# **Mixed Lp norm inversion**

Gravity gradient data inversion using mixed Lp norm regularization.

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# Requirements

- Python 3.6 or later
- SimPEG (https://simpeg.xyz/) can be installed following (https://docs.simpeg.xyz/content/basic/installing.html).
- After successful installation of the official SimPEG, install a modified version from Xiaolong's github (https://github.com/xiaolongw1223). Xiaolong made a few changes, yet haven't pull request so far.
  - The modifed version of SimPEG can be installed by using pip:

pip install git+https://github.com/xiaolongw1223/simpeg.git@Joinv\_0.13.0\_gzz --upgrade --user

# **Running codes**

After unzipping the two zipped files,

• In an IPython console

run MixedLpInversion.py Input.json

• In a command terminal

\$ python MixedLpInversion.py Input.json

# Introduction of "Input.json" file

- data\_file: observed gravity gradient data.
- mesh\_file: model discretization or parameterization.
- example: we can select either "spheric" or "horse" to perform inversion using spherical anomaly body or horse shoe shaped model, respectively. And the results (e.g., figures and data) will be stored in the corresponding folders named by the date and time.
- topography: added topography.
- lower\_bound and upper\_bound: lower and upper bound applied to constraint inversion.
- norm\_p: norm value implemented on the smallness component of regularization term.
- norm\_q: norm value implemented on the three smoothness componenets of regularization term.
- alpha\_s: a constant weighting parameter for smallness component.

- alpha\_x: a constant weighting parameter for smoothness component in x direction.
- alpha\_y: a constant weighting parameter for smoothness component in y direction.
- alpha\_z: a constant weighting parameter for smoothness component in z direction.

#### **Examples**

- p=q=2: classic L2 norm inversion (Li and Oldenburg, 1996, 1998)
- p=q=1 or 0: sparse inversion (Farquharson, 2008; Sun and Li, 2014)
- p!=q: mixed Lp norm inversion (Fournier and Oldenburg, 2019)
- alpha\_s=0, q=0: focusing inversion (Portniaguine and Zhdanov, 1999)
- alpha\_s=0, q=1: total variation inversion (Rudin et al., 1992)

### Reproducibility

 To reproduce our results, we have created two example folders: Example1\_spheric and Example2\_horseShoe, that contain the observed data, mesh and topography files. To reproduce the inversion results in Figure 2(a), the Input.json file looks like the following:

```
"data_file": "gzz.obs",
"mesh_file": "mesh.txt",
"example": "spheric",
"topography": "topo.topo",
"lower_bound": -1,
"upper_bound": 0.2,
"norm_p": 1,
"norm_q": 2,
"alpha_s": 1,
"alpha_x": 0,
"alpha_y": 0,
"alpha_z": 0
```

#### References

Cockett, R., Kang, S., Heagy, L.J., Pidlisecky, A. and Oldenburg, D.W., 2015. SimPEG: An open source framework for simulation and gradient based parameter estimation in geophysical applications. Computers & Geosciences, 85, pp.142-154.

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