

Dealing with unfittable variograms

Application of the GeoLime Sensitivity Analysis Module

**In books and class room
variograms are easy to fit ...**



... While things get more complex
in real life



One can fit the same data with different variogram models depending on:



The background is a solid green color. It is decorated with several white diagonal stripes of varying lengths and positions. Some stripes are in the top right corner, and others are in the bottom left corner, creating a modern, geometric pattern.

What do we usually do ?

*Use one acceptable
variogram model and
admit it is the best
model**



** Which we all have done*

*Unreasonably Tweak the
experimental variograms,
hide some pairs, and use a
10-structure model in a
Gaussian space^{*}*



^{} Which is valid to some point*

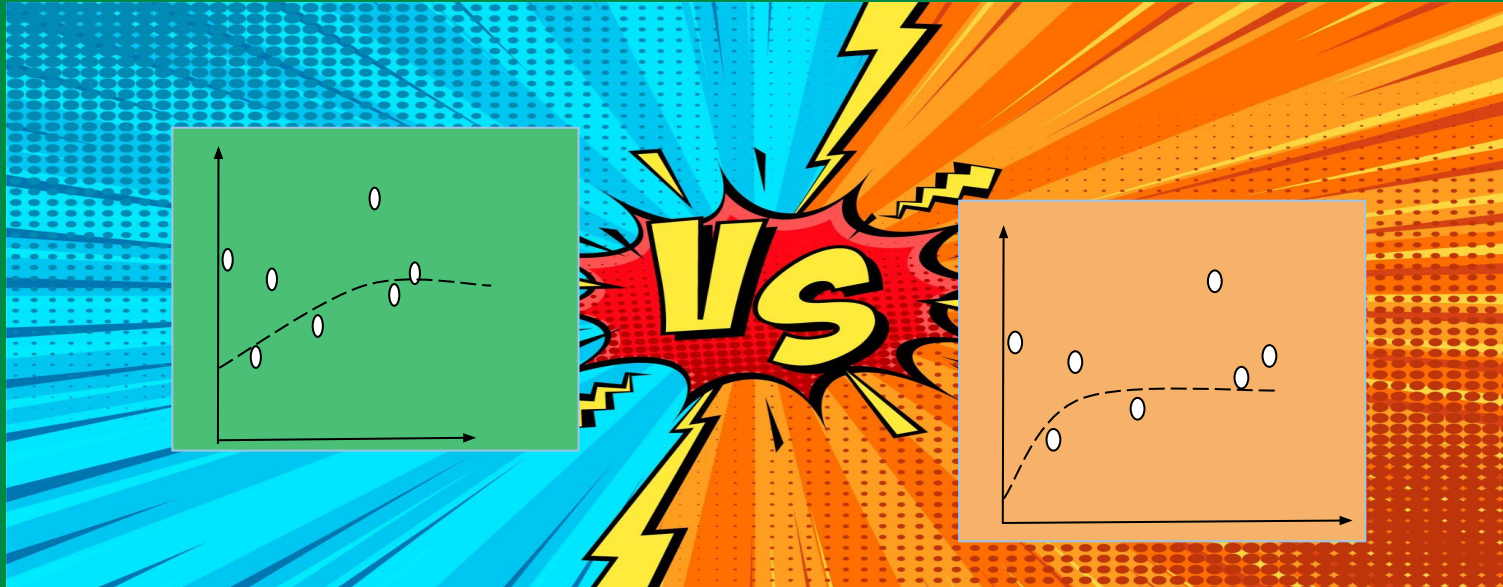
The background is a solid green color. There are several white diagonal stripes of varying lengths and positions. Some stripes are in the top right corner, and others are in the bottom left corner, creating a modern, geometric design.

Why is it a problem ?

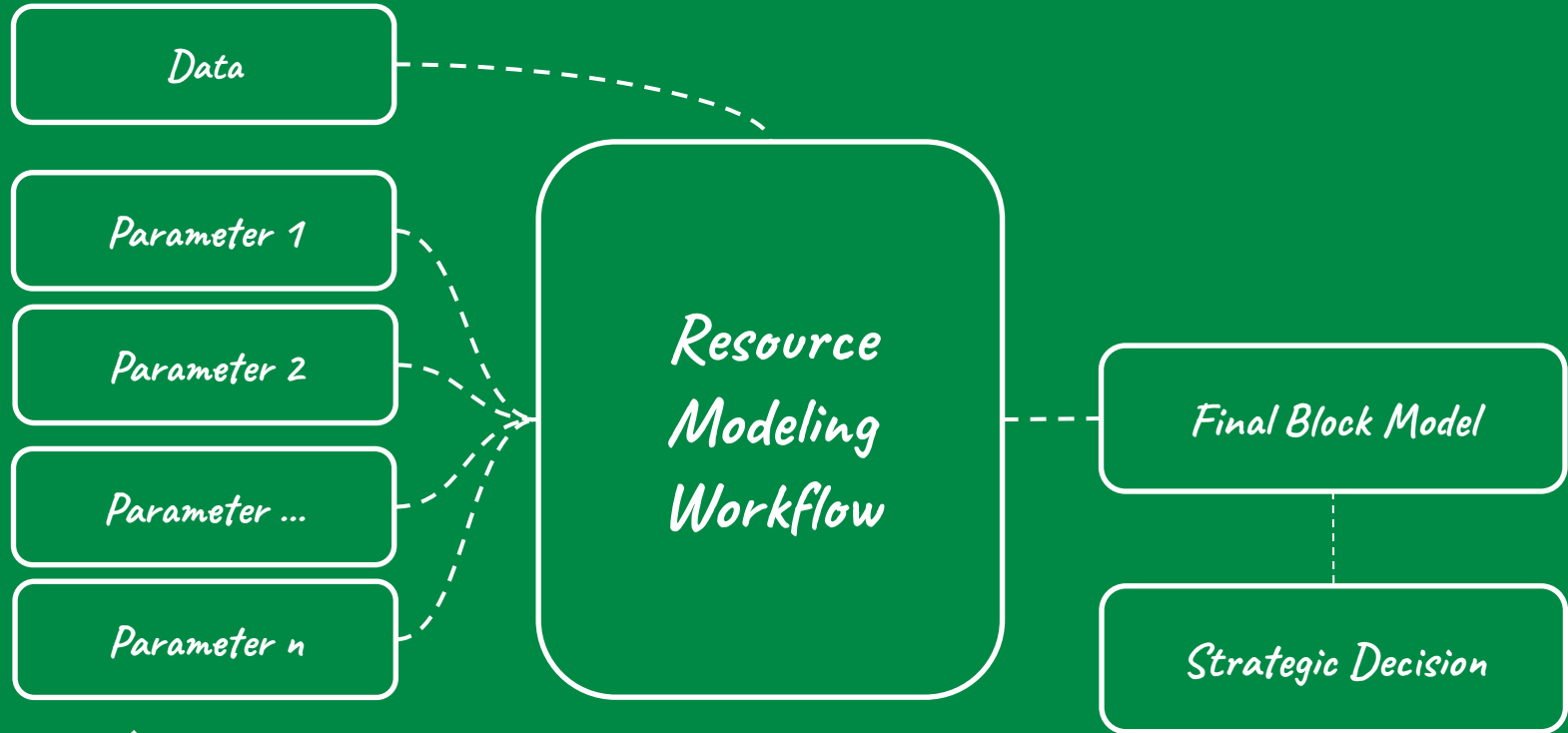


**Block model will be used for
strategic decision based on the
economic valuation of the
deposit**

Two different, but similar, variogram models might lead to two economical decisions



Deterministic modeling

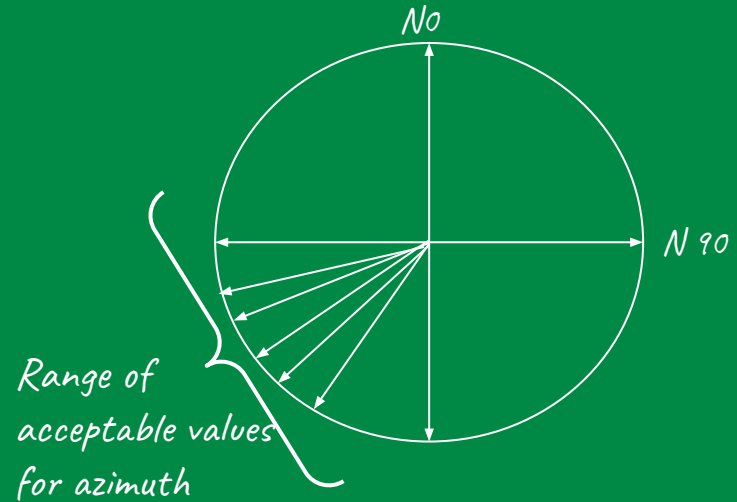
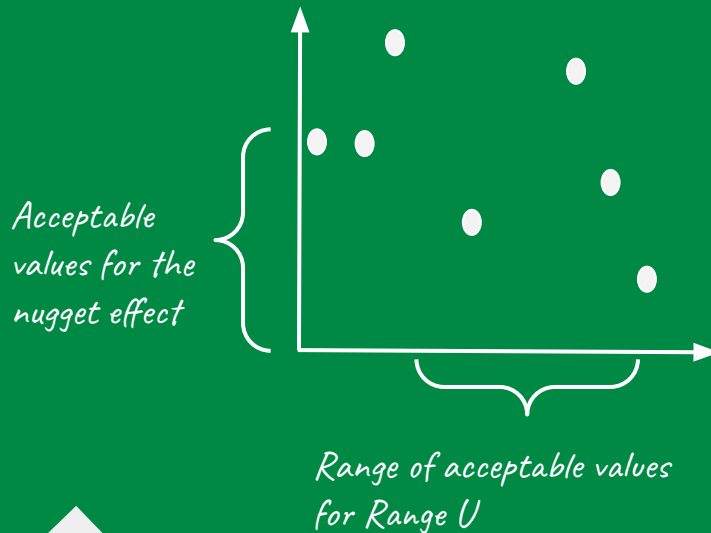


The variogram dilemma

- *If the variogram is uncertain, is the block model acceptable?*
- *Should one use the model with the highest spatial variability?*
- *So lower mining selectivity, and usually smallest economical value?*
- *Who knows what would happens if we used another nugget effect?*

The variogram dilemma

One cannot always be sure of the model to use



The background is a solid green color. There are several white diagonal lines of varying lengths and positions. Some are in the top right corner, some in the bottom left corner, and one is on the left side. They appear to be decorative elements.

**How to solve the
variogram dilemma ?**



**First, identify the
uncertain parameters**



Anisotropy



Nugget Effect



Total Sill



Range U



Range V



Range W

Define a response

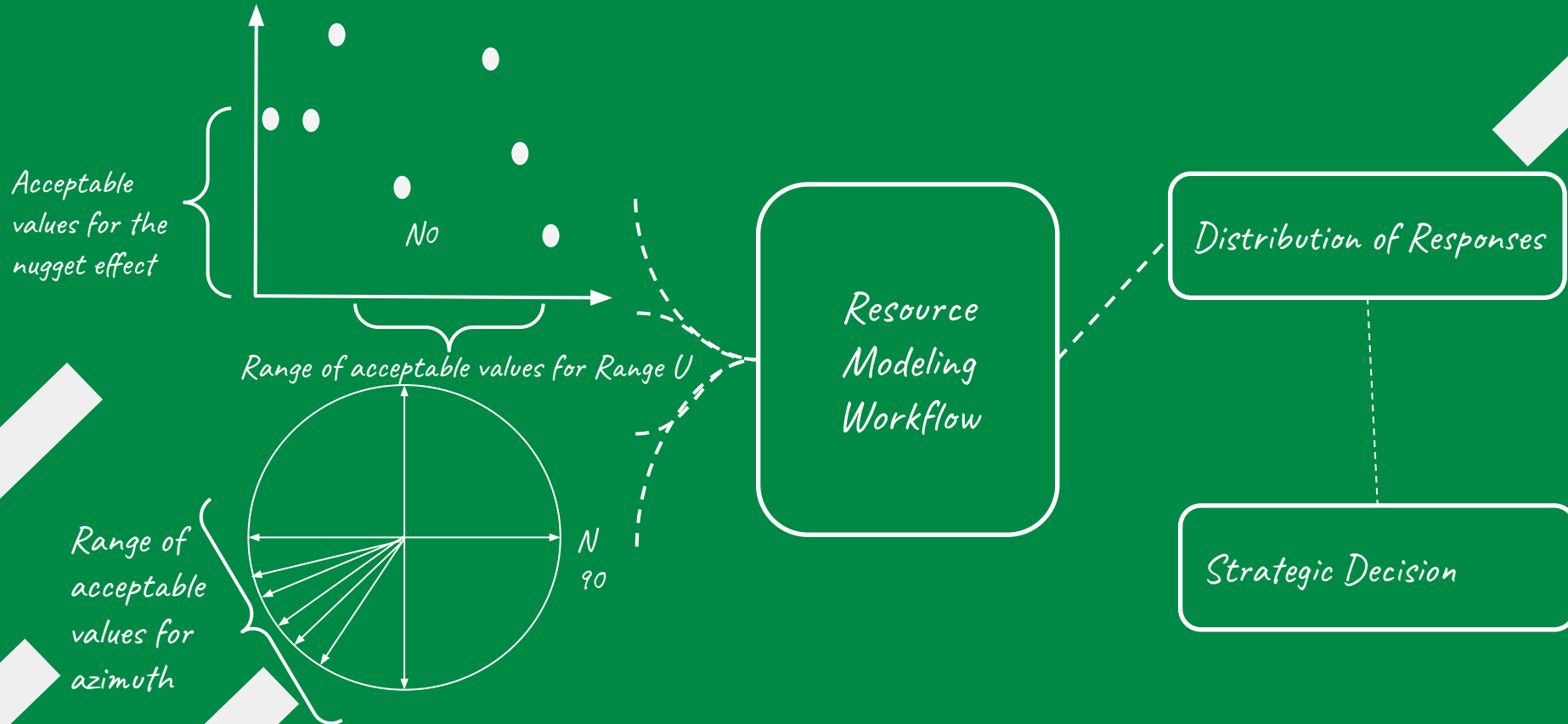
Define a metric to evaluate the difference between the models:

Ex: Total Tonne of ore at a specific cutoff

And understand the impact of the parameters on the response:

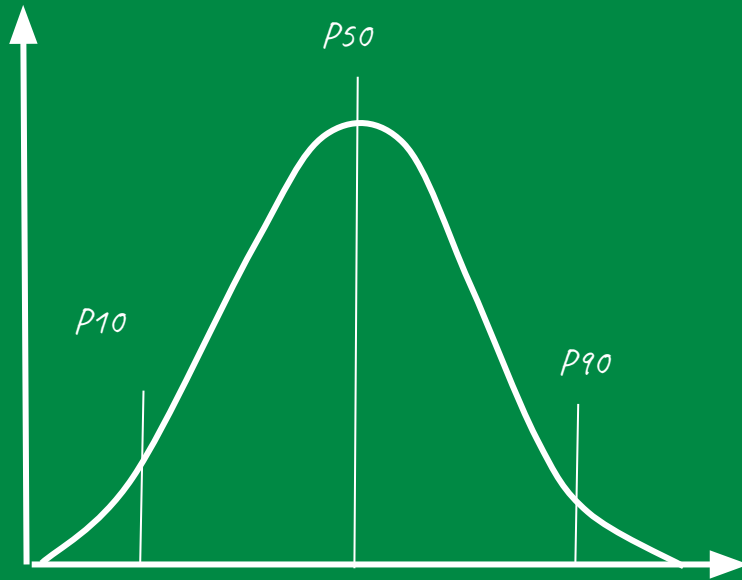
- *How much each parameter impacts on the response?*
- *What would be the distribution of the response if we could test all possible variogram models?*

Define a response



Distribution of Responses

Frequency



Response (Ore Tonnage)

Getting the distribution of the Ore Tonnage given the uncertainty over the variogram model, allow to analyze the risk on the strategic decision

The not-so-bad, but naive, solutions





With 6 parameters and 20 possible values for each parameter there would be 64 millions models to test ! If the estimation procedure (kriging, mik, etc.) takes 20 min it would be 2500 years of computation

*Testing one variable at a time (OVAT)
means the co-effect of parameters will be
missed*



Teasing on GeoLime Solution

A better Approach: Sensitivity Analysis

*Design a test plan to estimate
the distribution of the response*

*Designing a test plan to reduce the 64
millions of model to 100 model s. As we
want to get a distribution, we cannot
just select a 100 models and apply the
estimation workflow*



A better Approach: Sensitivity Analysis



Model the surface response
 $F(p_1, p_2, p_3, \dots) = \text{Total_ore}$

*GeoLime library get has a dedicated
function to test sensitivity on the ore
volume from the variogram parameters*

Specialists behind GeoLime Sensitivity Analysis

Sebastien Strebelle, PhD:


- + World-renowned geostatistician
- + Former leader geoscientist R&D at Chevron for 20 years

Claude Cavelius:

- + Former R&D engineer at Chevron for 10 years
- + Former Lead Developer at Belmont Technology
- + Currently CTO at DeepLime

Christelle Lusso, PhD:

- + R&D in academia for 6 years
- + Former data engineer at Capgemini
- + Currently R&D in AI and mathematical R&D at DeepLime



Contact us to get a demo
of the sensibility analysis
with GeoLime

Contact@deeplime.io