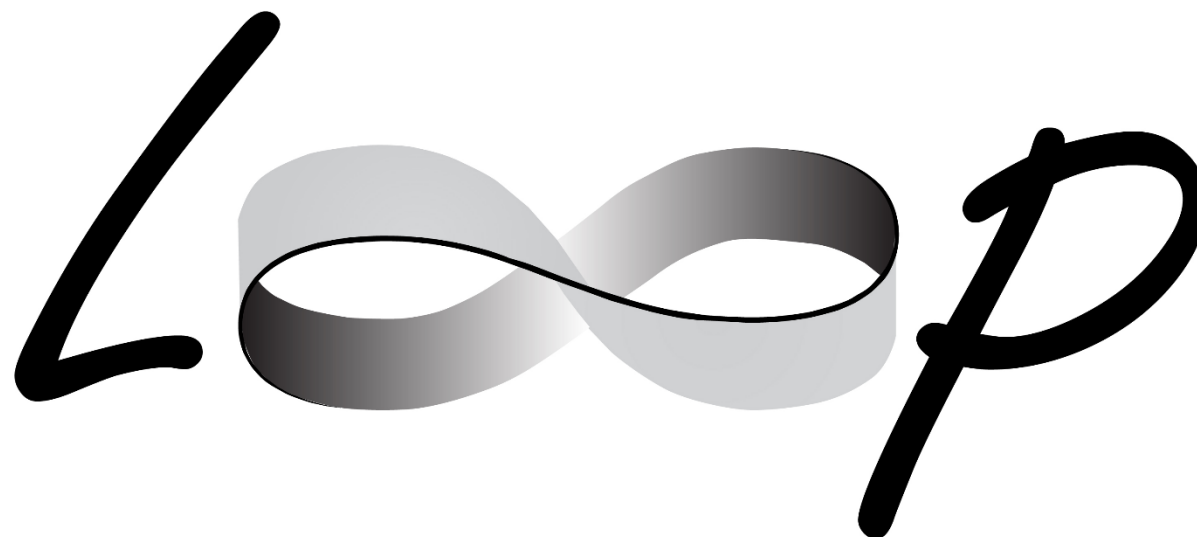




School of Earth, Atmosphere and Environment



L. AILLERES, M. JESSELL, E. DE KEMP, G. CAUMON, F. WELLMANN, S. LOPEZ, M. HILLIER, G. LAURENT, G. COURRIOUX⁶, E. SCHETSELAAR, R. ARMIT, M. LINDSAY, P. CALCAGNO, P. COLLON, B. BRODARIC, C. LOISELET, T. CUI, J. DRONIOU, P. G BETTS, F. BONNEAU, A.R. CRUDEN, and many others...



Government of **Western Australia**
Department of **Mines and Petroleum**



Australian Government
Geoscience Australia



MONASH University



THE UNIVERSITY OF
WESTERN AUSTRALIA

Centre for **EXPLORATION**
TARGETING

RWTH AACHEN
UNIVERSITY



Department
of **Industry**
Resources & Energy

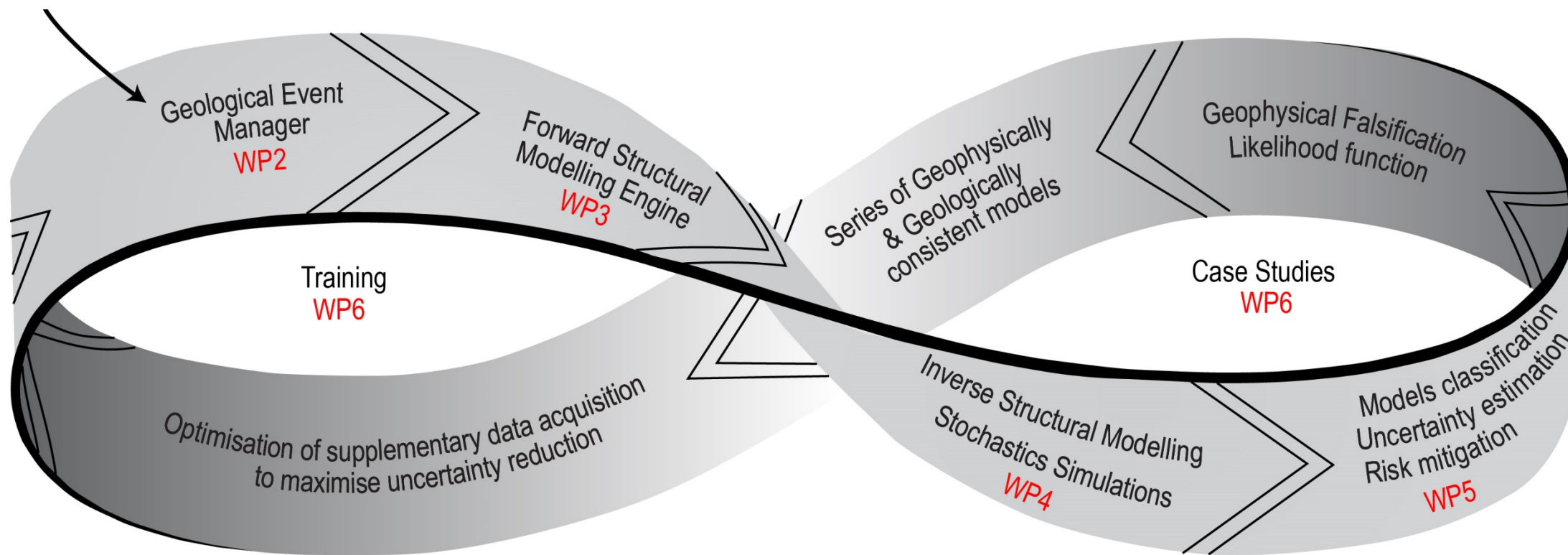


Need to produce an new open-source software to allow 3D Implicit Geological Structural Modelling and Simulate Geological scenarii to quantify/map geological uncertainties.

- Current 3D modelling packages do not handle complex hard rock geological terranes
- Uncertainty of models is high and needs to be robustly quantified/mapped
 - Input data sampling and upscaling methods are ignored
 - geological simulations / scenarii
- Better integration with geophysical data/models – especially to falsify
- Better integration with downstream modelling packages – better meshing tools.
- Project is timely: needs are there and the team is available with members are already working together

Geological Knowledge Manager

An artificial intelligence method to extract geological knowledge from publicly available documents

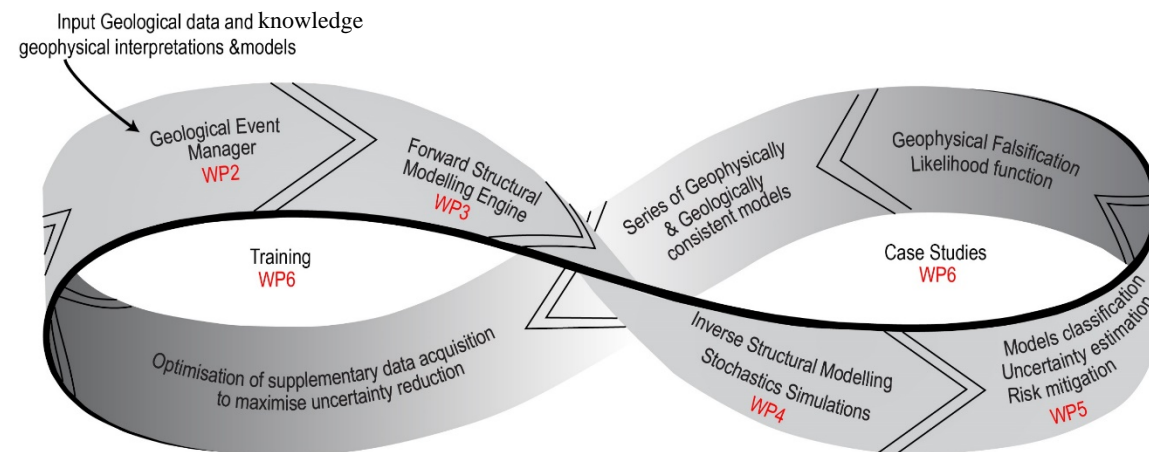


Loop: an new open-source software for 3D Geological & Geophysical Modelling and Simulations

Work package 1: Loop Architecture and Data Model:

In order to build a new Open Source platform we require a dedicated Work Package that will oversee:

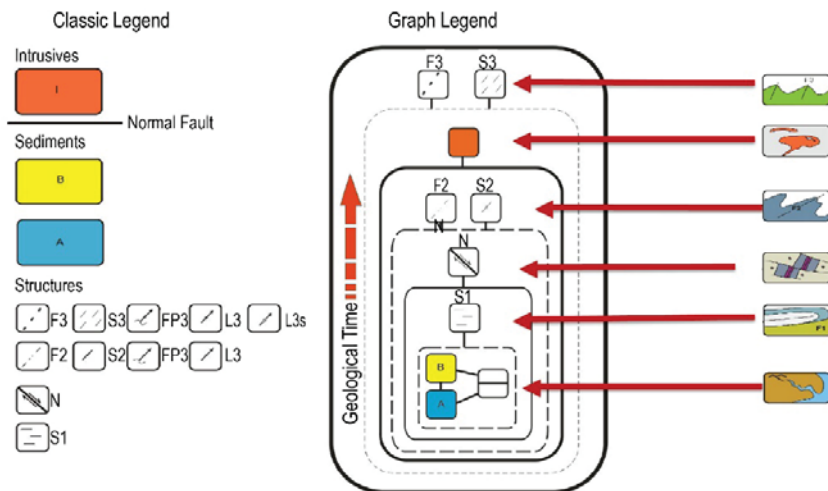
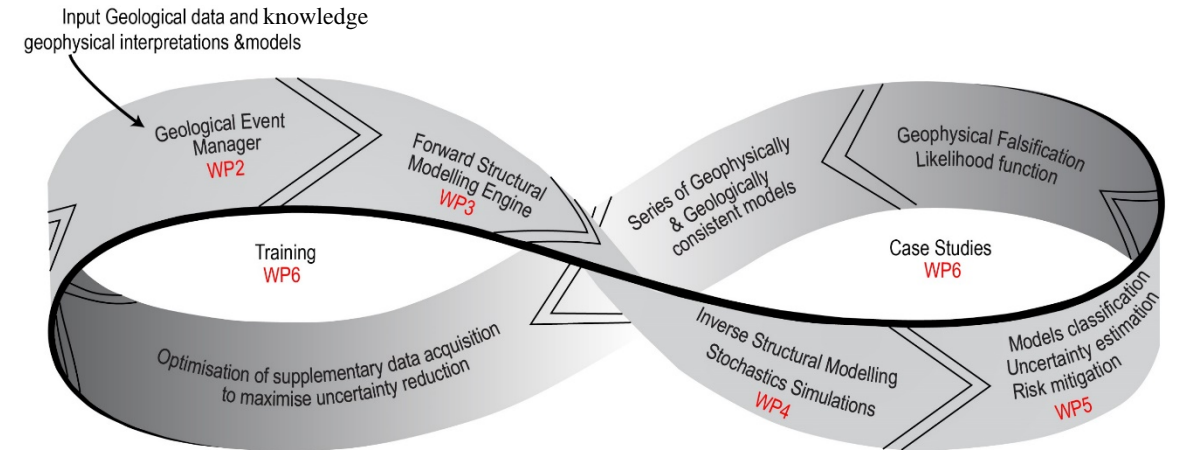
- the software engineering of the Loop platform,
- the integration of available research codes,
- the management of the open source library and website and
- the facilitation of research and applications using Loop
 - Interoperability,
 - Python support,
 - Versionning (software, data)
 - Etc...



Loop: an new open-source software for 3D Geological & Geophysical Modelling and Simulations

Work package 2: Geological Event Manager (GEM)

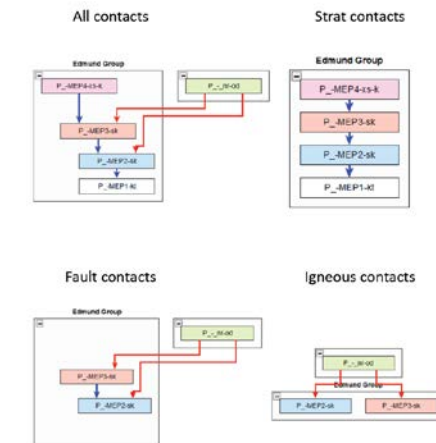
- development of methods to mathematically encode knowledge of temporal and spatial relationships of geological features. The GEM will capture and encode all the possible geological process based events that appear in a geological history. This has implications on the topology (mutual relationships of multiple geological objects) of the models which is dependent on the relative timing of the geological events.
- Sets the rules for the “forward structural modelling engine”. The GEM will also captures inherent uncertainty associated with data and observations.



GEM: graph representation of model legend based on geological history



Map2model: ArcGIS plugin to extract topological relationship automatically from maps



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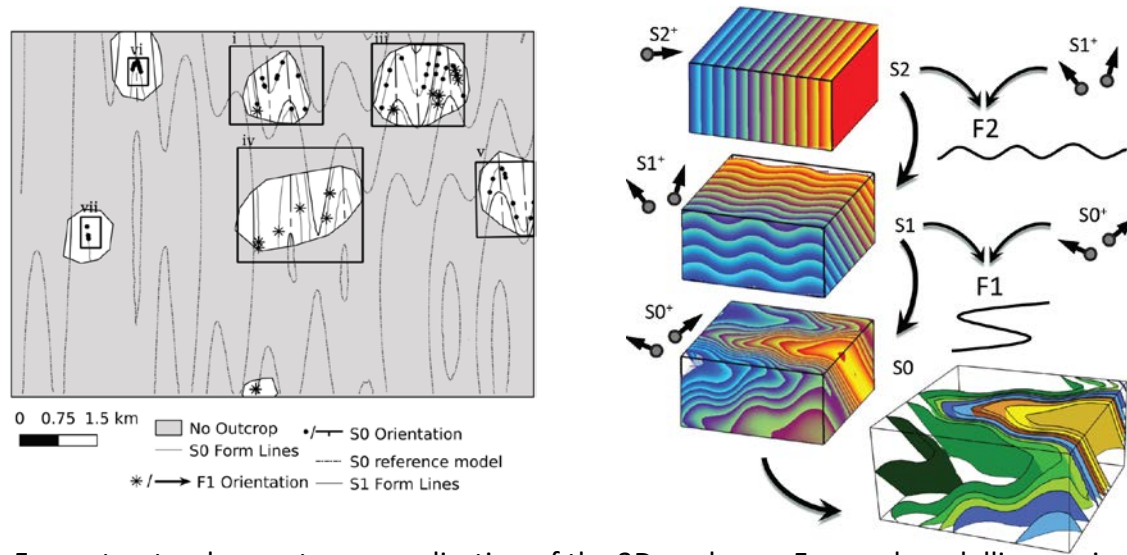
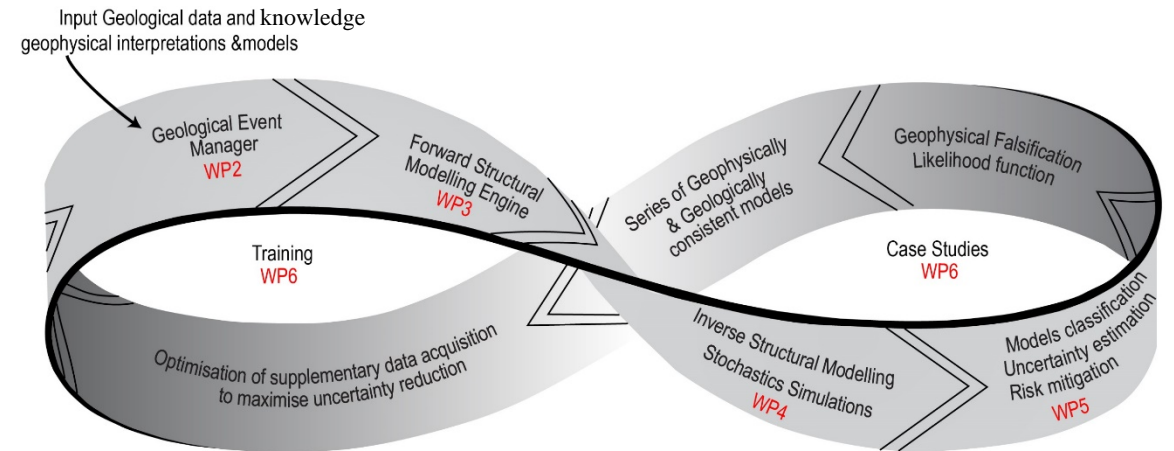
Work package 3: Forward Structural Modelling Engine:

The Forward Structural Modelling Engine will utilise information derived from the GEM to build 3D geological models by fitting interfaces between geological observations.

Methods will be developed to model all types of geological objects:

- faults and fault network (including estimating fault throws, amplitude and direction of offset),
- unconformities,
- intrusions.

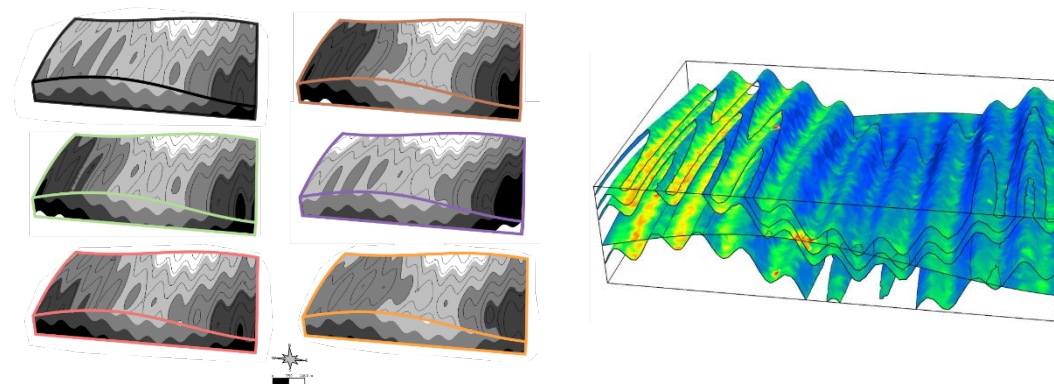
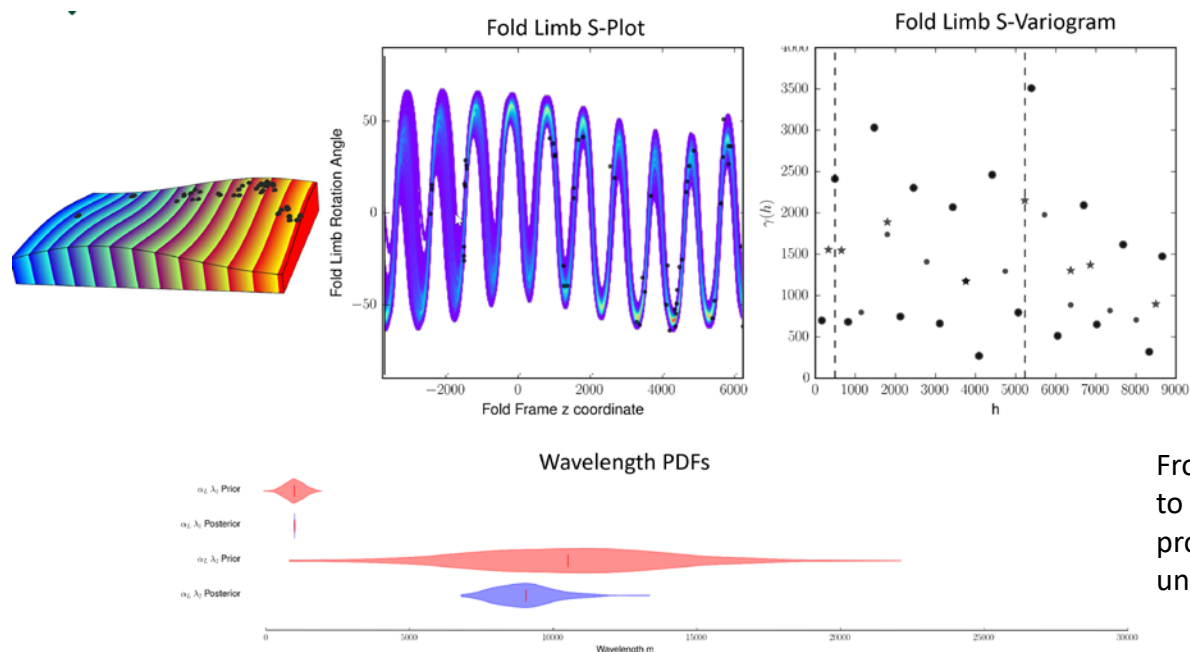
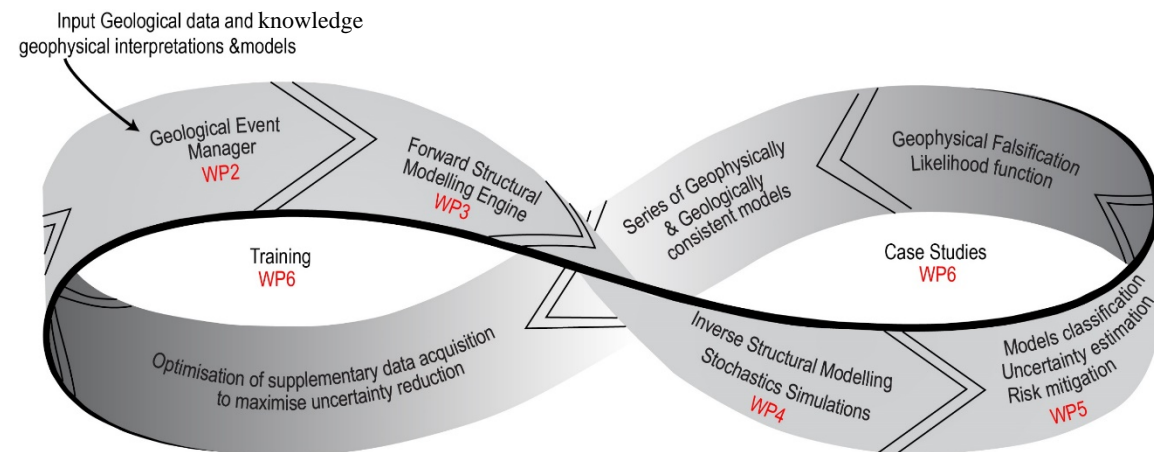
The modelling will be time-aware in order to account for topological constraints.



From structural maps to one realization of the 3D geology – Forward modelling engine

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Work package 4: Structural Inversion and Stochastic Simulations Engine: The Forward Structural Modelling Engine will be developed while ensuring that the parameters of the structural interpolants can be fitted through Bayesian inferences and inversion using Markov Chain Monte Carlo sampling. This is similar to the method recently developed by Grose et al. (2017) Tectonophysics and inc. Bayesian modelling recently accepted to JGR) for folds and fold overprinting and Wellmann et al. (2017). We consider that the creation of 3D geological models can be framed as an inverse problem where the aim is to infer parameter values for the interpolation algorithm given geological observations and knowledge.



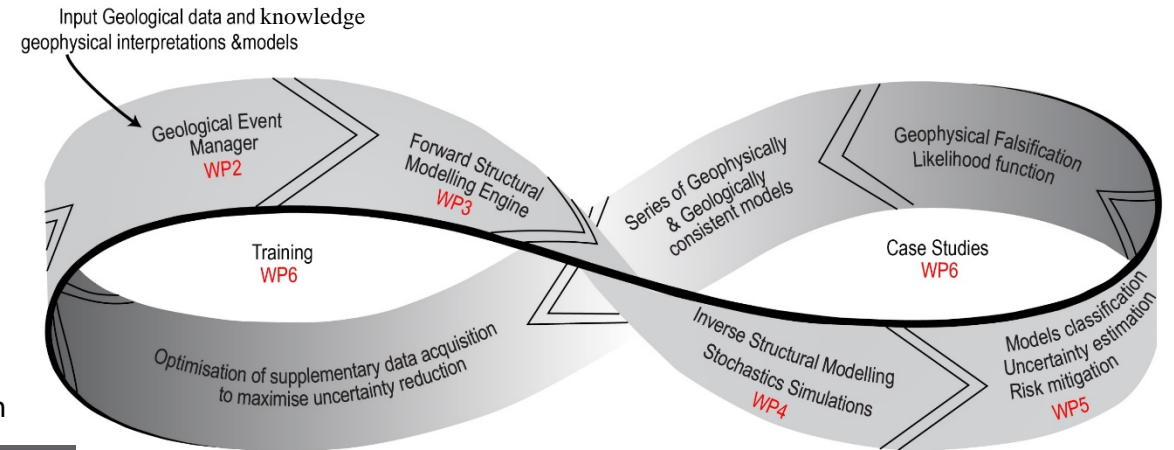
From left to right: Probabilistic modelling (Bayesian modelling) to fit multiple fold wavelengths to structural data. Both fold axis fields and folded foliation fields are fitted simultaneously. The probabilistic modelling results in a series of structural models and characterisation of structural uncertainty.

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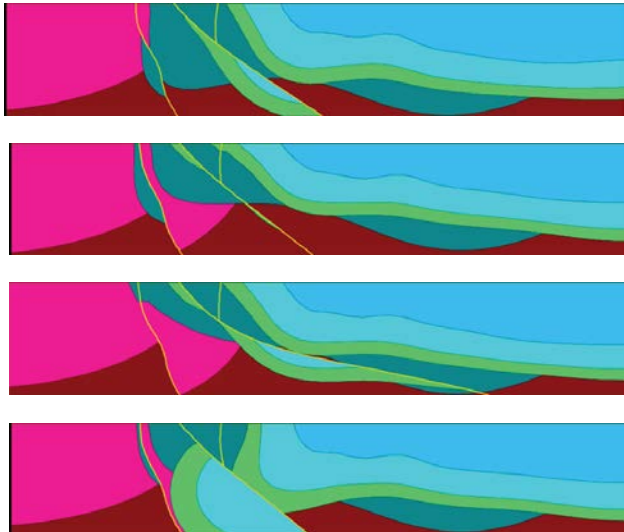
Work package 5: Uncertainty Analysis and Automatic Model Classification:

The aim of this module is to be able to simulate data uncertainty throughout the modelling workflow and to classify models according to their geometrical and topological characteristics using the concept of geo-diversity developed by Lindsay et al. (2013a; b; 2014) and Thiele et al. (2016a & b).

These characteristics will allow the falsification of model classes that display characteristics not consistent with the input data and knowledge.



Extreme models

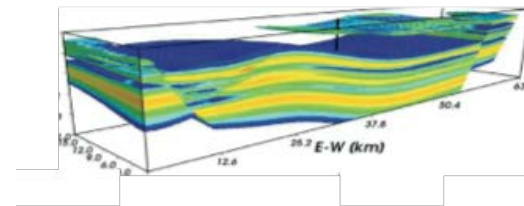


Topological classification

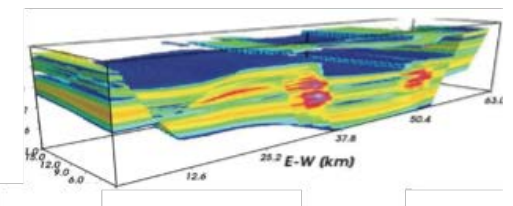


Giraud et al., 2017 - Geophysics

Depth uncertain



Additional faults



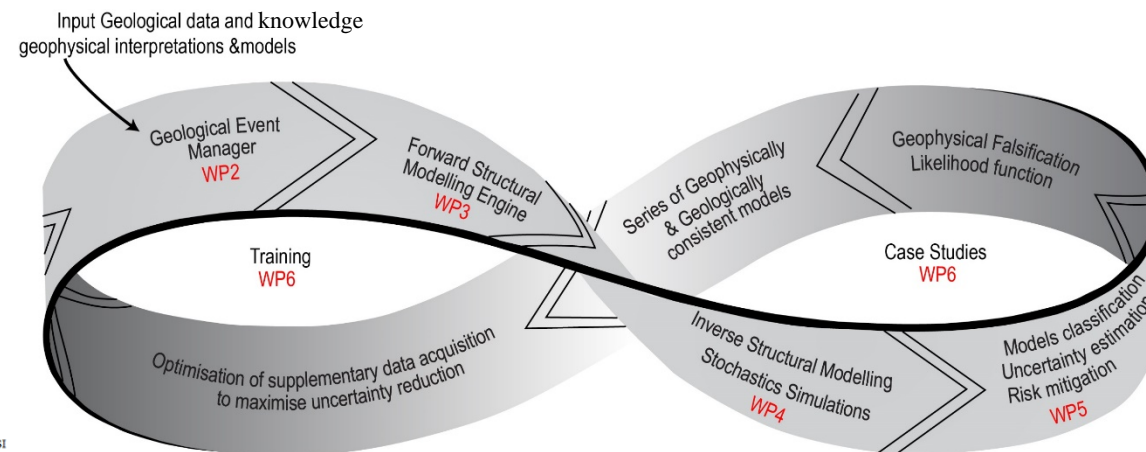
Uncertainty



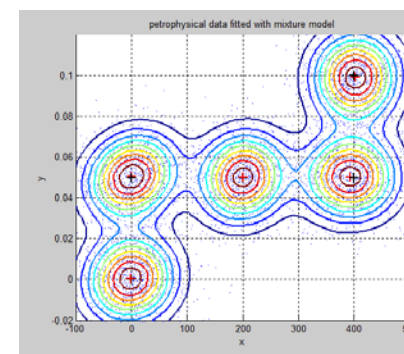
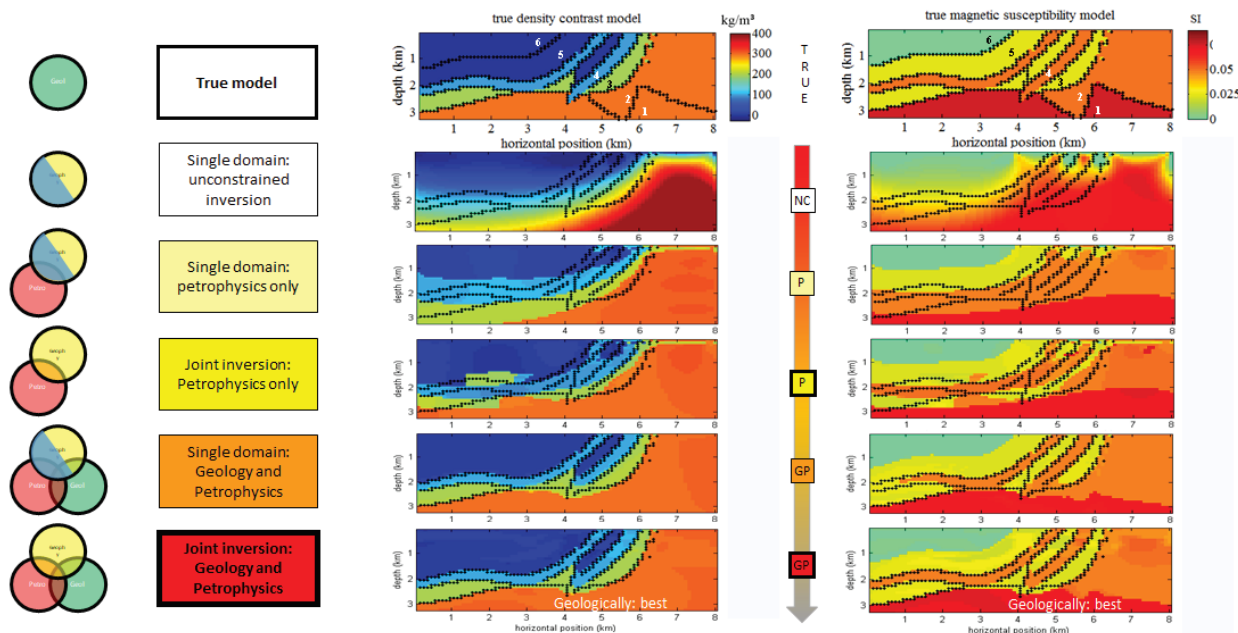
Wellmann et al., 2012 - Tectonophysics

Loop: an new open-source software for 3D Geological & Geophysical Modelling and Simulations

Work package 5: Uncertainty Analysis and Automatic Model Classification: Geophysical inversions will be used to both provide key inputs to the modelling, and falsify model classes. The research in geophysical modelling will build on recent method utilising lithological uncertainty as an inference for petrophysical property during joint magnetic-gravity inversions.



2D Geophysical Inversions



Probability density functions for multiple petrophysical properties per lithology. Lithologies are also defined throughout the model with a PDF for each voxel.

 **: an new open-source software for 3D Geological & Geophysical Modelling and Simulations**

GSC: 2 post-doctoral positions [interpolants + geological knowledge manager] +/- 4 staff

BRGM: 1 PhD position [anisotropic interpolants] + /- 4 staff

BGS: 1 post-doctoral position [geological knowledge manager] +/- 4 staff

Geoscience Australia + GSWA + NTGS + GSNSW + GSSA + Auscope:

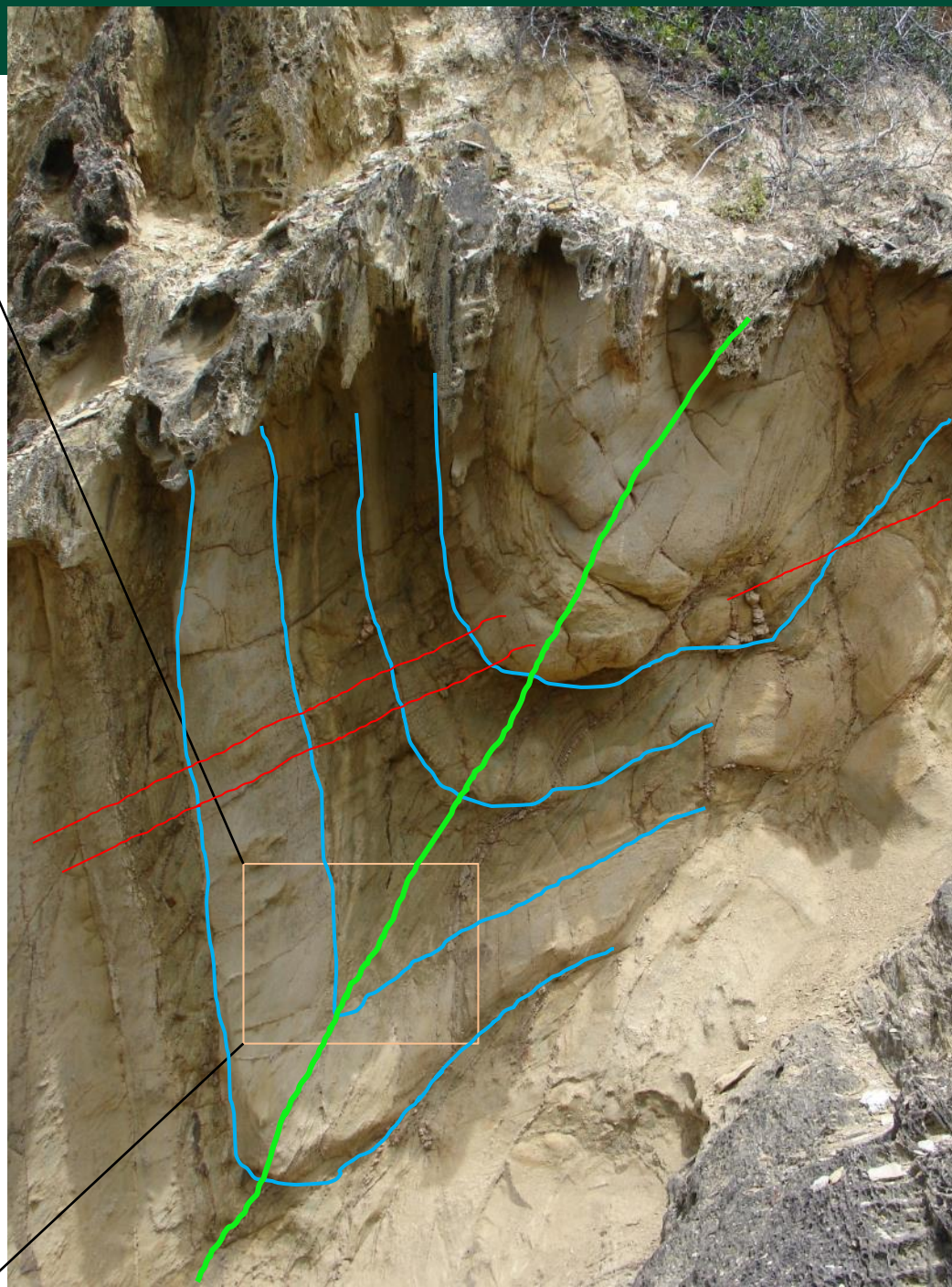
- >\$1M cash; >\$1.3M in-kind leveraged against ARC Linkage grant: FUNDED 😊 \$711K
- Announced yesterday
- This would fund over 3 years:
 - 1 software architect
 - 1 software programmer
 - 2 post-doctoral positions [forward structural engine / uncertainty characterisation
 - Collaborative research funding

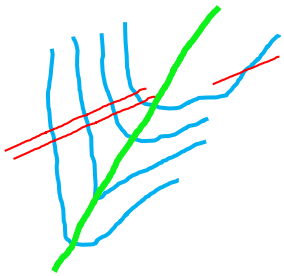
MinEx CRC (ARC Collaborative Research Centre): 2 post-doctoral positions [uncertainty and geophysical modelling/inversions]

A **time aware** interpolator for foliations and structural information

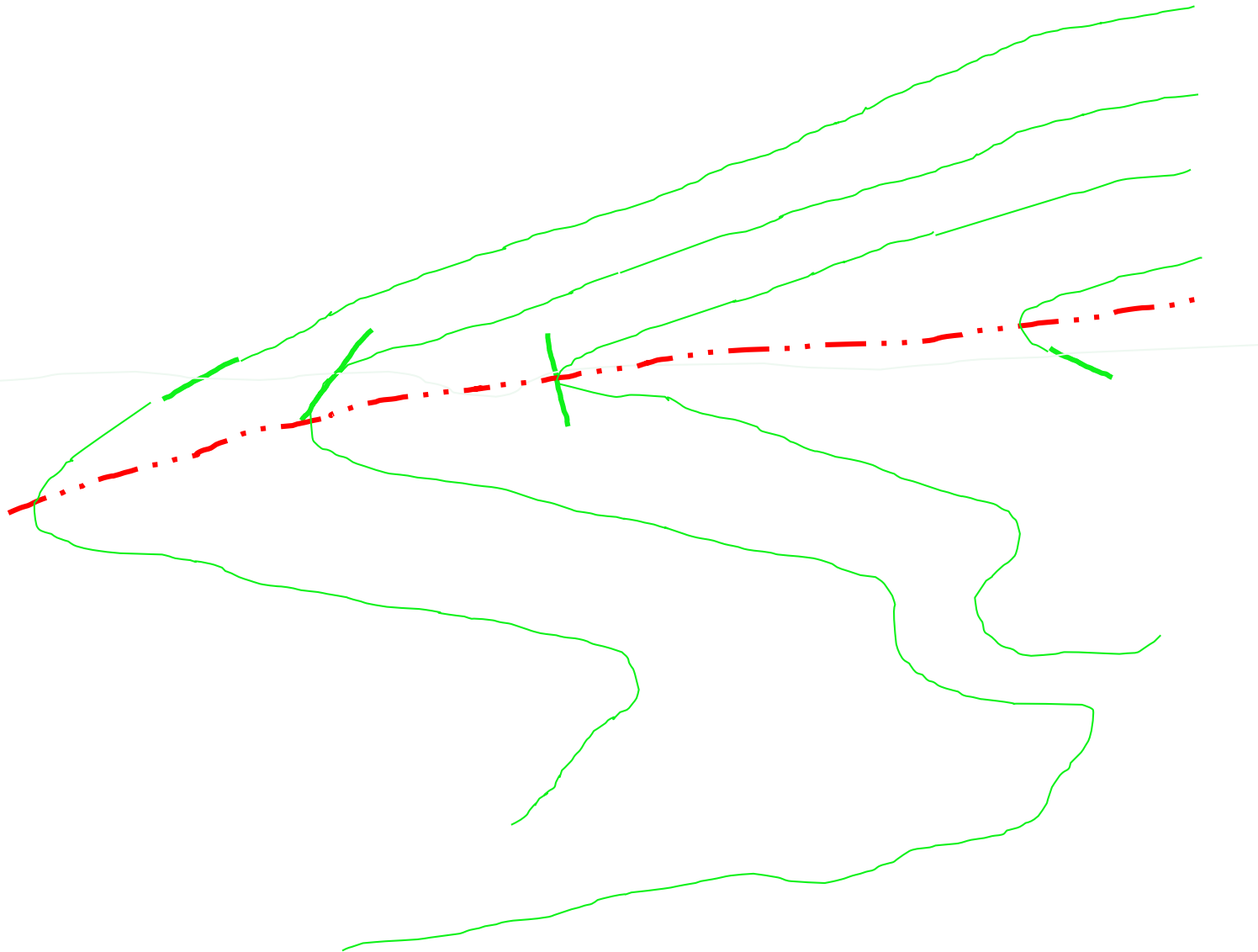
Looking South into
Bermagui Heads,
stratigraphy dipping
steeply West

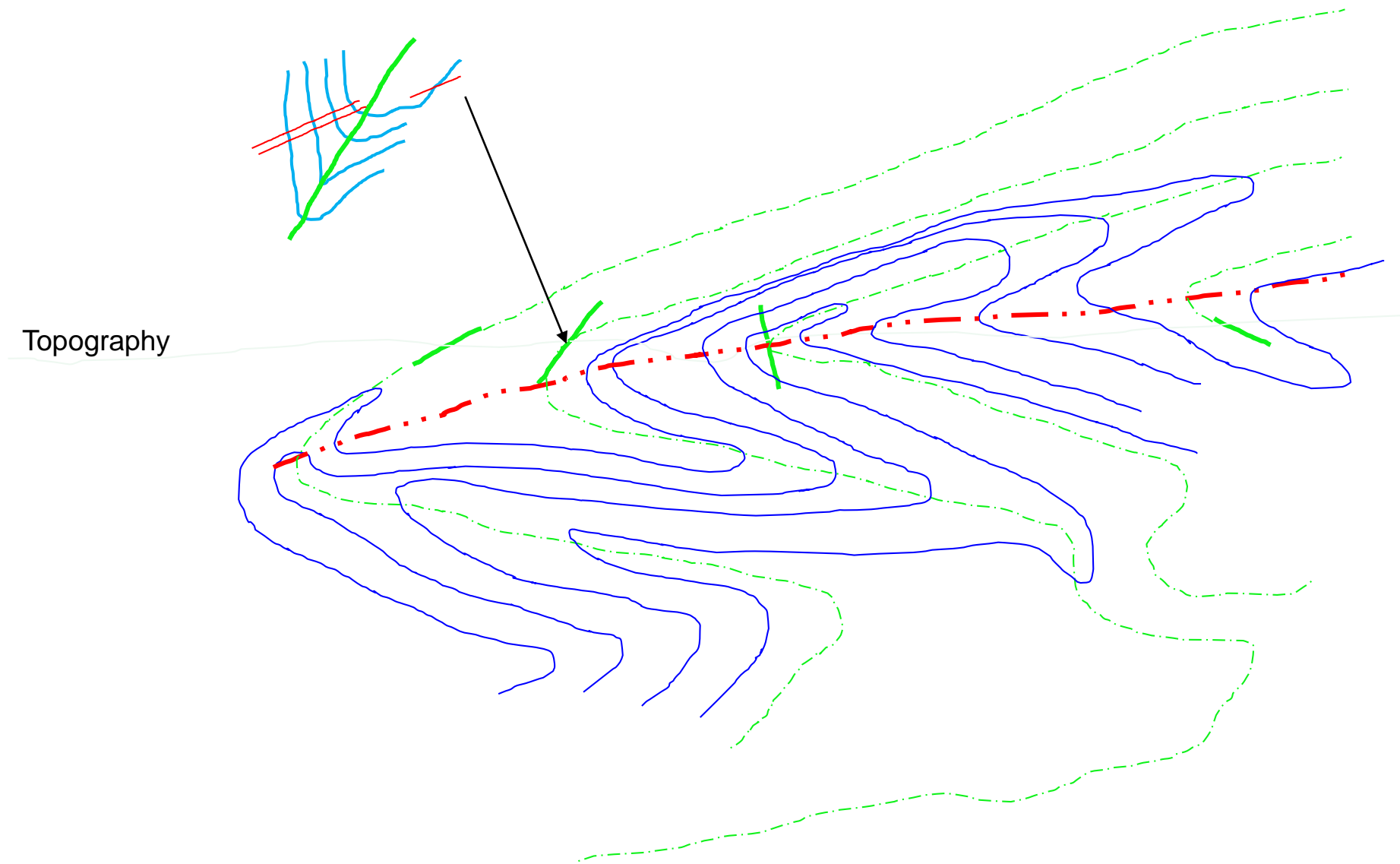






Topography





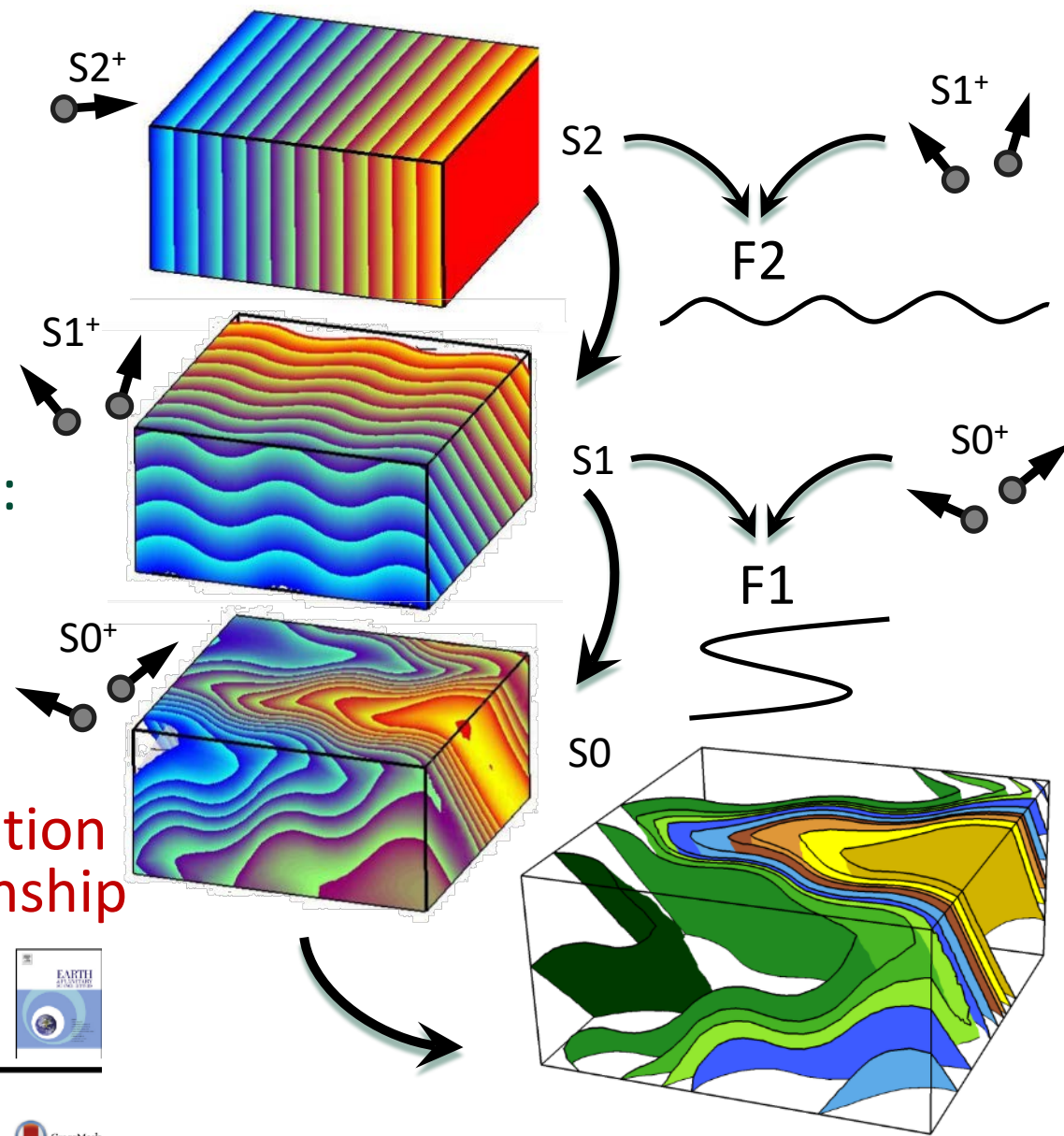
1. Poly-deformation:

- Model step by step
- Restoration approach
 - going backward in time
- Fold operator:
 - $S_{i-1} = F_i(S_{i-1}^+ | P_i)$

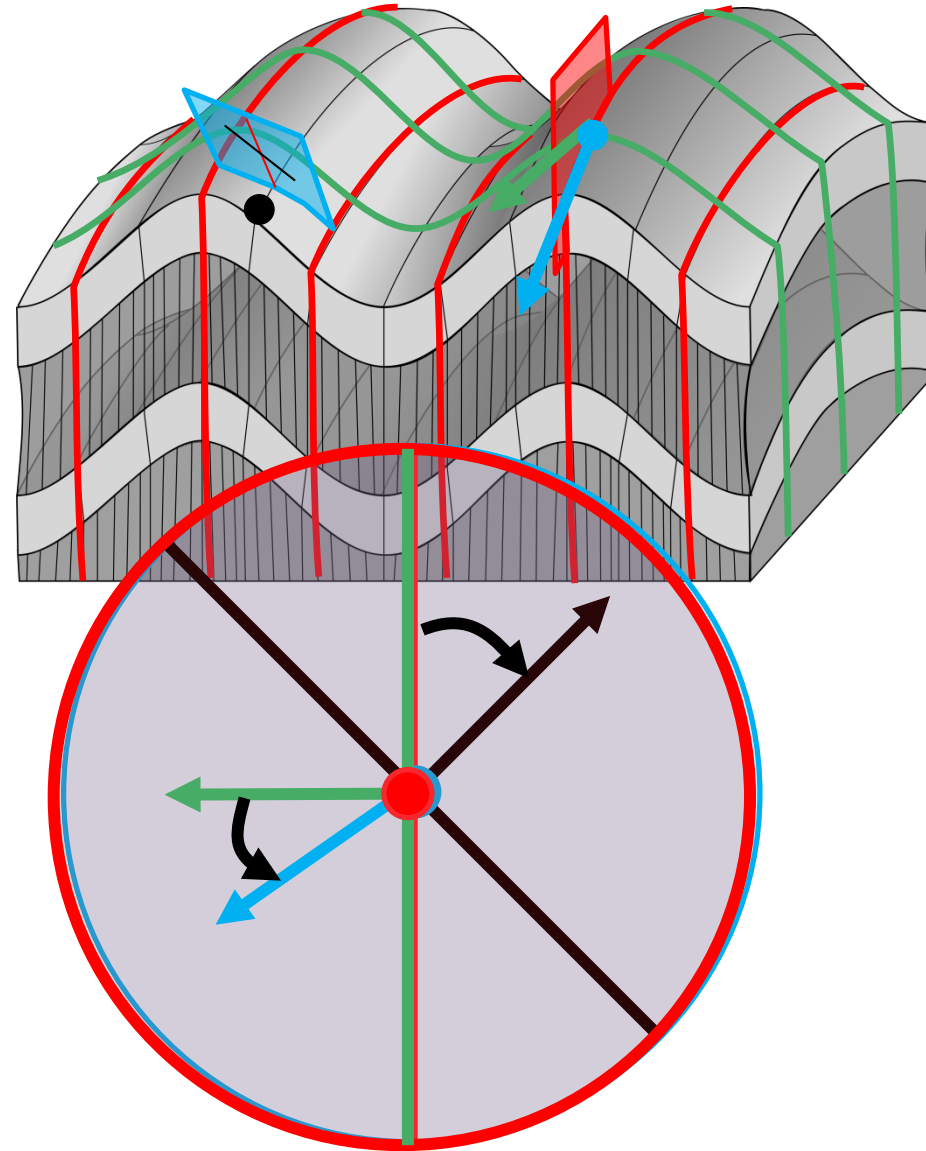
2. Fold characterisation:

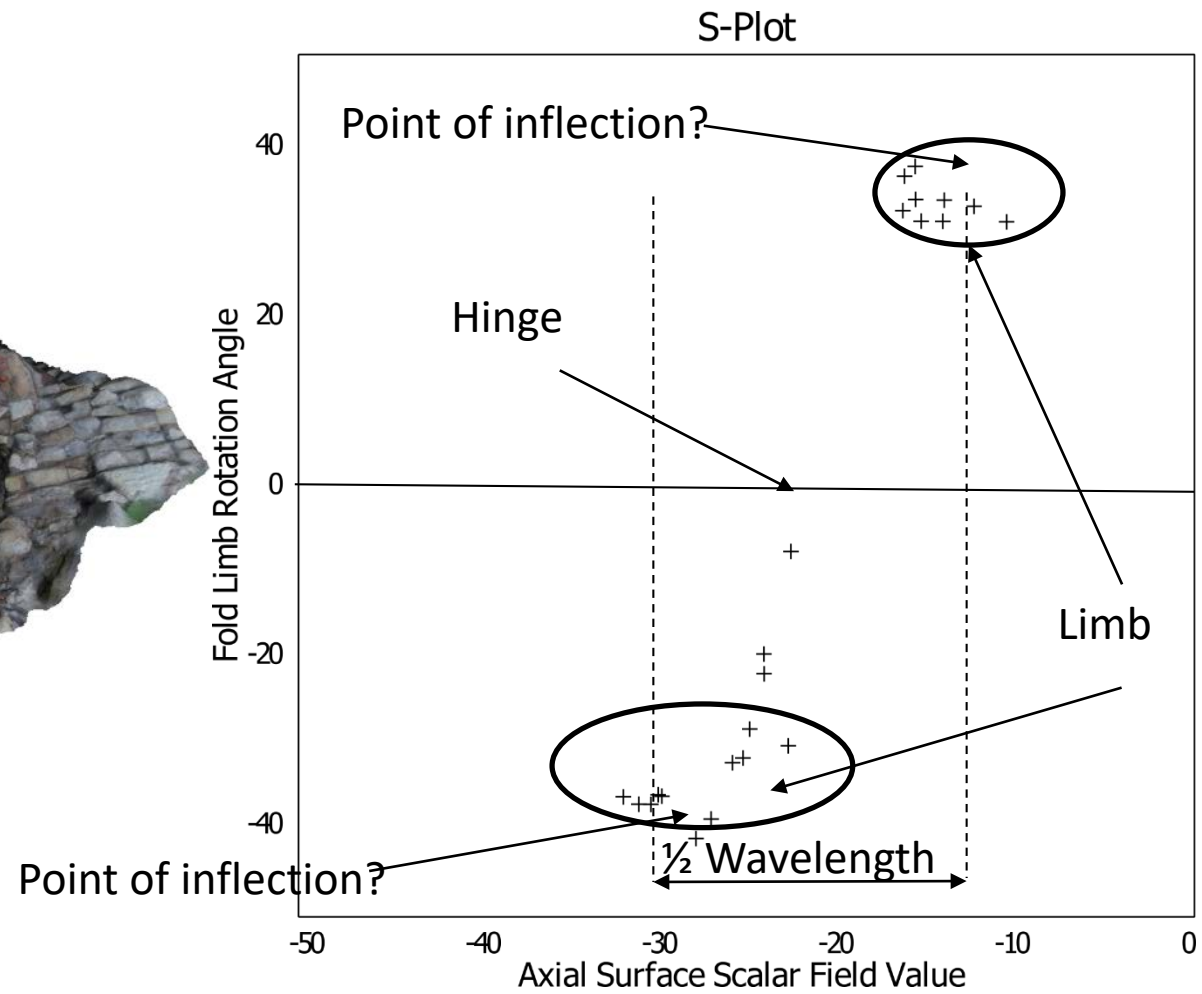
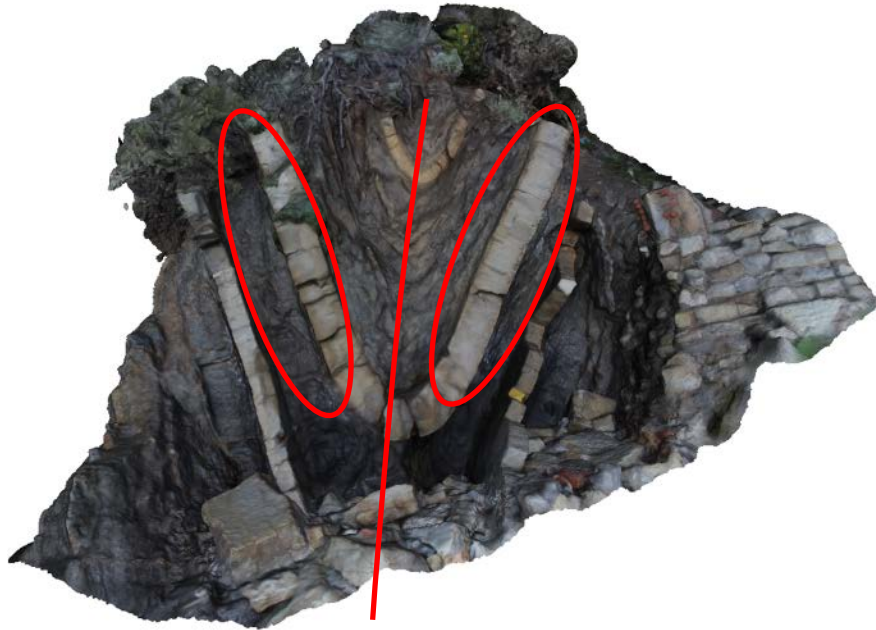
- Statistics from data
- Fold Frames
 - Using structural elements
- Fold Profiles

!! No deformation simulation
!! Only geometric relationship

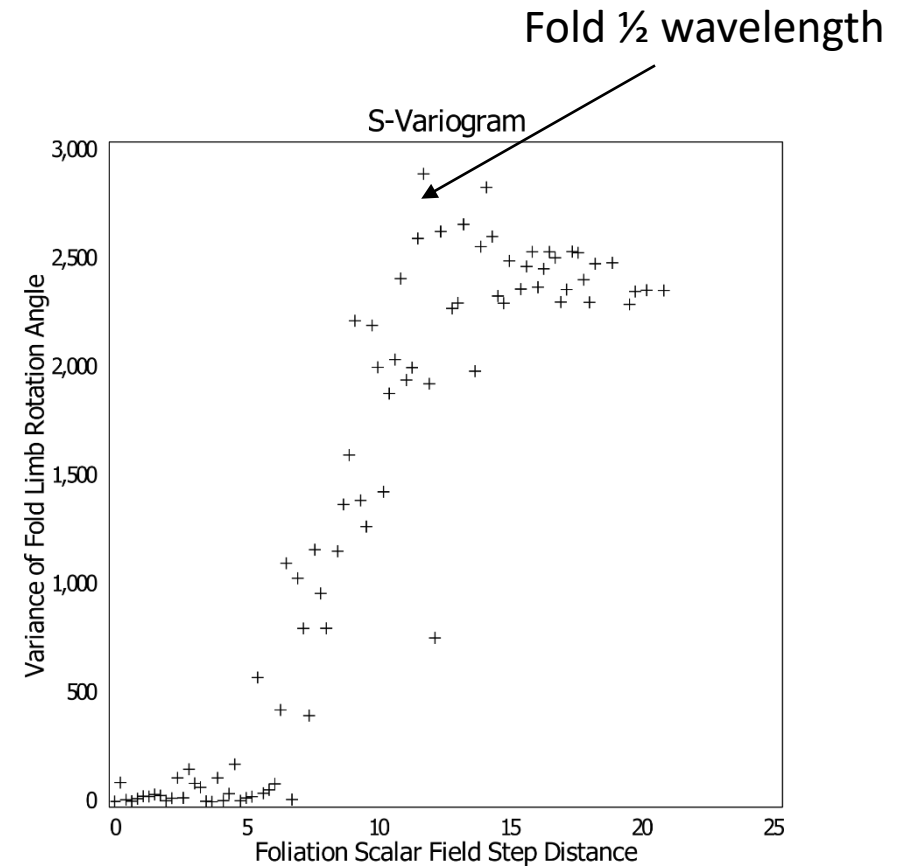
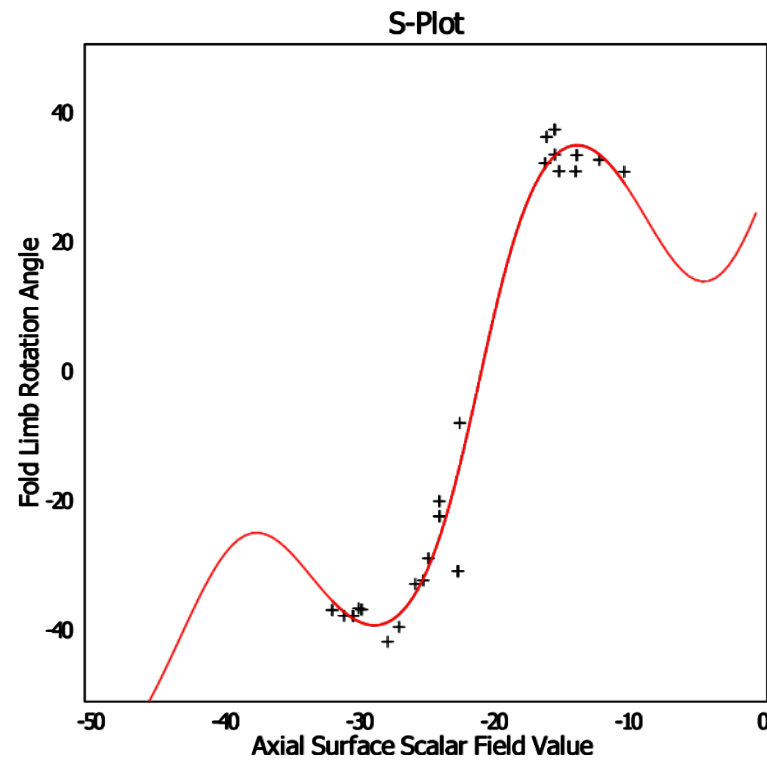


- Fold Axis Rotation Angle
 - Fold axis observation
 - Gradient of Y field
 - In (axial foliation) XY plane
- Fold Limb Rotation Angle
 - Folded foliation observation
 - Gradient of axial foliation (Z field)
 - Looking down plunge

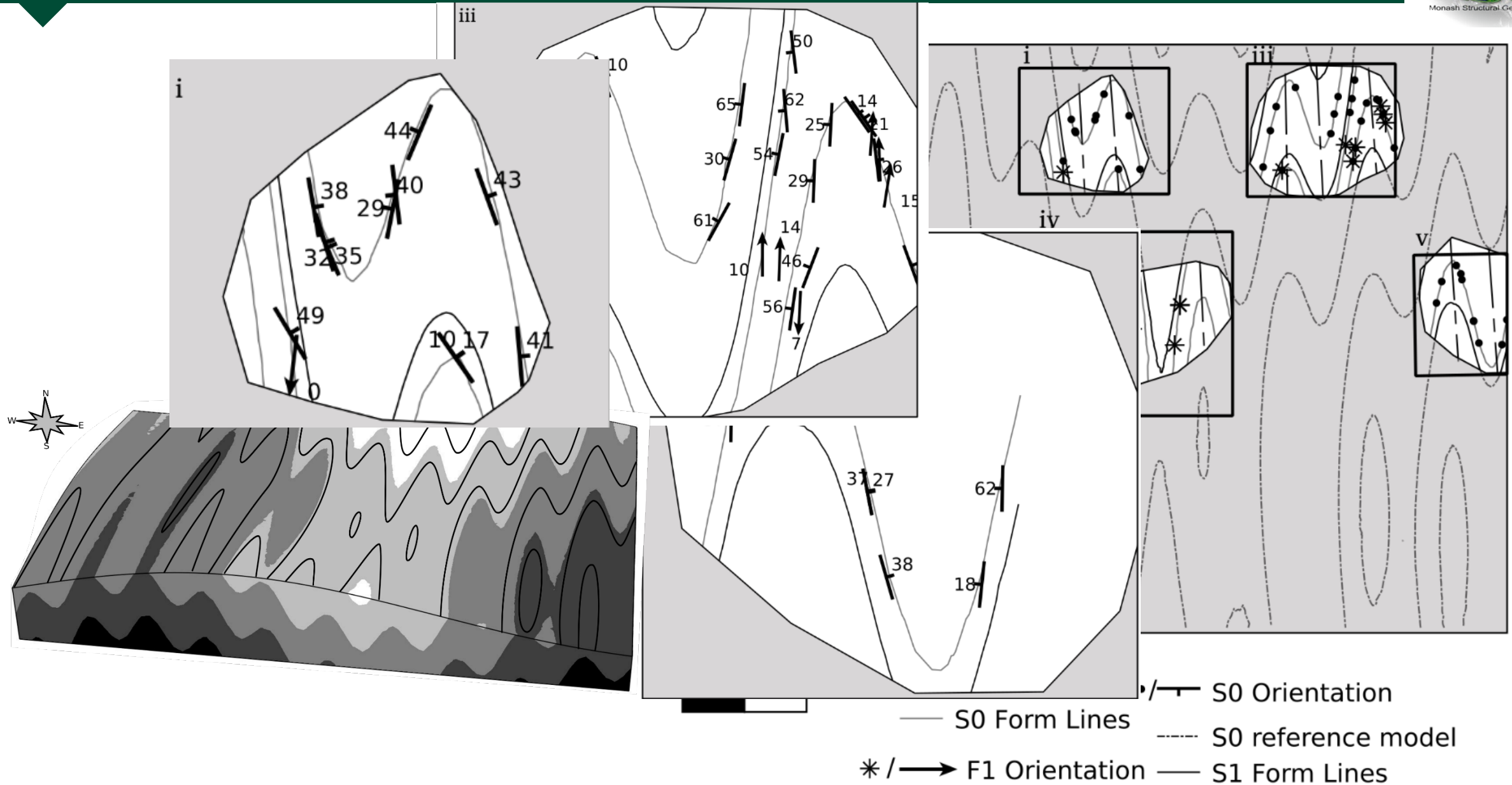




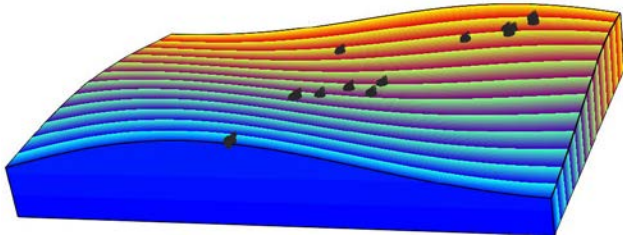
- Interpolate gradient directly instead of angle
- Use fold wavelength as shape parameter



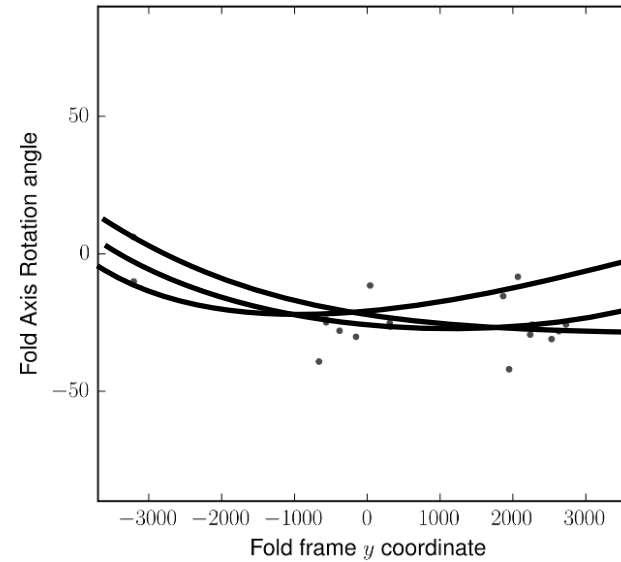
Todays case study



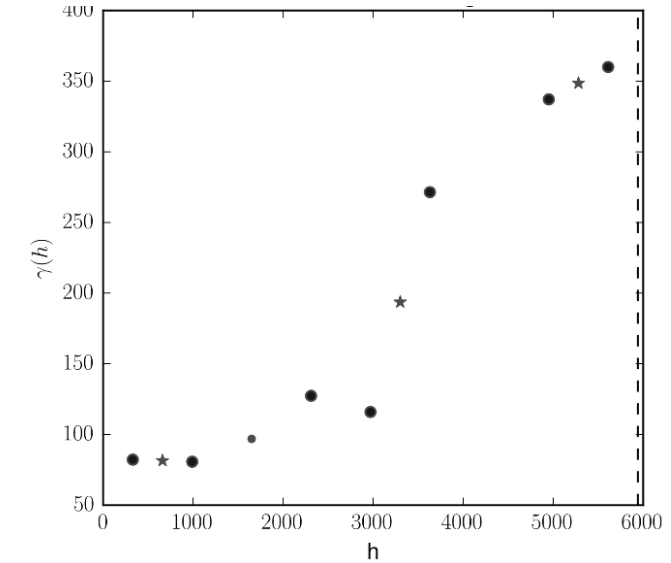
Fold frame y coordinate



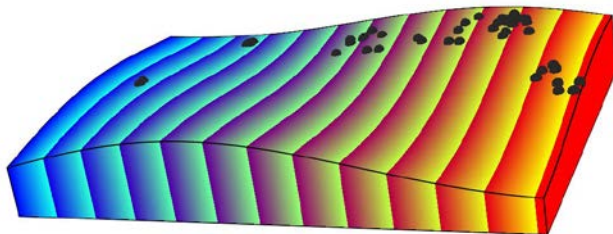
Fold Axis S-Plot



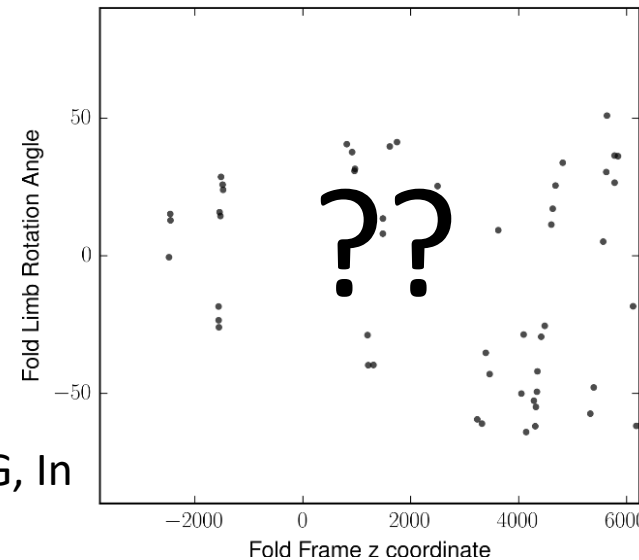
Fold Axis S-Variogram



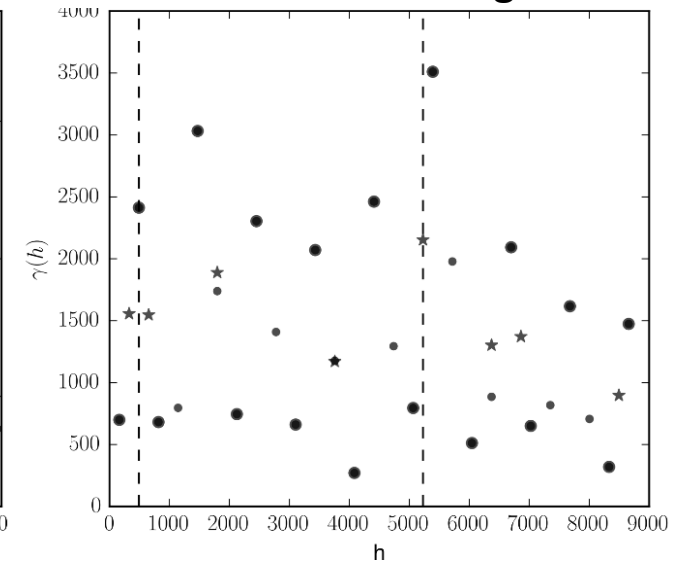
Fold frame z coordinate



Fold Limb S-Plot



Fold Limb S-Variogram



(Grose et al., 2017, JSG, In Press)

- Parasitic folds modelled specifying multiple wavelength parameters

$$\hat{y}(x_i | A_0, A_{1..n}, \lambda_{1..n}) = A_0 + \sum_{n=1}^N B_n \cos \frac{2\pi}{\lambda_n} x_i + \sum_{n=1}^N A_n \sin \frac{2\pi}{\lambda_n} x_i + \text{uncertainty}$$

- Bayesian inference

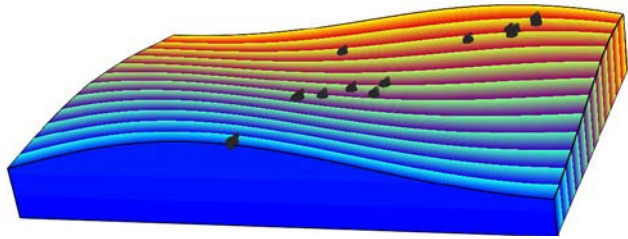
$$P(\theta | D) \propto P(D | \theta) \cdot P(\theta)$$

- Prior distributions:

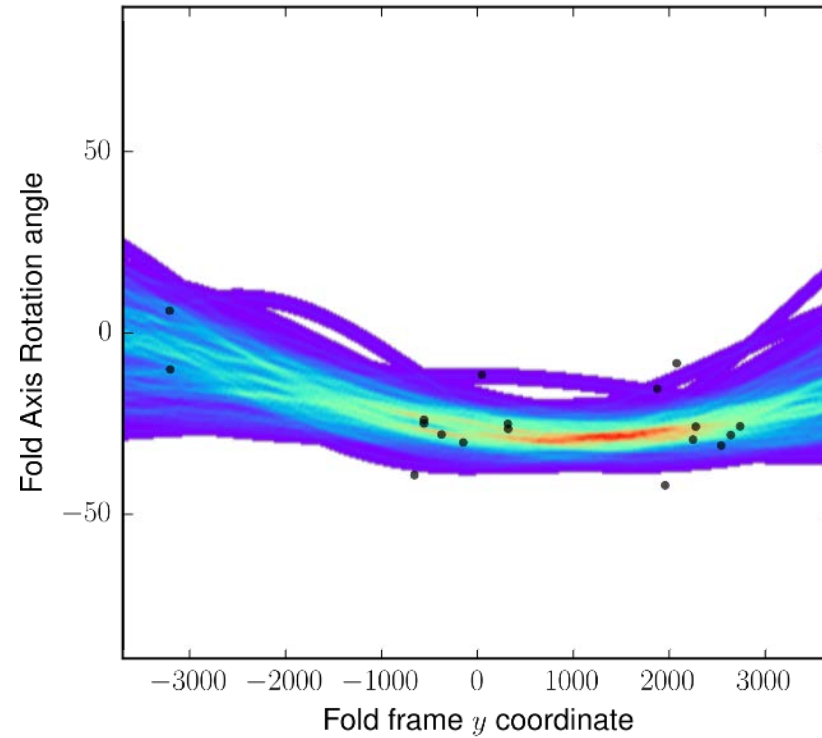
- Fourier coefficients – Normal distribution
- Wavelength – Normal distribution
- Uncertainty – Jeffery's prior (uninformative)

- Sample from joint posterior distribution using Gaussian likelihood function and Markov Chain Monte-Carlo sampler using PyMC2
- Find joint posterior distribution for BOTH rotation angles

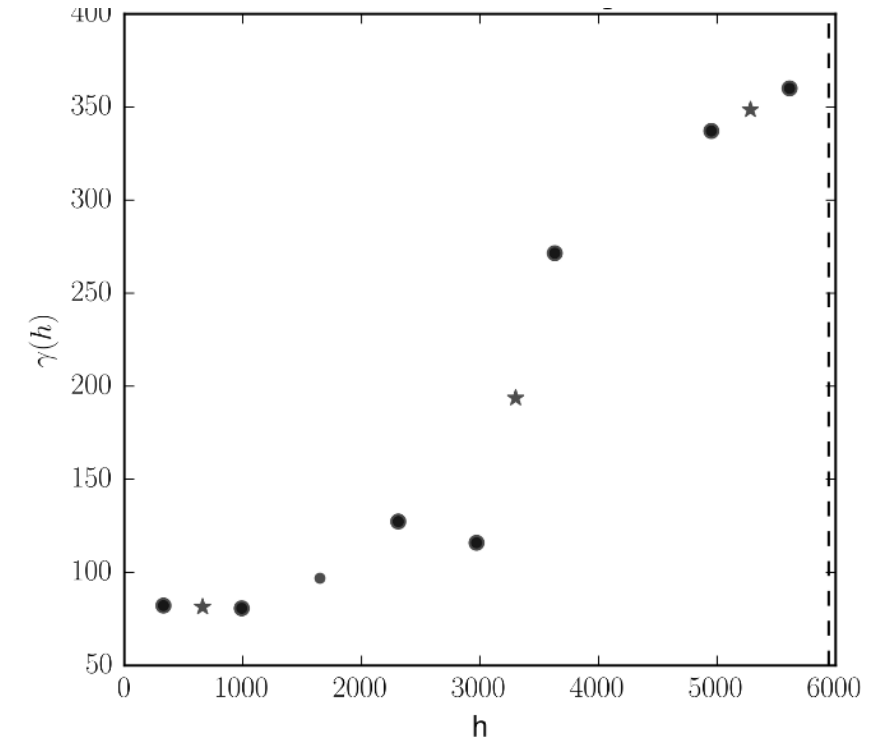
Fold axis rotation angle



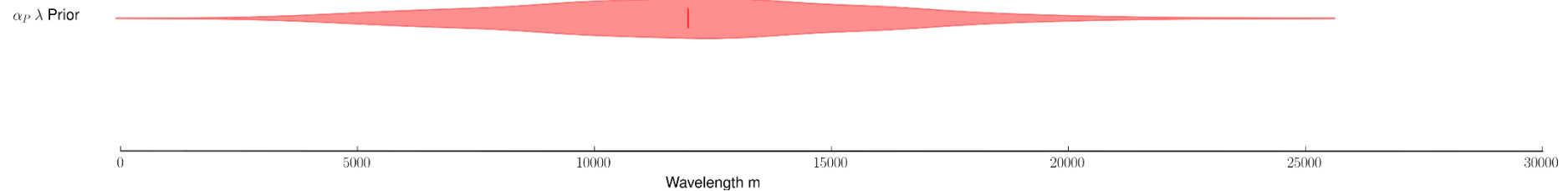
Fold Axis S-Plot



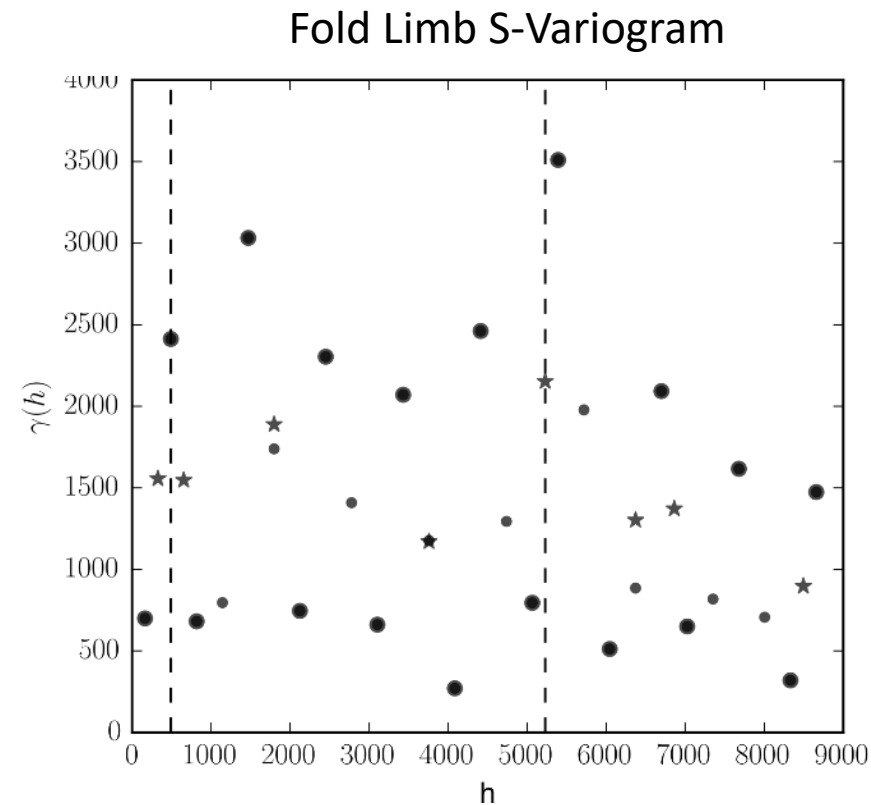
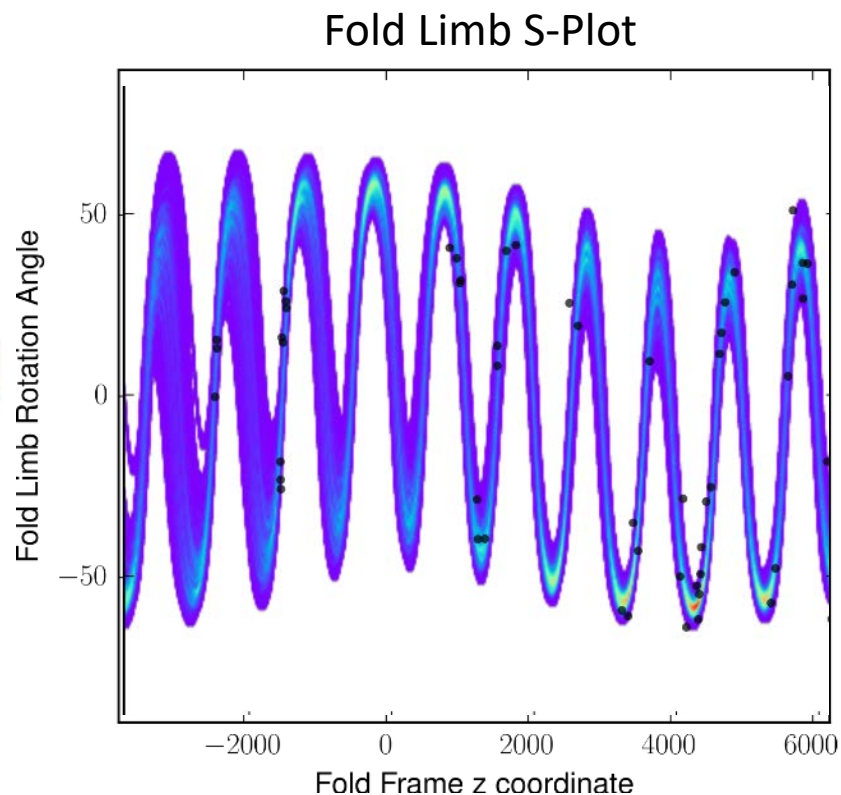
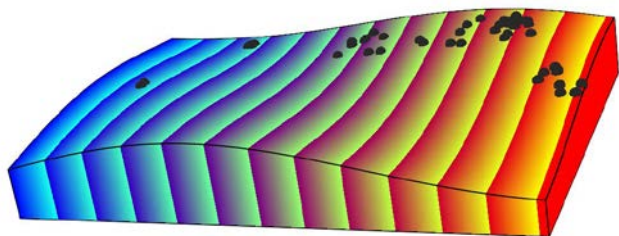
Fold Axis S-Variogram



Wavelength PDF



Fold Limb Rotation angle

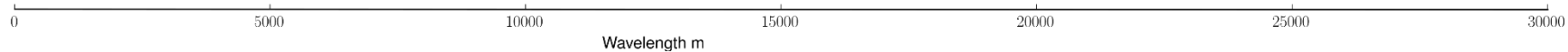


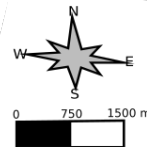
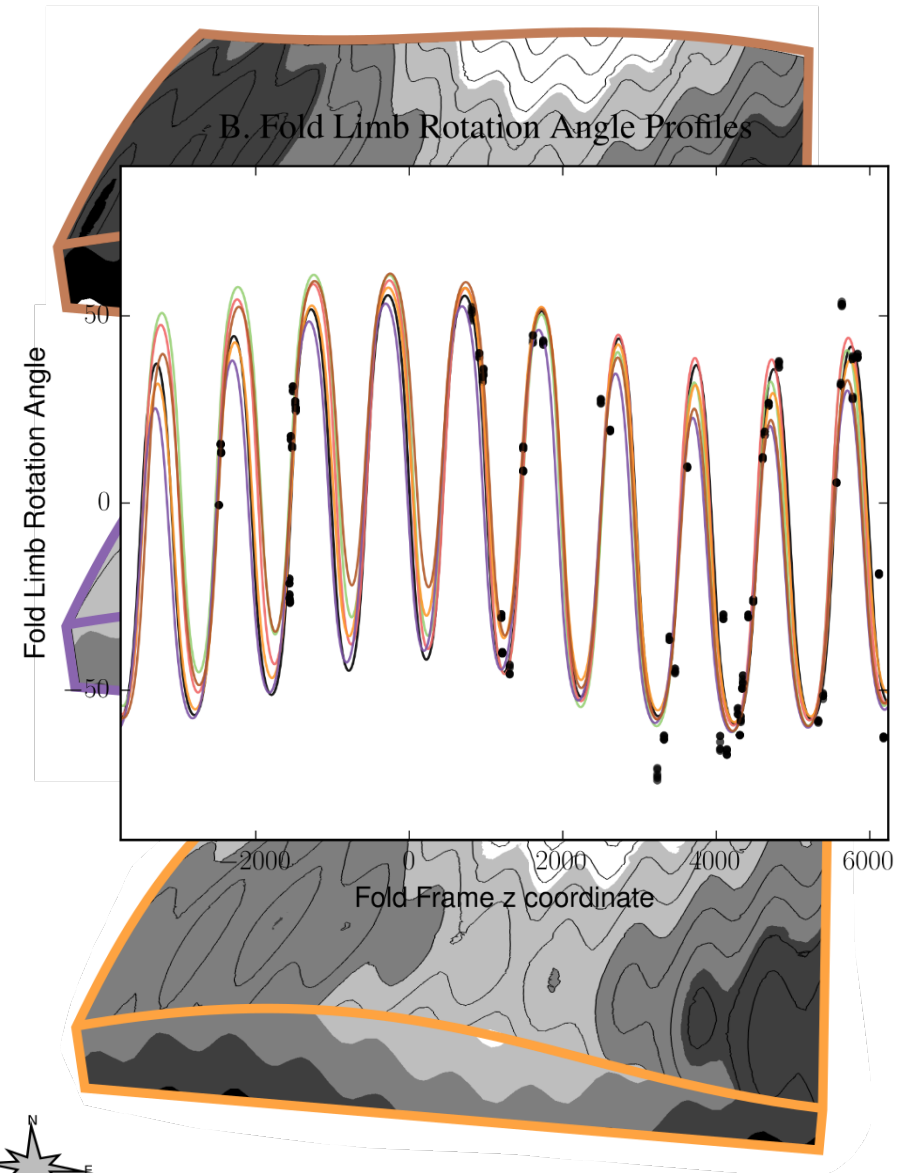
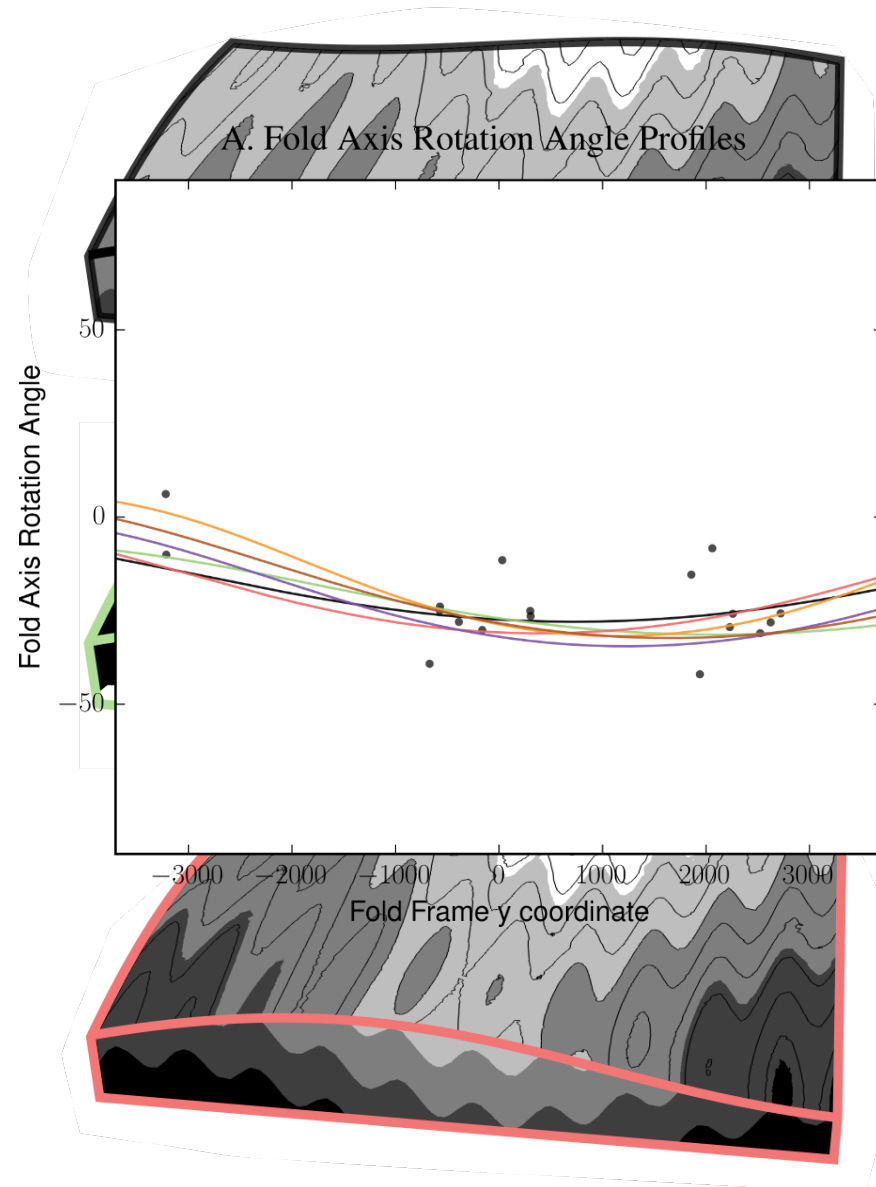
Wavelength PDFs

$\alpha_L \lambda_1$ Prior

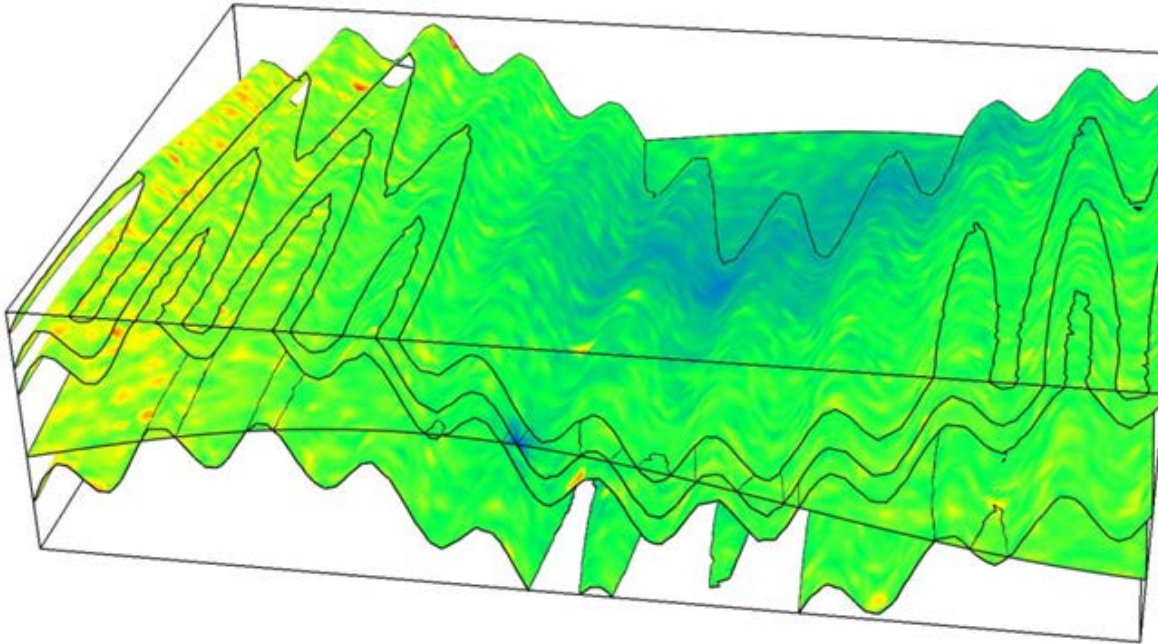


$\alpha_L \lambda_2$ Prior

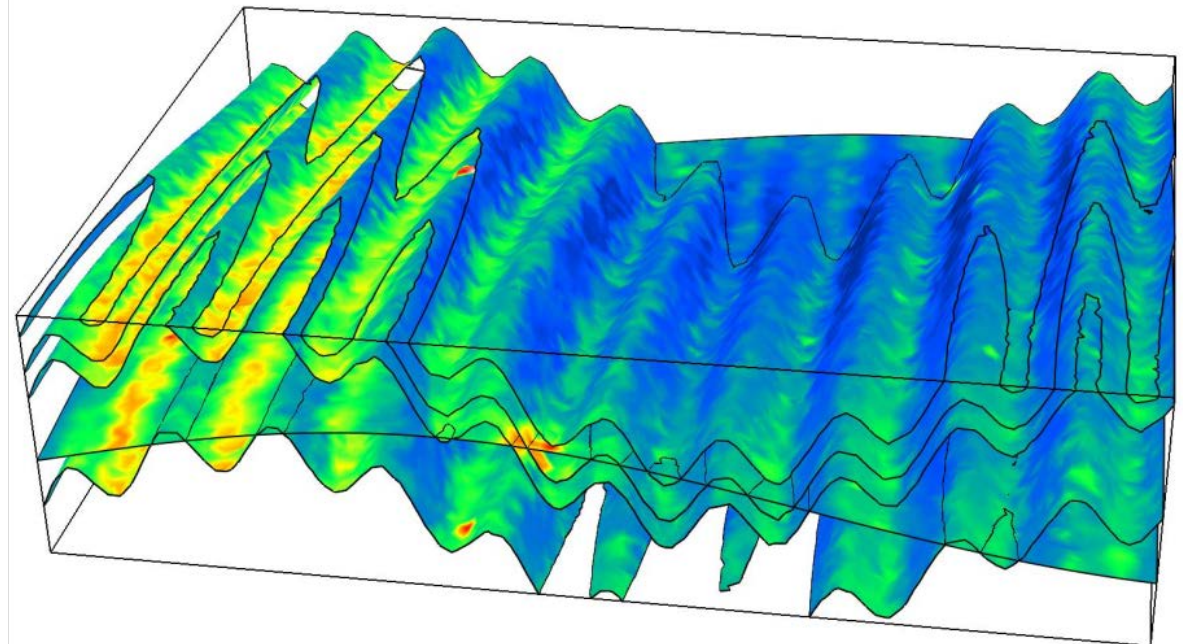


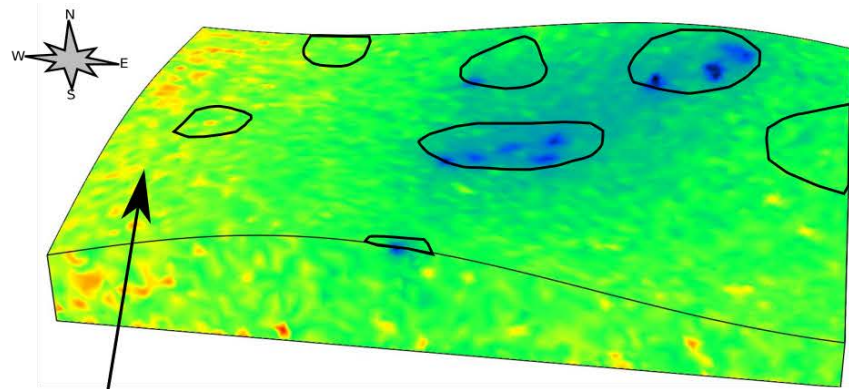


Uncertainty in scalar field value

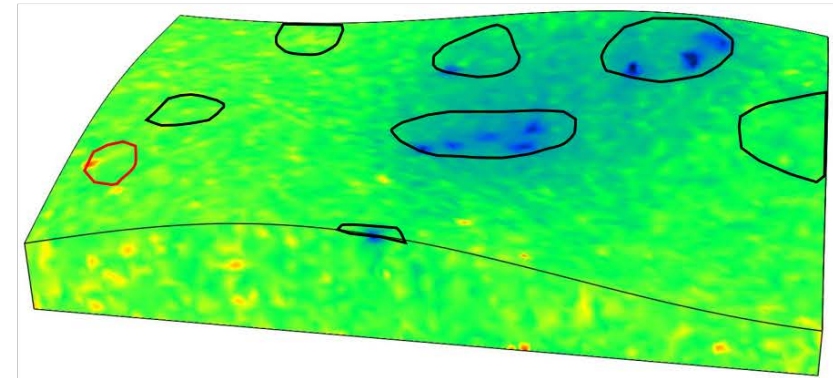


Uncertainty in scalar field geometry

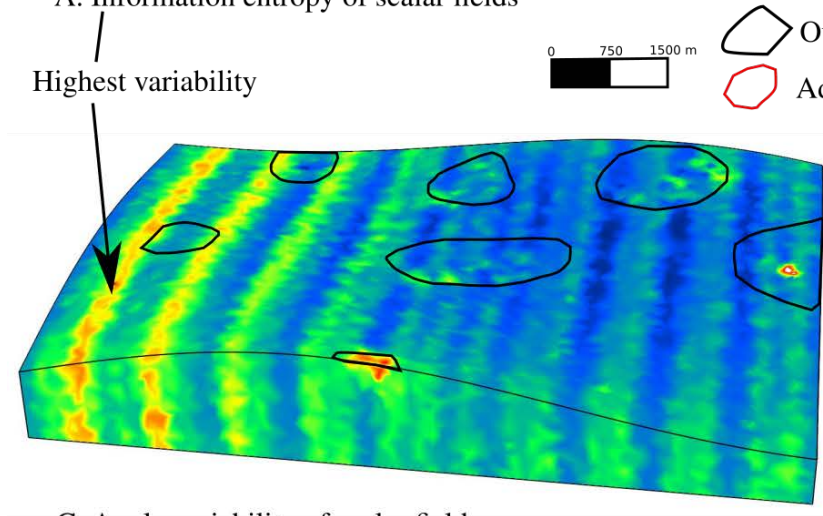




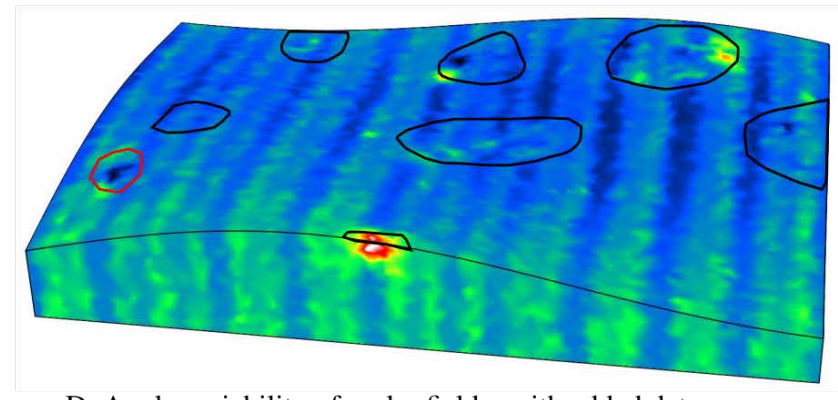
A. Information entropy of scalar fields



B. Information entropy of scalar fields: with added data



C. Angle variability of scalar fields



D. Angle variability of scalar fields: with added data

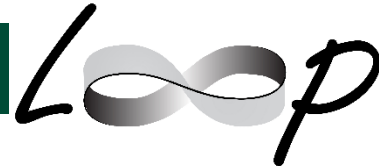
0 750 1500 m

Outcrop locations

Additional outcrop location

0 750 1500 m

Loop - How can YOU be part of it?



Loop: an new open-source software for 3D Geological & Geophysical Modelling and Simulations

- Join the open-source community – be a beta user [when available]; tell us what you need.
- Fund in-house position to work on specific aspects of the developments to be contributed to the open-source repository
- Participate via WP6 – Training and Case Study although current participating orgs will be prioritised. Requires an in-house champion.
- I am sure there are others ways... let's talk!



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MONASH University



THE UNIVERSITY OF
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Department
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Resources & Energy



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Providing geoscience data globally