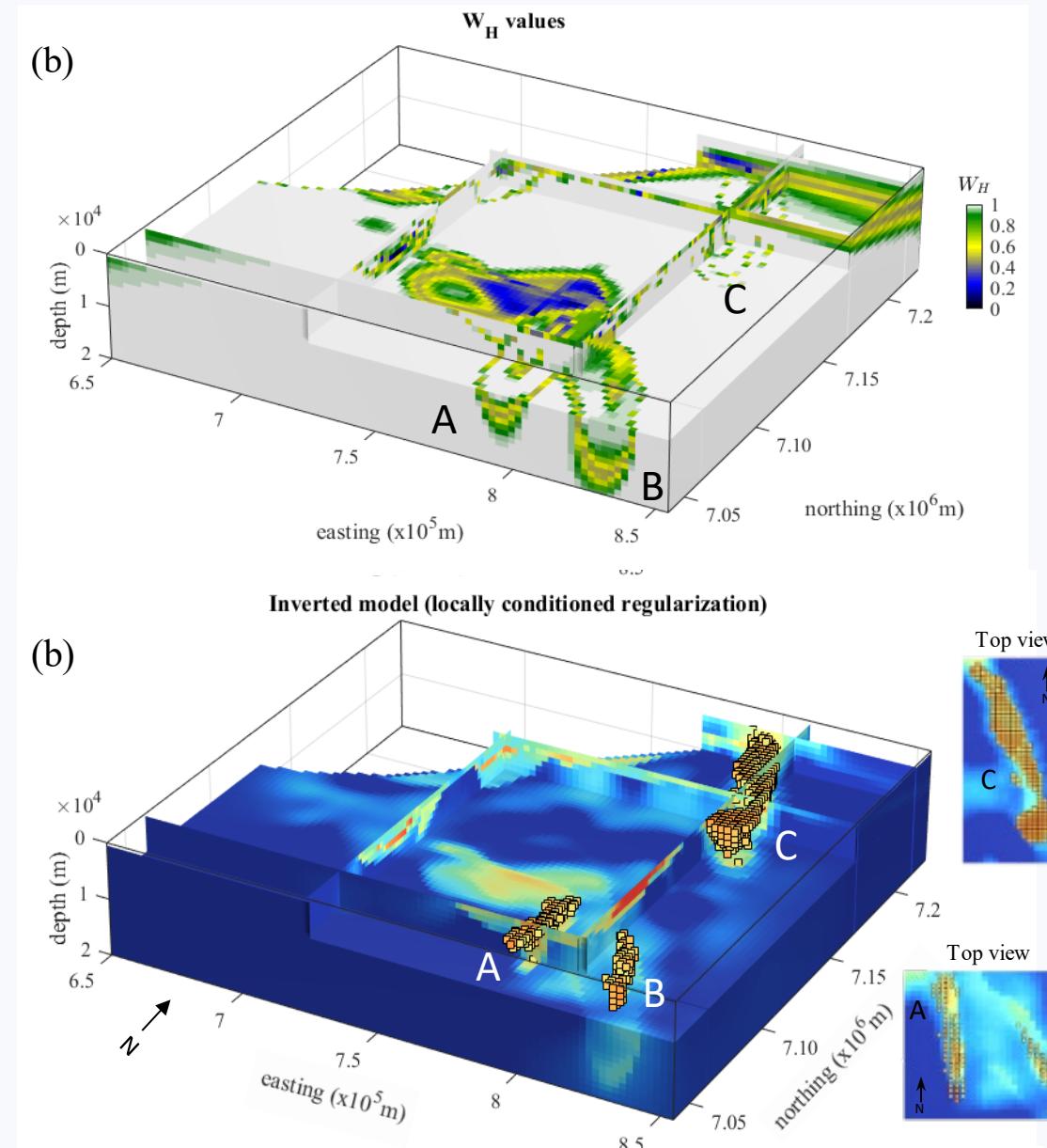
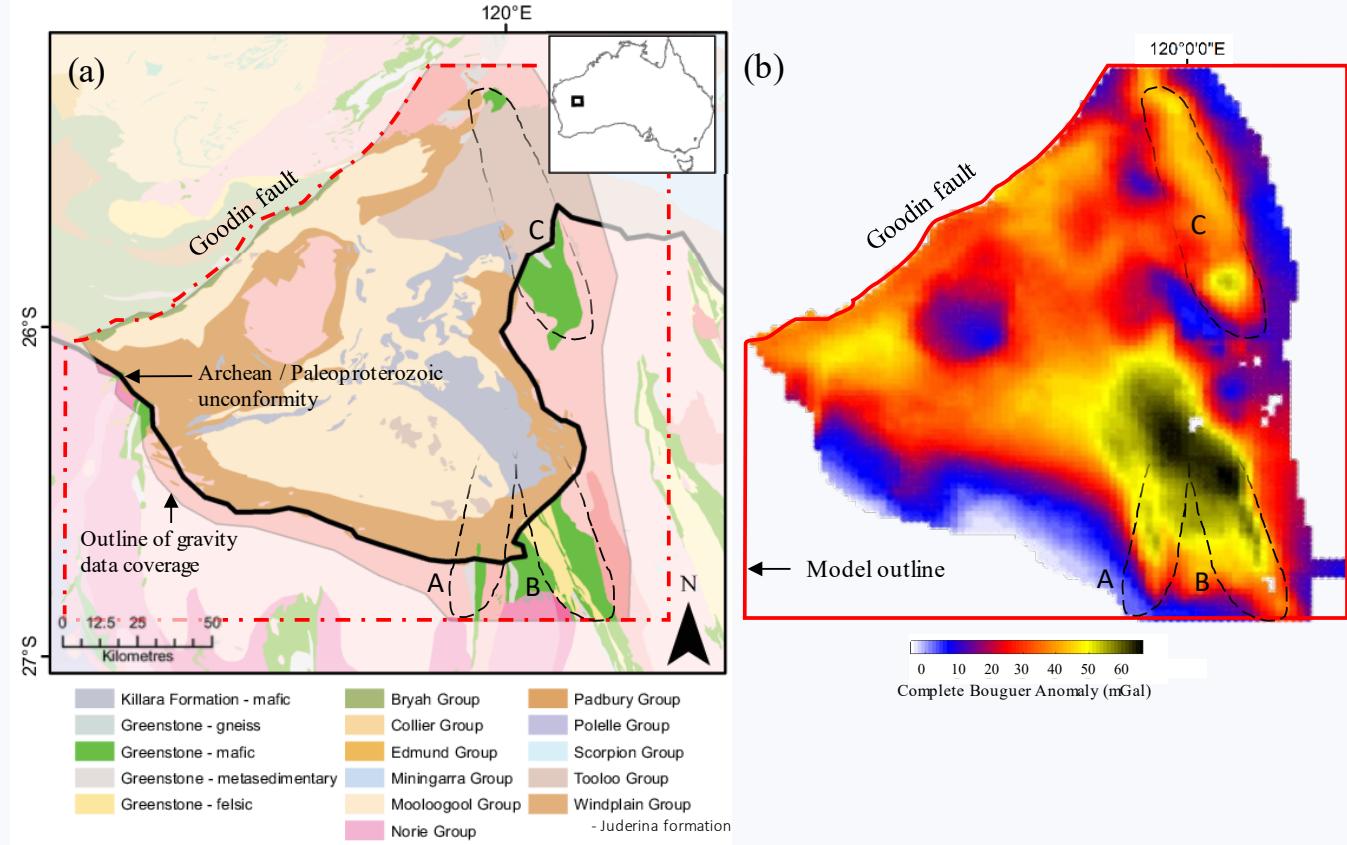


# Local gradient regularization

McMC on  
geology



# Local gradient regularization



# Cross gradient constraints

JOURNAL ARTICLE

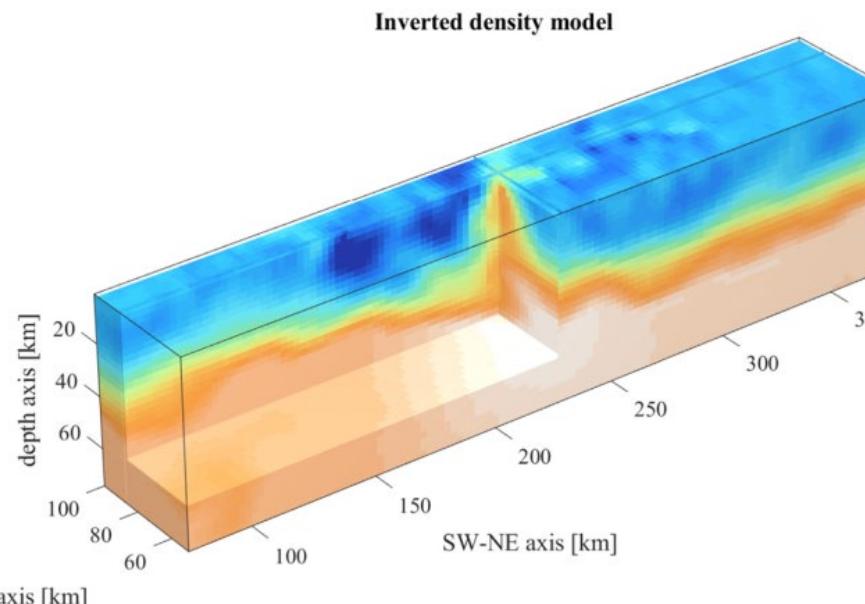
Three-dimensional gravity anomaly data inversion in the Pyrenees using compressional seismic velocity model as structural similarity constraints

 Get access >

Roland Martin , Jérémie Giraud, Vitaliy Ogarko, Sébastien Chevrot, Stephen Beller, Pascal Gégout, Mark Jessell

*Geophysical Journal International*, Volume 225, Issue 2, May 2021, Pages 1063–1085,  
<https://doi.org/10.1093/gji/ggaa414>

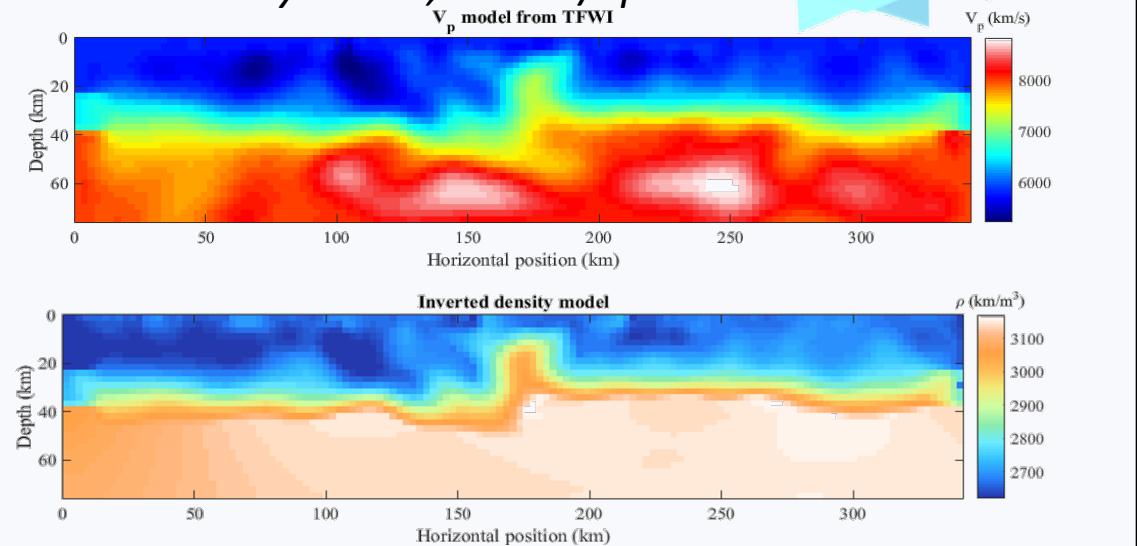
Published: 01 September 2020 Article history ▾



## Cross-gradient with Vp

- Exploit structural and petrophysical info and horizontal resolution of seismic
- Reconcile different geophysics

Western Pyrenees, France/Spain

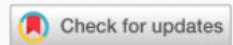


Martin et al. 2020

# Petrophysical constraints (ADMM)

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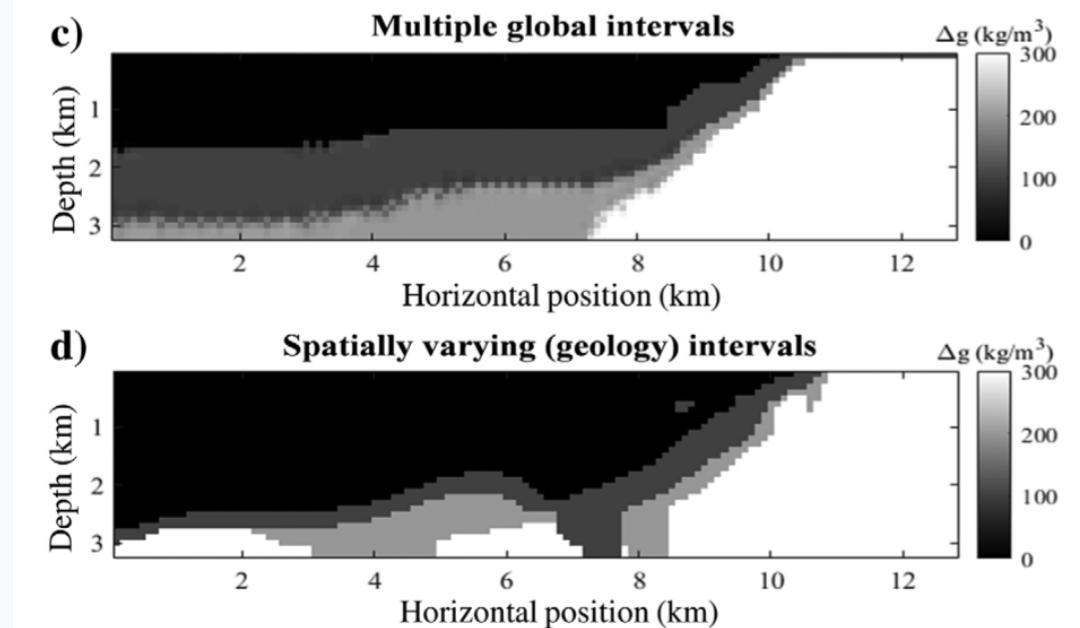
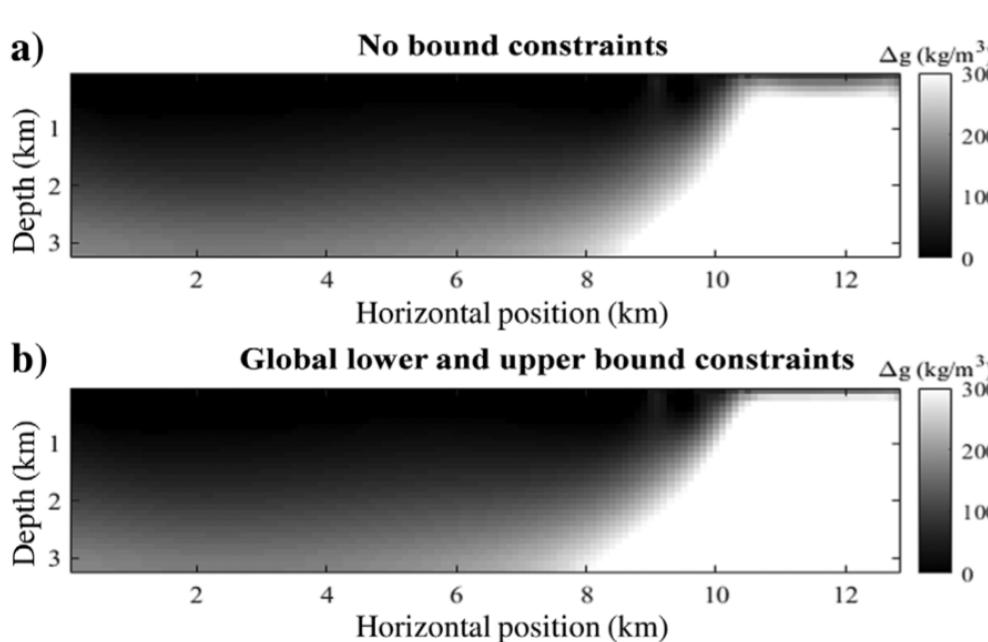
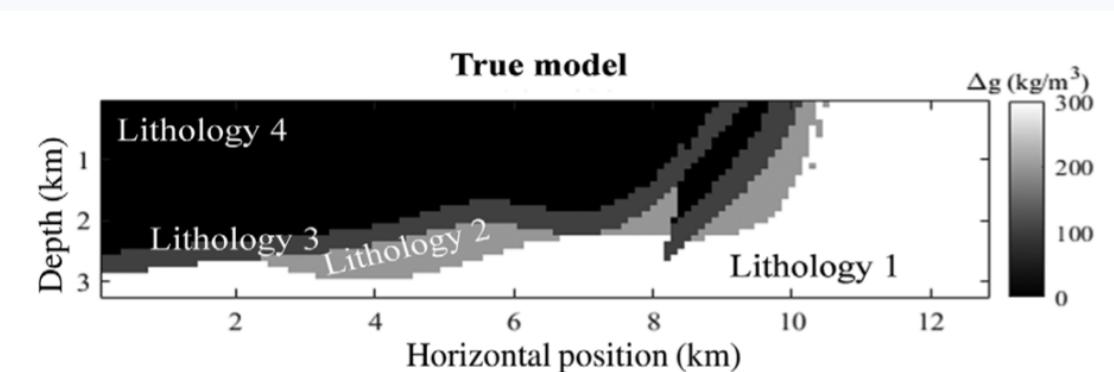
## Disjoint interval bound constraints using the alternating direction method of multipliers for geologically constrained inversion: Application to gravity data

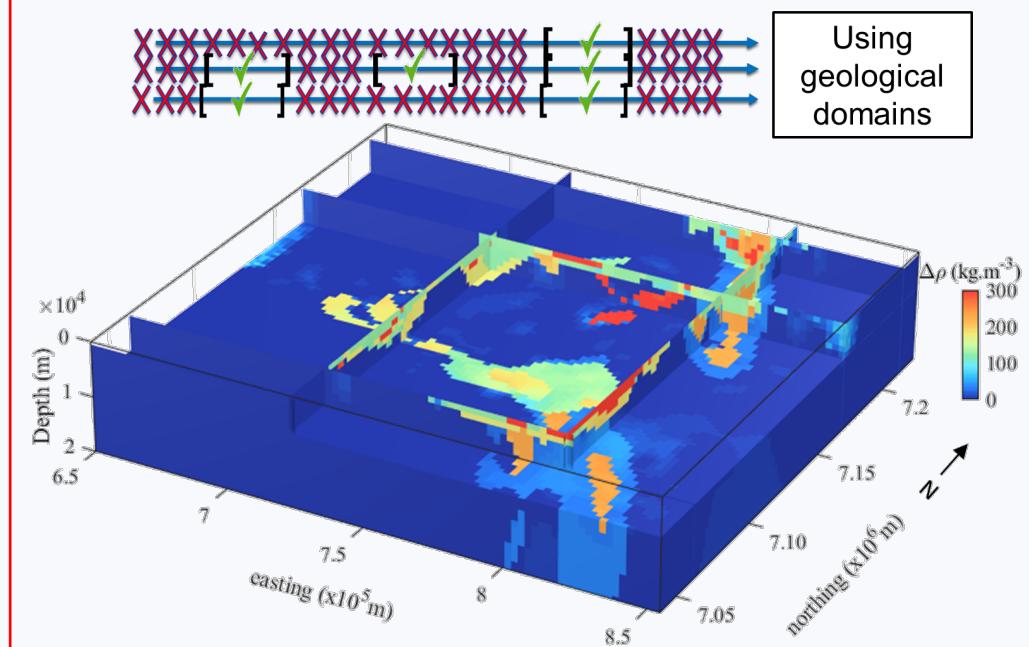
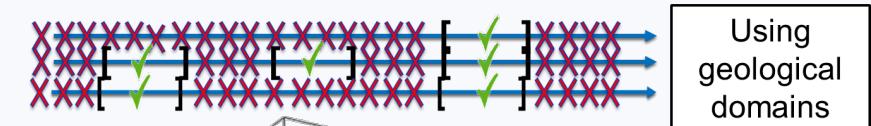
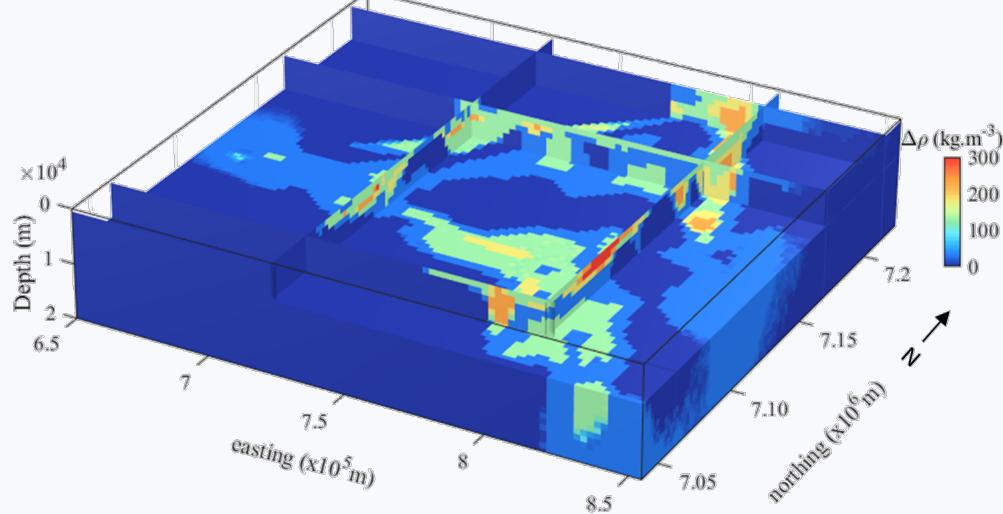
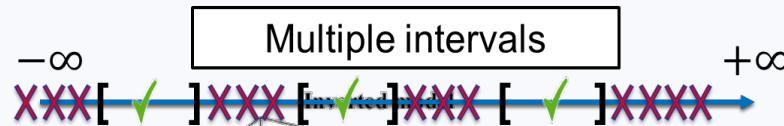
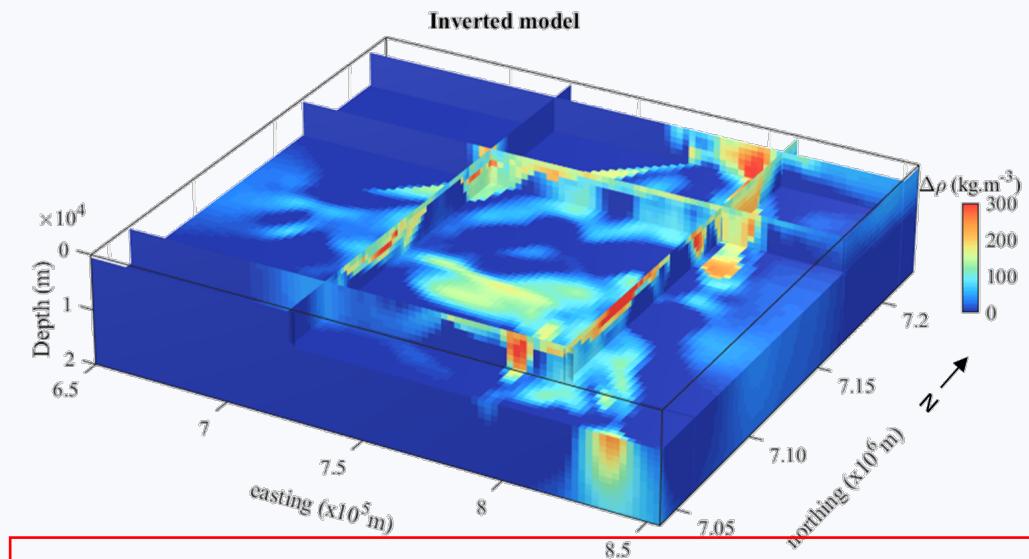
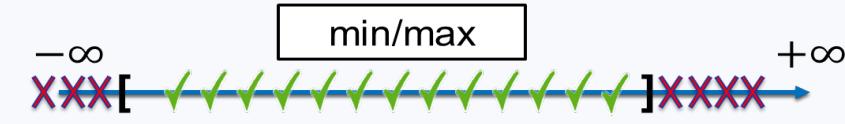
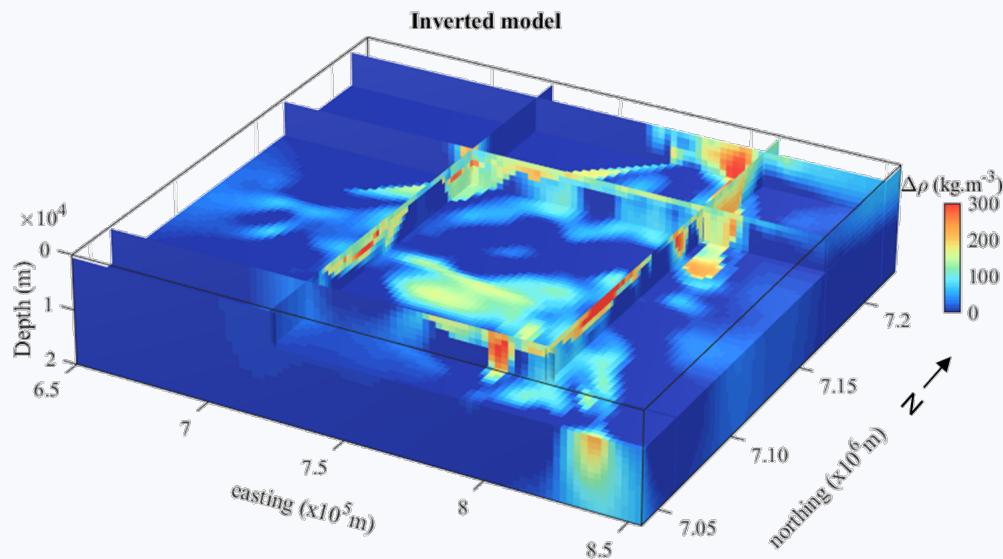


Authors:

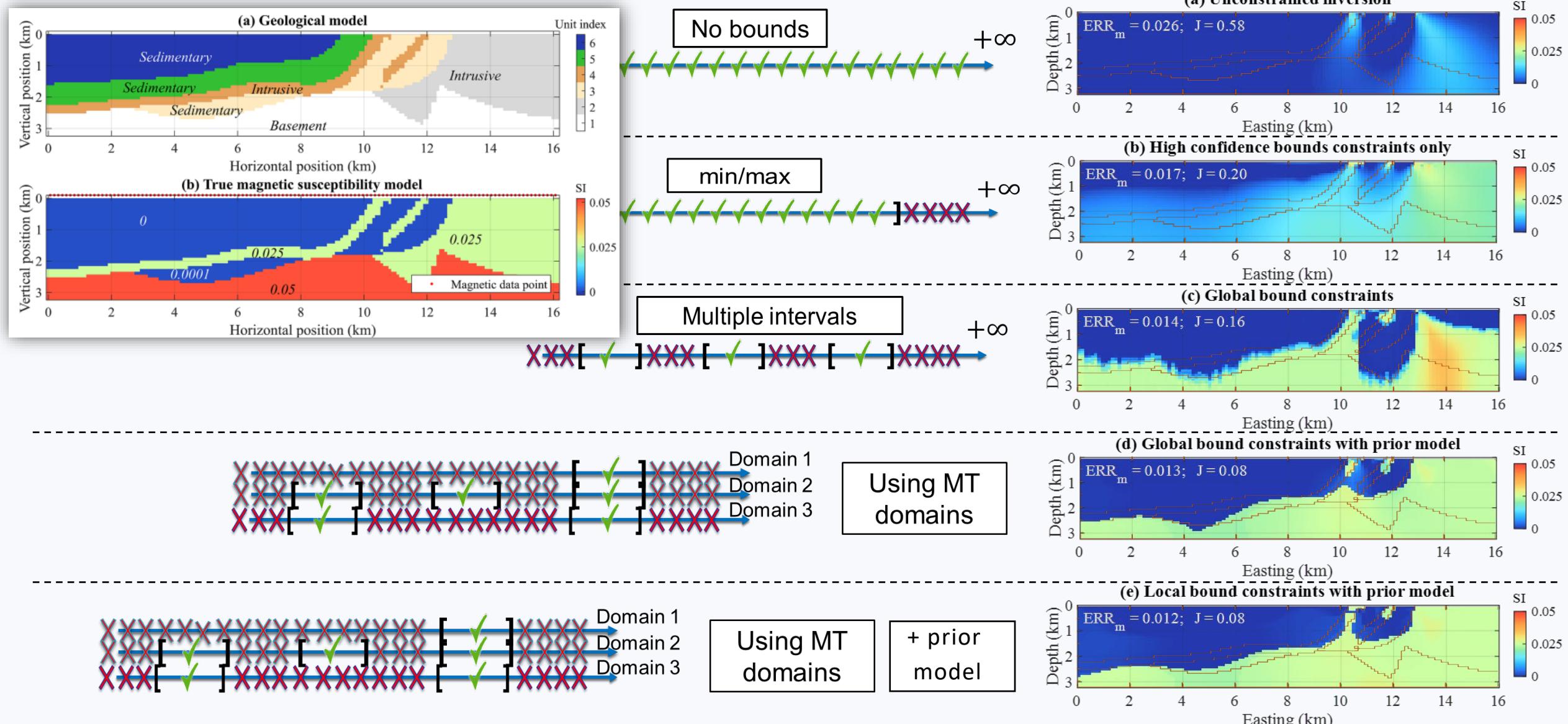
Vitaliy Ogarko Jérémie Giraud Roland Martin and Mark Jessell

<https://doi.org/10.1190/geo2019-0633.1>

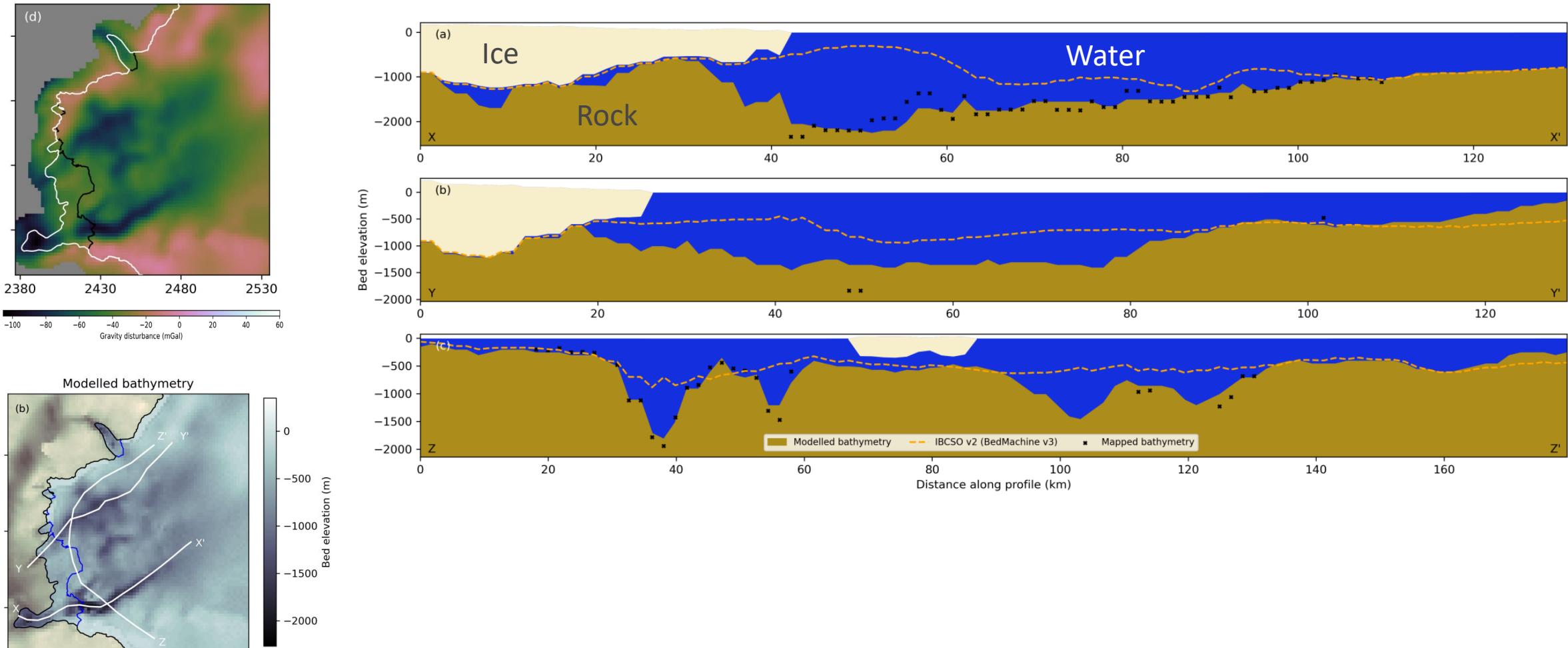




# Using MT to constrain magnetic inversion



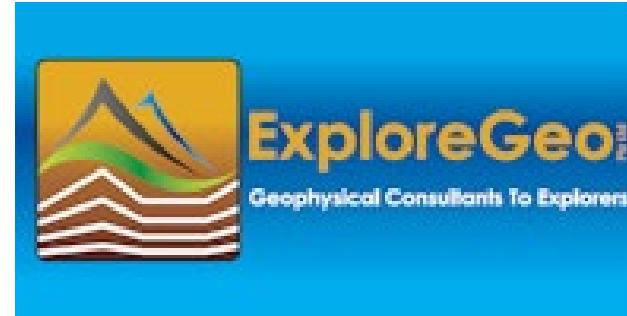
# Gravity-derived Antarctic bathymetry using the Tomofast-x open-source code: a case study of Vincennes Bay (in review)



# Commercial applications of Tomofast-x

Images provided by ExploreGeo

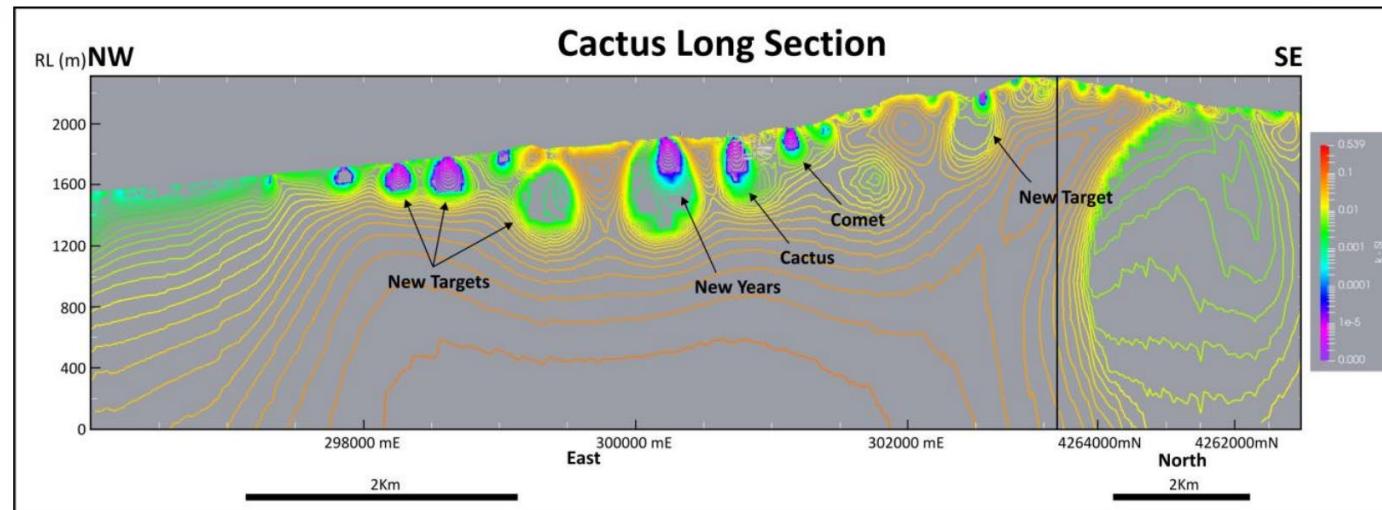
<https://www.exploregeo.com.au/>

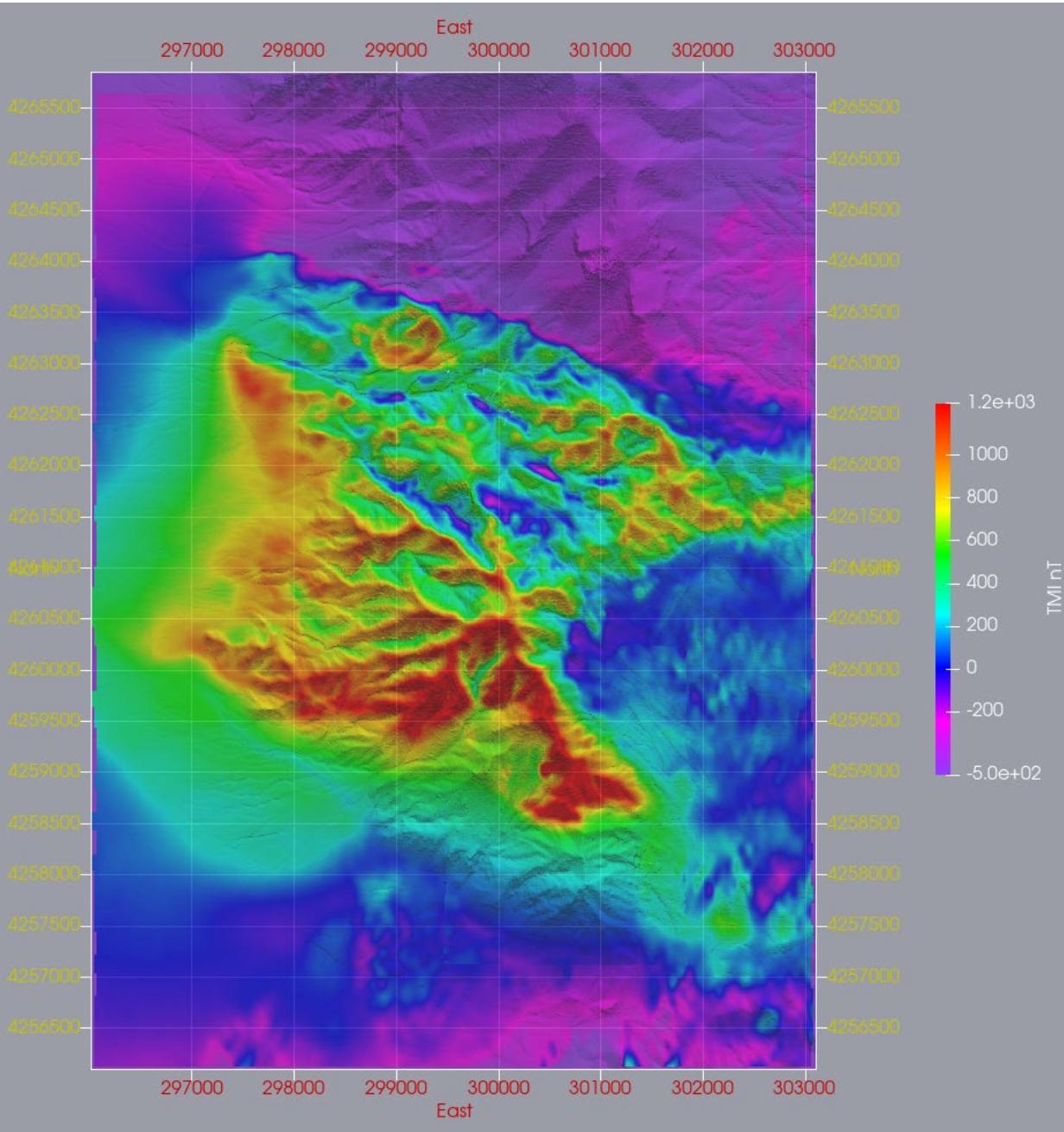


# Example 1: Searching for magnetite destruction in strong topography

Published in Australian Stock Exchange (ASX):

**New Modelling Highlights Multiple Untested Copper-Gold Targets at Frisco, Utah, USA**  
22 February 2024  
Alderan Resources Limited

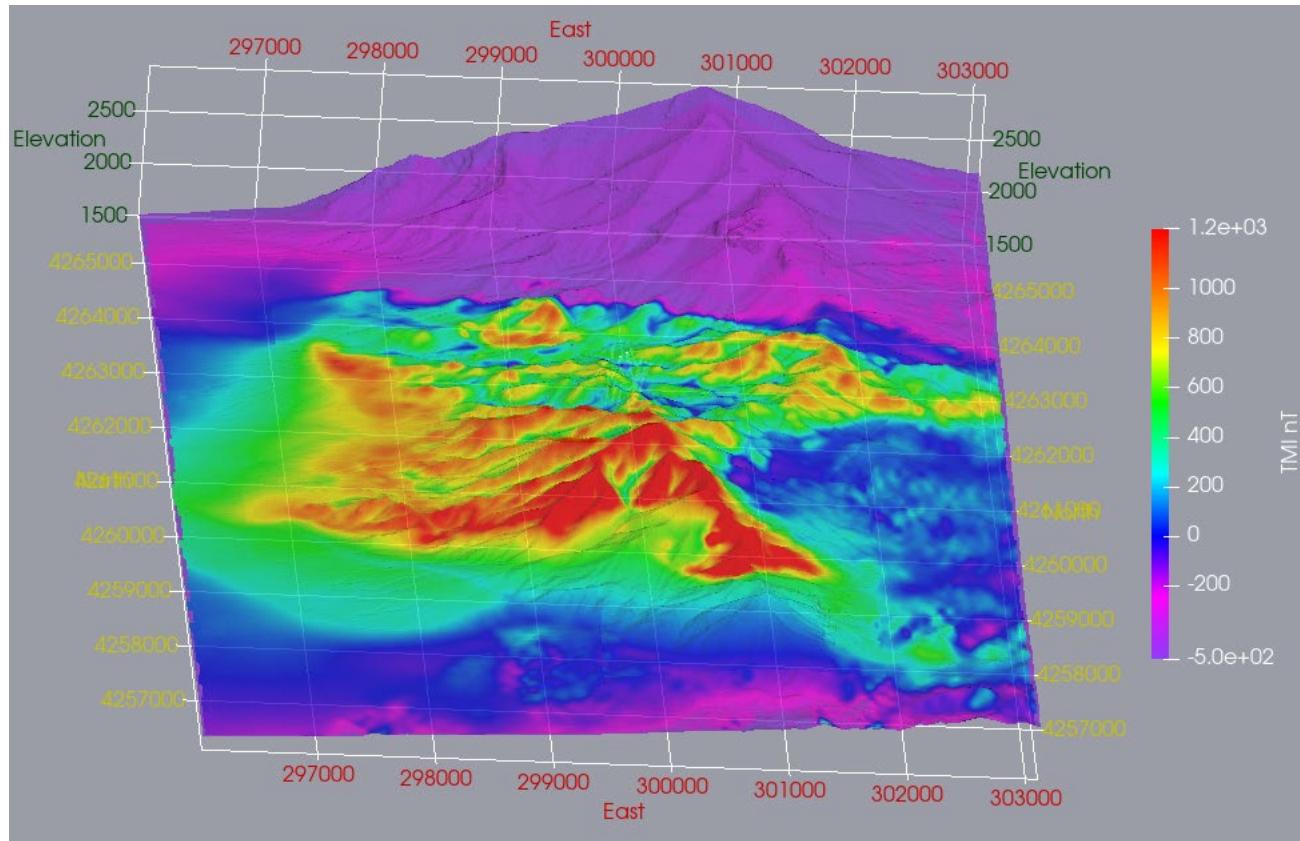




## TMI draped on shaded DEM: strong correlation

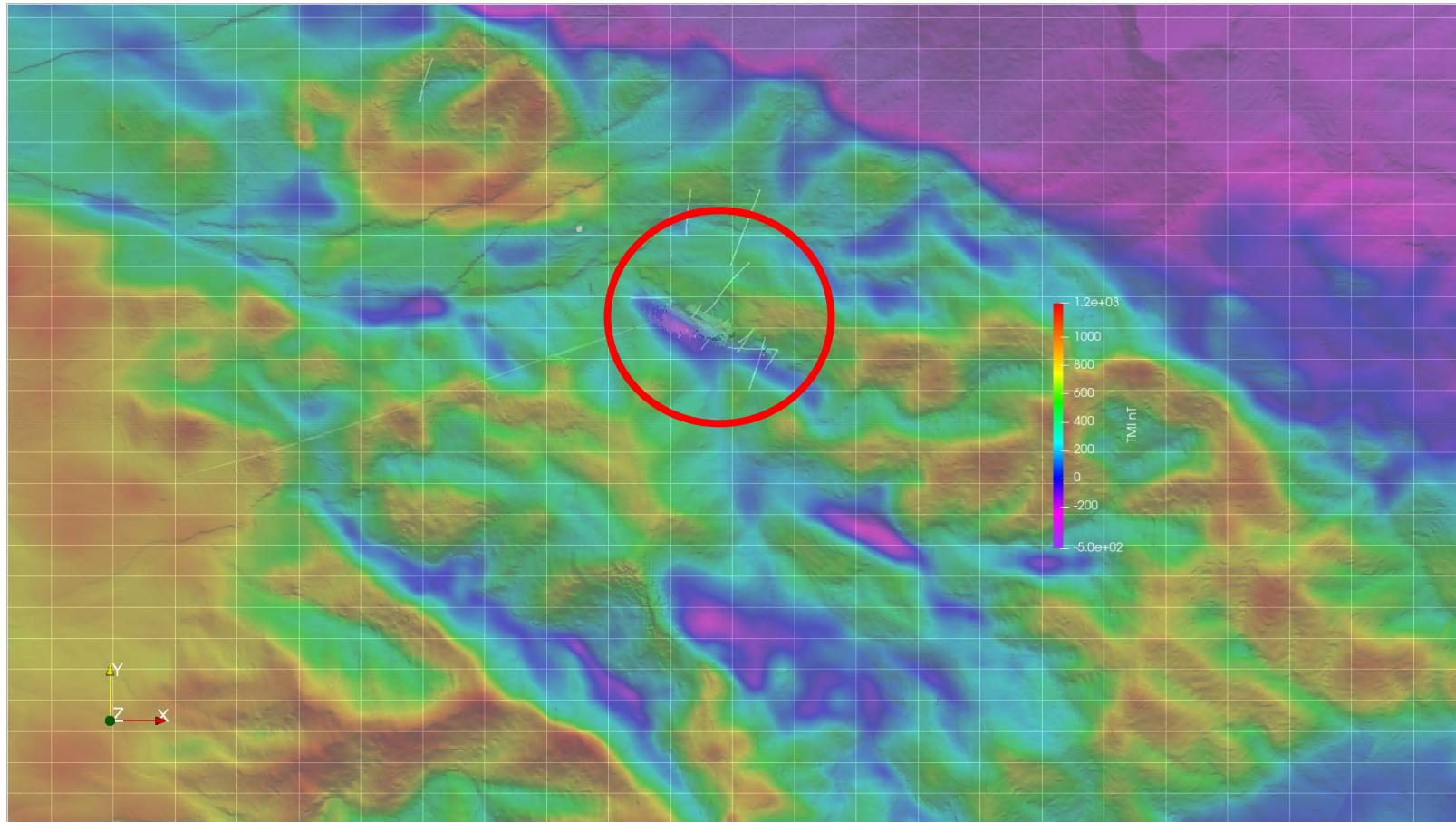
Based on a spatial relationship between gold and copper mineralisation and local lows within the TMI image the client believed there was a good association between mineralisation and low magnetic responses and was gearing up to go and drill all the lows.

## TMI draped on DEM from an angle to highlight correlation



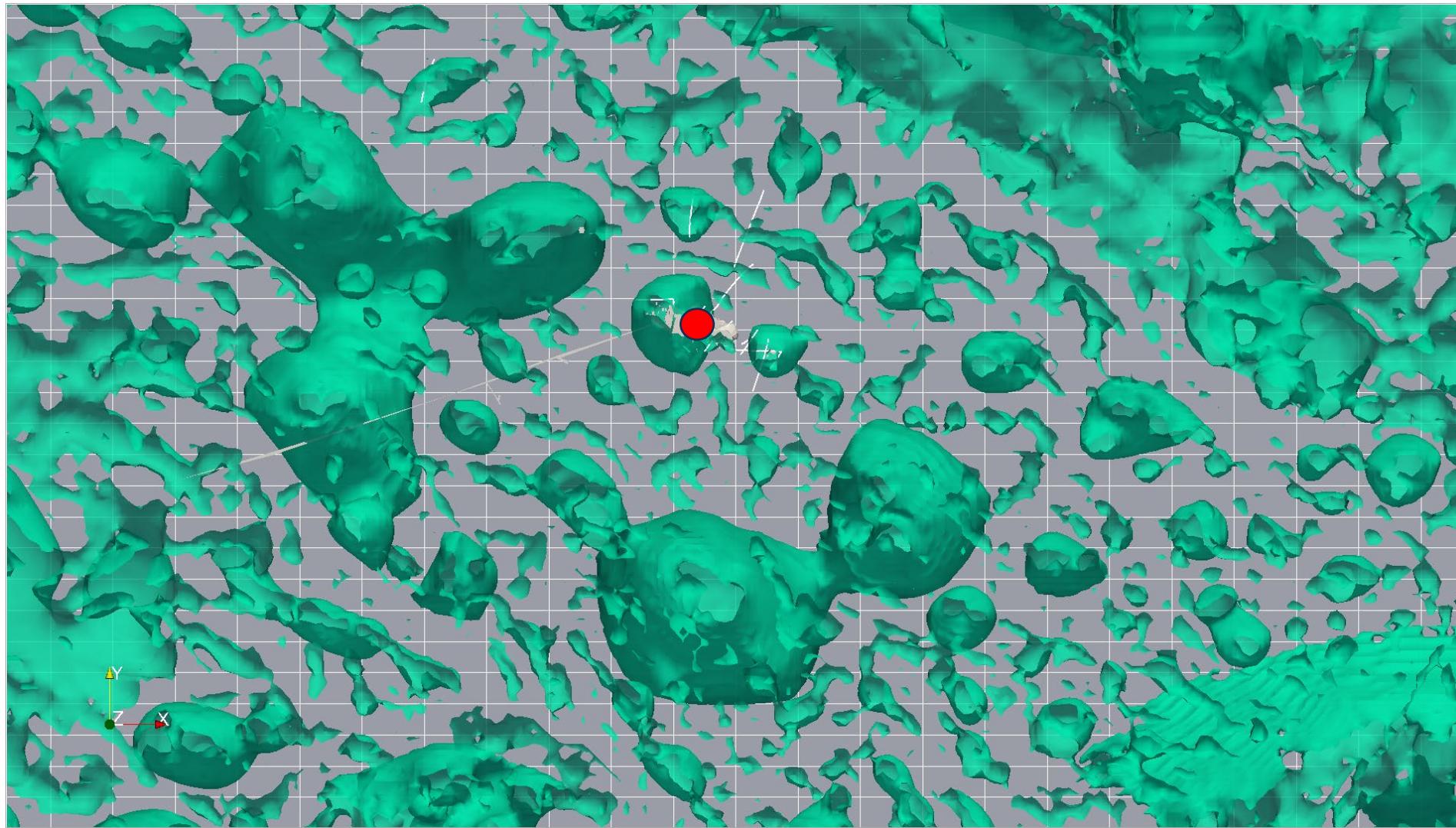
Looking at the magnetic data it is clear that there is a strong association between magnetic response and topography.

TMI draped on DEM with historical workings and drilling - is mag low from magnetite destruction or topo or both?

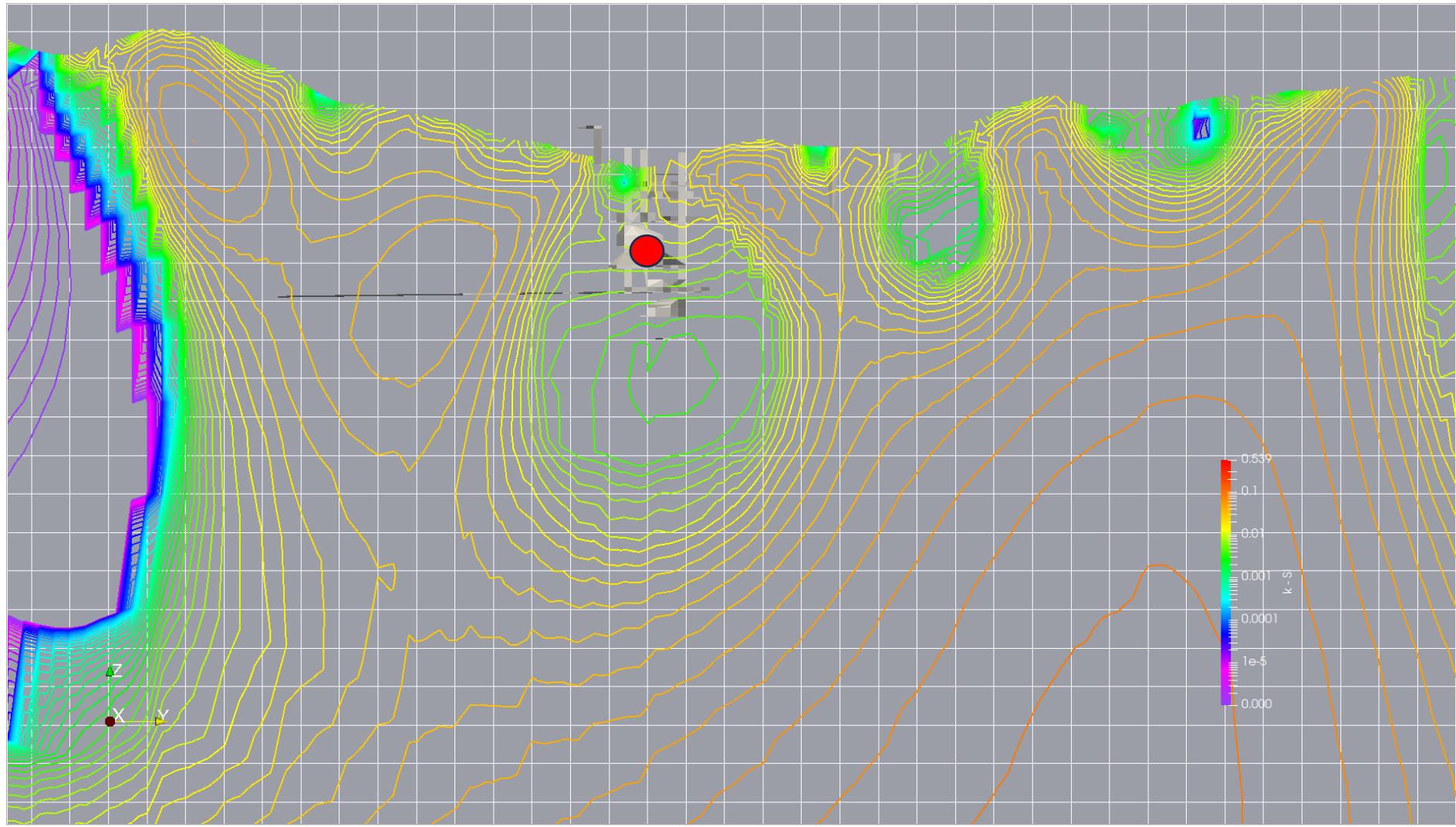


It is clear that there is a close relationship between the old mine (and known mineralisation from drilling) and a mag low but there is also a topo low here. Is the mag low due to magnetite destruction associated with gold and copper mineralisation or is the mag low a function of topography or both?

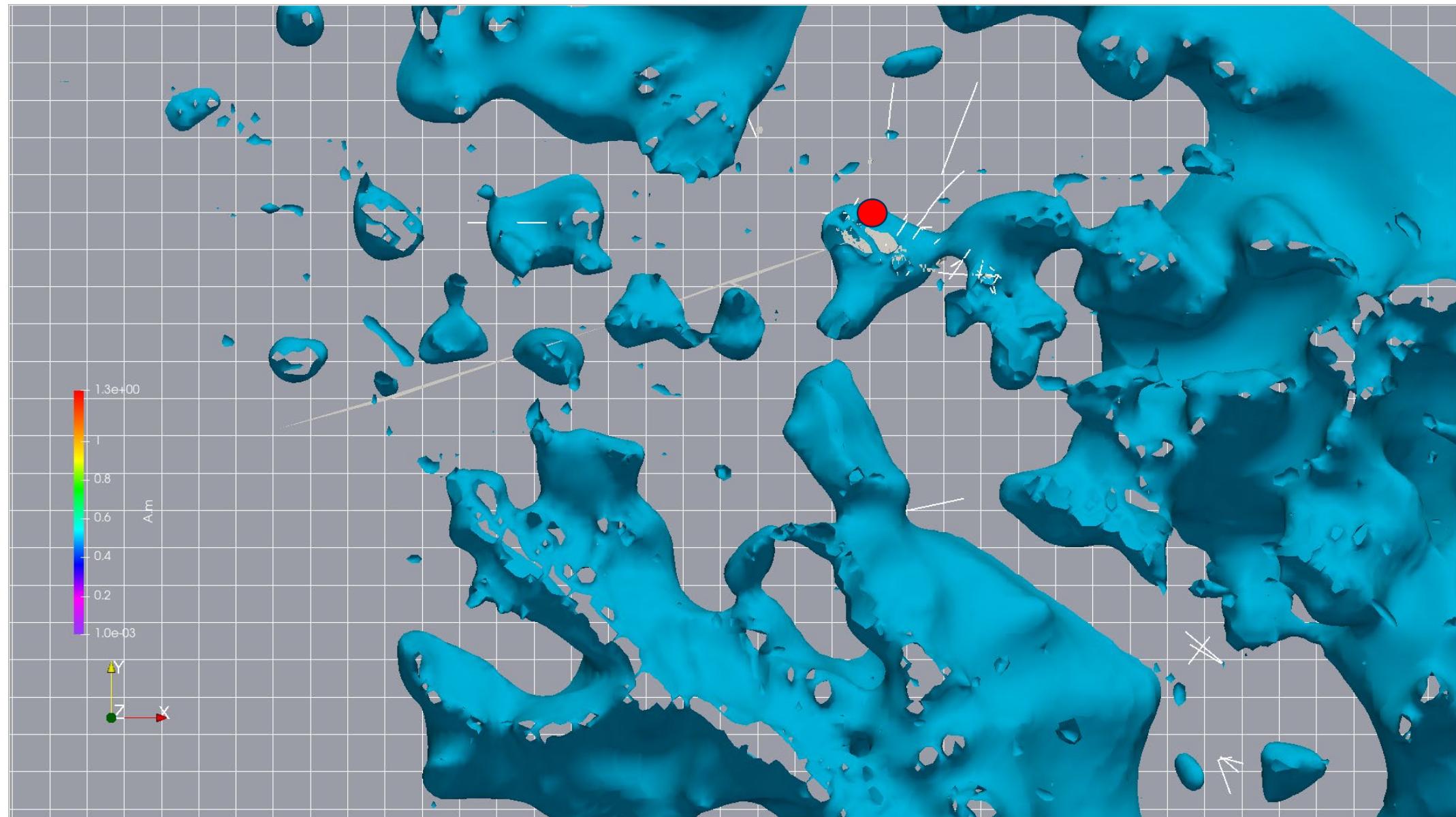
Isosurface of 0.04 mag sus from TMI inversion with workings and drilling



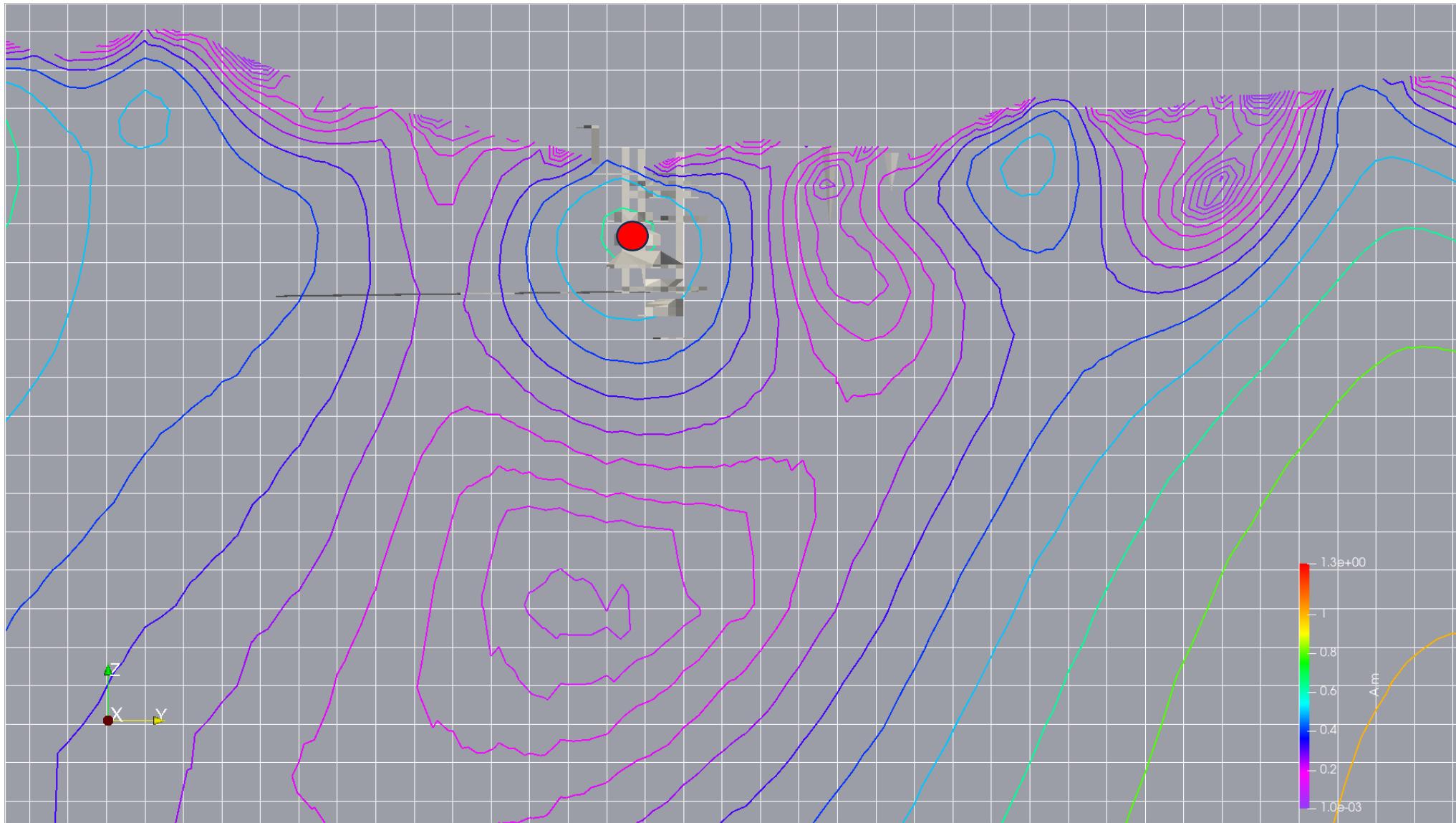
# NS section TMI inversion showing workings



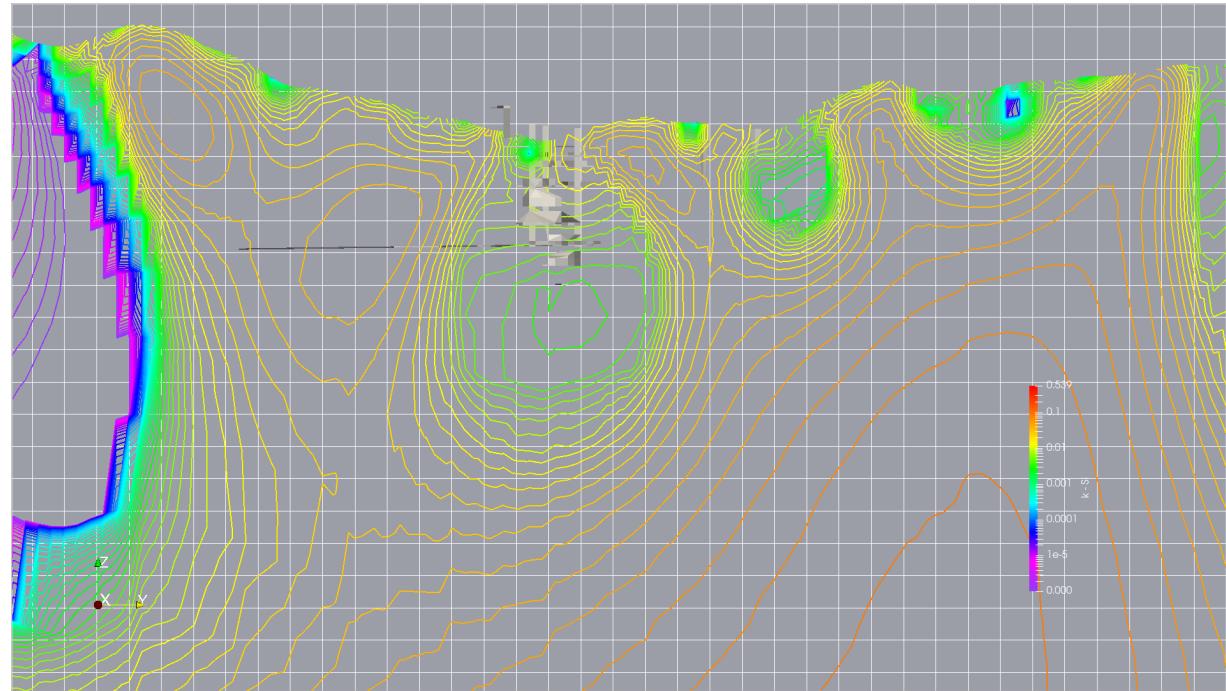
Isosurface of 0.5A/m from Magnetisation Vector Inversion with workings and drilling showing impact of remanence



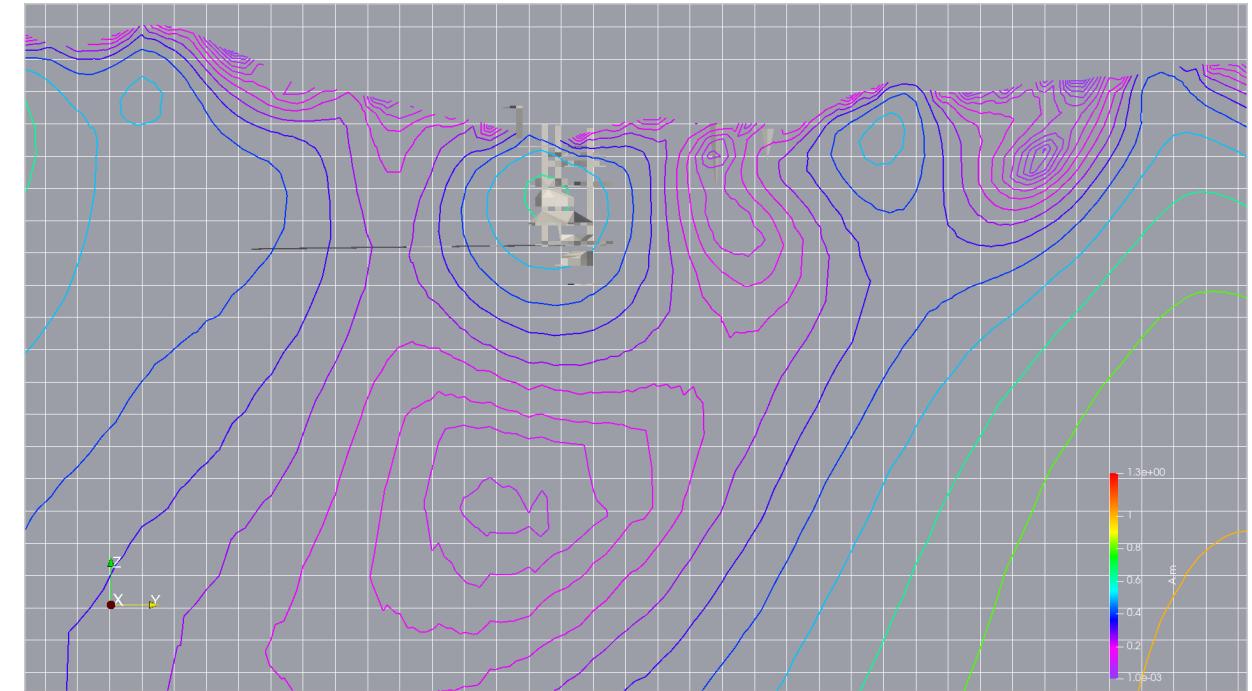
# NS section Magnetisation Vector Inversion showing workings



# TMI vs Magnetisation Vector Inversion



TMI shows a mag low coincident with mineralisation



MVI inversion shows a weak high

## Example 1: Conclusions

- Tomofast-x inversion of the TMI shows a mag low coincident with mineralisation.
- However, the MVI inversion shows a weak high.
- Hence remanence is having an impact here and we need to be careful in assuming that the mineralisation is magnetite destructive - it may be introducing secondary magnetite which is fine grained and thus able to hold its magnetic direction.
- If the inversions are correct, then the mag low at the old Cactus mine is due to remanence and so not all mag lows are targets. If remanence is a general feature of gold mineralisation here, then we should be looking at susceptibility inversion lows which are also weak magnetisation inversion highs.
- A better petrophysical dataset is needed to understand what is happening here.