



# Preparing Gaussian Stochastic Processes for Coupling Landslide Hazards



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## Introduction

Landslides are a devastating natural disaster.

We hope to:

- Pinpoint the effects of landslide hazards in susceptible regions
- Forecast landslide hazards more efficiently for civil protection
  - Who and when to evacuate

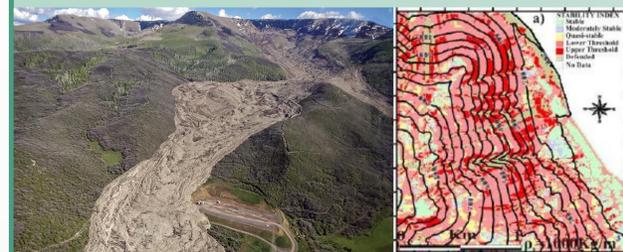
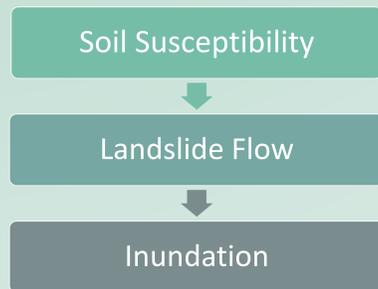


Figure 1 (left): Landslide Image [1]  
Figure 2 (right): Susceptibility Map [2]



Our goal is to create a proficient strategy to predict landslides. The approach:

- Couple flow and susceptibility
- Utilize Gaussian Stochastic Processes (GaSP) and Logistic Regression

## Objectives

- Use GaSP on coupled landslide flow
  - Implement a model in Python (open-source)

## Accomplishments

1. A basic GaSP was modeled, using external Python packages.

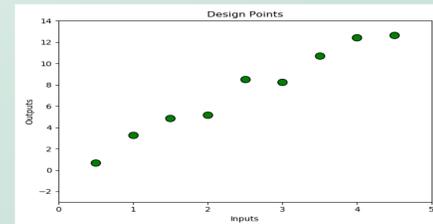


Figure 2: The Design Points

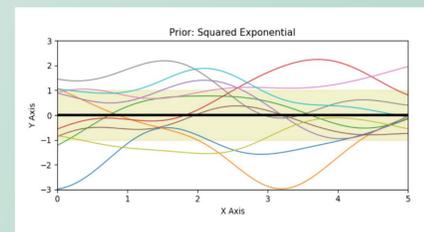


Figure 3: Random Functions

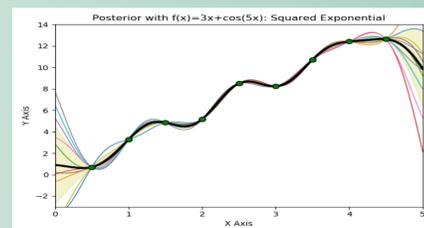


Figure 4: GaSP - Random Functions Fit to Data

2. Developed code for composite computational models using trivial functions.

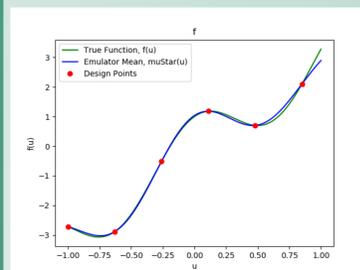


Figure 5 (left): GaSP of  $f(u)$

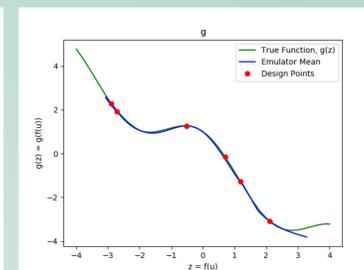


Figure 6 (right): GaSP of  $g(z)$

Functions  $f(u)$  and  $g(z)$  are linked together to create a GaSP of the composite function.

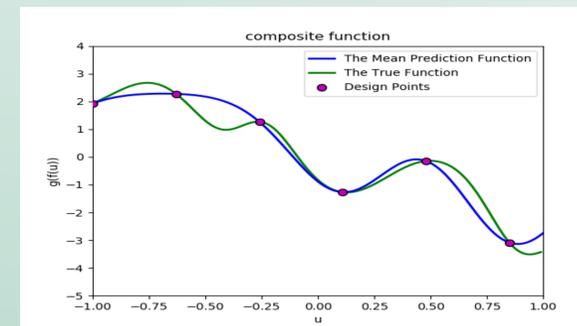


Figure 5: The Inbuilt Gaussian Process on Composite Data

Clearly, inbuilt Gaussian packages are not quite ready to handle linked functions.

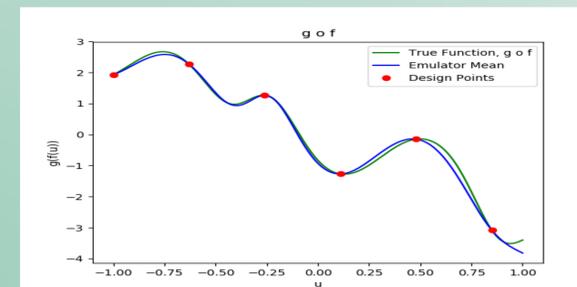


Figure 6: Linked Gaussian Process

Implemented linked GaSP theory in Python accurately created a linked Gaussian process.

3. The inbuilt GaSP packages were modified to accept 2D arrays and create 2D gaussians. The code is easily adjustable for other degrees of input arrays.

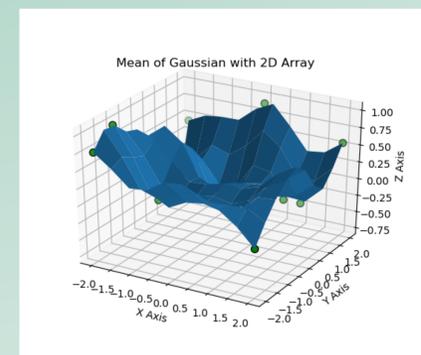


Figure 8: 2 Dimensional GaSP

## Future Steps

- Try to utilize the inbuilt Gaussian Process functions for the current linked GaSP code
- Combine the 2D array GaSP with the composite GaSP
- Apply that to landslide flow
- Couple the landslide flow model with landslide susceptibility models

## Resources

- [1] – Jon White, Colorado Geological Survey.
- [2] Gabriel Legorreta Paulin. *Assessment of Landslides Susceptibility*. Department of Geology, SUNY at Buffalo, 2007.
- [3] Kyzurova, Ksenia (2017). *On Uncertainty Quantification for Systems of Computer Models*. Dissertation, Duke University.
- [4] F. Predregosa, G. Varoquaux, et. All. Scikit-learn: Machine learning in Python. *Journal of Machine Learning Research*, 2011.
- [5] Carl Edward Rasmussen and Christopher KI Williams. Gaussian processes for machine learning. *The MIT Press, Cambridge, MA, USA*, 38:1-20,2006.
- [6] J. Sacks and W. Welch. Design and analysis of computer experiments (course notes). *National Institute of Statistical Sciences*, 2010.
- [7] Jan Hendrik Metzen. Illustration of prior and posterior gaussian process for different kernels.

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