#### **Open Source**



## Tools?

- Want software for...
  - EM Simulations: FDEM, TDEM
  - Inversions:1D, 3D, parametric
- Intended use?
  - Production scale inversion
  - Survey design
  - Research
    - Inversion methodology
    - Understanding the physics
- Two options:
  - 1) use existing software
  - 2) develop your own tools



## Option 1: use existing software

- Purchase license for software
- request academic license

#### Pros:

- Reduce development overhead
- May have been tested / used for other data sets
- Often fit-for-purpose

Cons:

- Proprietary and not accessible
  - Available as executable
- Source code may be impenetrable:
  - optimized and written by one (maybe two) people
  - spaghetti code in a foreign language
- Often fit-for-purpose: rigid and not easily extensible
- Restrictive use (licensing)

## Option 2: build your own

- Gather historic codes and merge/modify
- Start from scratch

Pros:

- Flexibility
- Knowledge of structure / layout of the code
- Knowledge of which aspects are tested (and not)
- Extensibility
  - Can be designed with future development / research questions in mind

Cons:

- Daunting! Need strong background in scientific computing
  - And software engineering skills
- Time commitment
  - Esp. if transferability is a priority
- Challenging to publish
- It is not regarded as a scientific contribution

### Option 3??

### Option 3: wish-list

- Collaboration
  - Development of software
  - Implementing and applying
- Development practices
  - Shared repository
  - Version control
  - Automated testing
  - User and developer documentation
  - Peer review of code
  - Issue tracking
  - Attribution for contributors
  - Licensing

# **Option 3: Open Source**

- Collaboration
  - Development of software
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  - User and developer documentation
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  - Issue tracking
  - Attribution for contributors
  - Licensing

Open source communities already doing this:



#### **LL 253** contributors

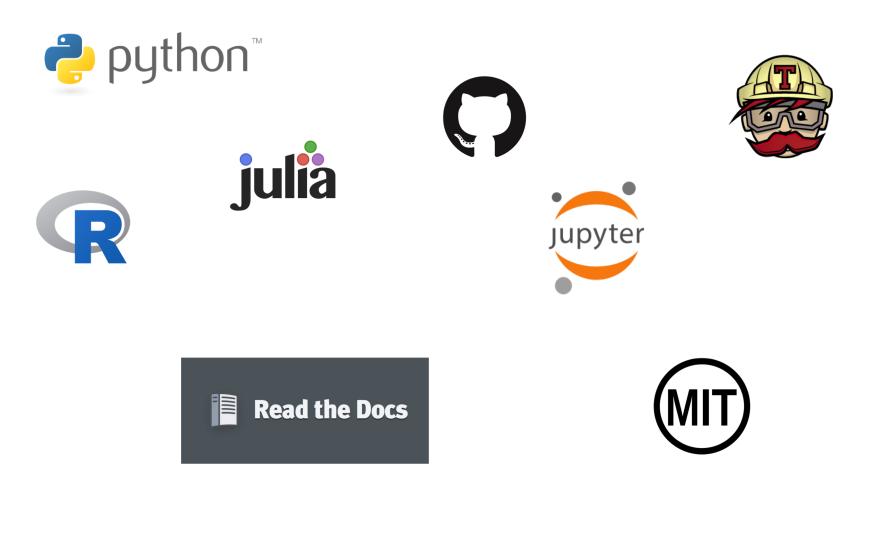


#### 1,095 contributors



41 612 contributors

#### Tools in the open source ecosystem

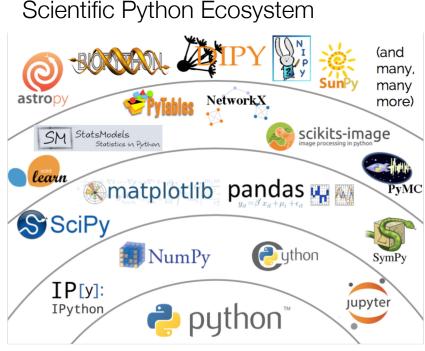


and many more ...

## Freely available modern languages



- Facilitates collaboration and reproducibility (by anyone!)
- Easier on-boarding of new users / graduate students
- Communities developing corepackages that can be re-used

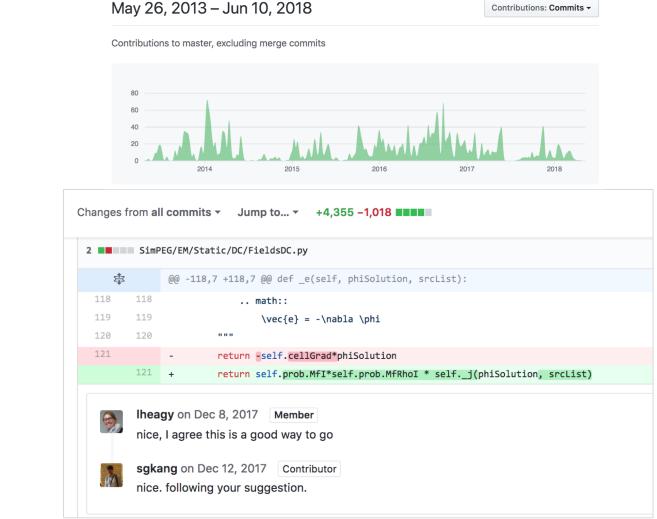


From Jake VanderPlas "State of the Tools", SciPy 2015

### GitHub

56 branches

**7 4,783** commits



♦ 35 releases

15 contributors

কাঁু MIT



- Version control
- Issue tracking
- Code-reviews
- Attribution

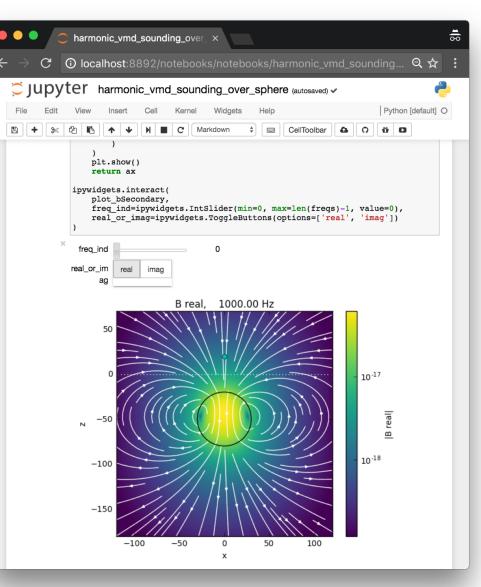
#### Jupyter notebooks



- Computational narratives / documented workflows
- Interactive computing
- Widgets
- Resources to distribute
   reproducible notebooks



Microsoft Azure Notebooks



## Testing



- TravisCI, CircleCI, ...
- Automated testing
- Runs on every change to the codebase
- Test changes / new contributions before distributing

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#### Documentation

#### **Read the Docs**

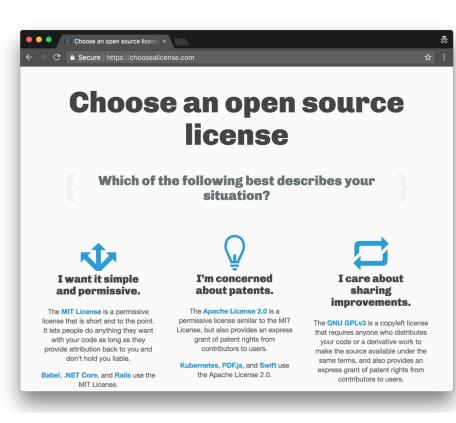
- Read the Docs
- Documentation hosting
- Updated with changes to distributed version of code
- Searchable
- uses documentation strings within codebase



#### Licenses



- Specifies how others can use / adapt software
- Most Python projects use permissive licenses (MIT or BSD-3)
  - Facilitates collaboration
  - allows industry and academic use





## Some big benefits

- Collaboration
- Ease of testing
- Useable software
- Problem solved faster
- Modification is easier
- Learn by reading existing codes
- Share analysis and results
- Reproducibility
- Attribution
- Continually improving set of tools in the open-source ecosystem
- Building a community

- For EM
  - empymod
  - jlnv
  - pyGIMLi
  - Fatiando
  - SimPEG

. . .

- emTmod jinv
  - Geophysical Inversion & Modelling Library





- For EM
  - empymod
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  - Fatiando
  - SimPEG

. . . .

EM forward modelling of 1D VTI media with 3D EM sources in Python



**DYGIMLi** Geophysical Inversion & Modelling Library





- For EM
  - empymod – jilnv
  - pyGIMLi
  - Fatiando
  - SimPEG

. . . .

Framework for PDE parameter estimation in Julia. Contains building blocks to assemble your own simulation and inversion.



Geophysical Inversion & Modelling Library





- For EM
  - empymod
  - jlnv – pyGIMLi – Fatiando
  - SimPEG

. . . .

Multi-method library for solving inverse and forward tasks related to geophysical problems in C++ and Python. 3D DC/IP, potential fields are highlights



GIMLi

Geophysical Inversion & Modelling Library





- For EM
  - empymod
  - jlnv
  - pyGIMLi
  - Fatiando



. . .

Simulation and gradient based parameter estimation in geophysical applications, including DC/IP, EM. Written in Python



**PyGIMLi** Geophysical Inversion & Modelling Library





- For EM
  - empymod
  - jlnv
  - pyGIMLi
  - Fatiando
  - SimPEG

. . .

• They differ in objectives, capabilities, structure, interactivity, license, and language



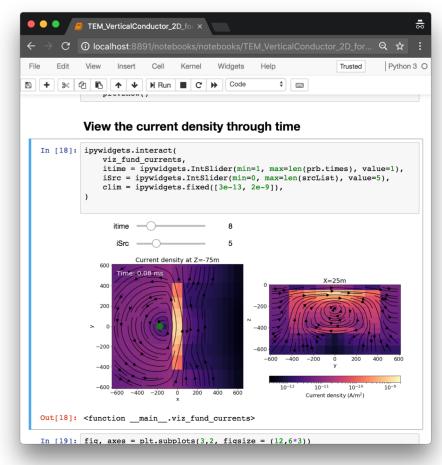
**PyGIMLi** Geophysical Inversion & Modelling Library





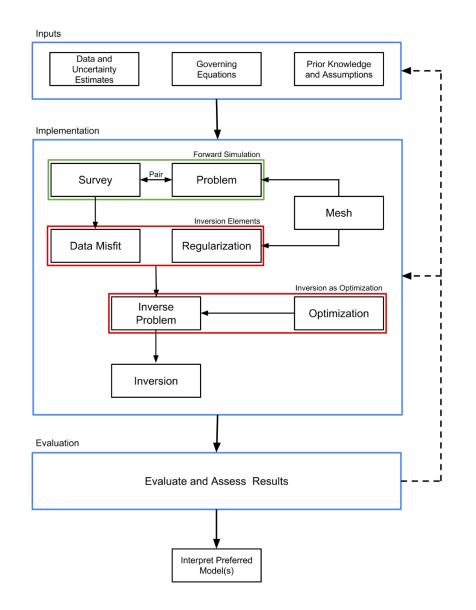


- Modular framework for simulation and inversion of geophysical data
  - gravity, magnetics, vadose flow, DC/IP, FDEM, TDEM
- Open source
- Written in Python
- Specific to electromagnetics
  - Quasi-static Maxwell
  - Tensor, OcTree, Curvilinear and Cylindrical meshes
  - Easily visualize fields, fluxes, charges

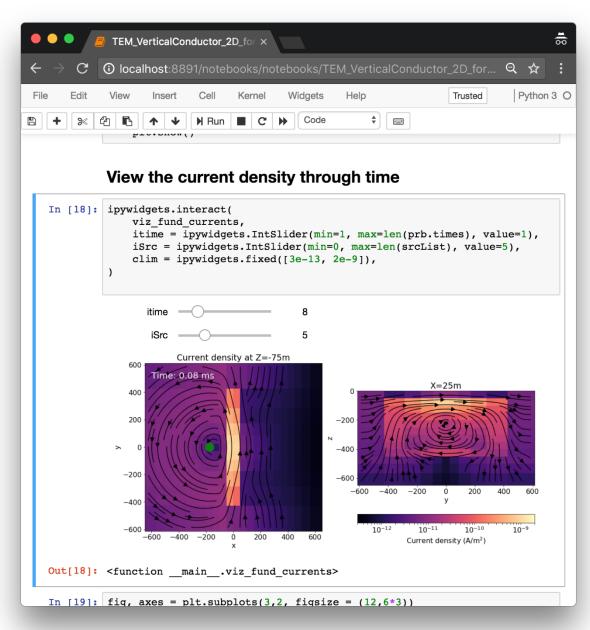




#### SimPEG: Inversion framework



#### Notebook Demo: Plate in a Halfspace



### Summary

- Need for Open source
- Open source eco-system
- SimPEG
- Jupyter notebooks and demos
  - Forward simulation
  - Inversion
- Benefits
  - Collaborating
  - Reproducibility,
  - Learning





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## Web and Open Source Resources

- Open source development: Software and resources
  - Collaborate
  - Share
  - Test changes
  - Interactive computing



Simulation and Parameter Estimation in Geophysics http://simpeg.xyz



**Github** versioning, collaborating



Travis CI testing, deploy



Jupyter interactive computing



Contributors to ubcgif/em · Git ×

Personal Open source Business Explore

Commits

mmits / 45,450 ++ / 34,858

126 commits / 14 560 ++ / 23 500

24 commits / 12.707 ++ / 4.386

Sep 20, 2015 – Jan 19, 2017 Contributions to master, excluding merge commit

heagy

📕 thast

dccowan

🔋 ubcgif / em

<> Code

GitHub, Inc. [US] https://github.com/ubcgif/em/graphs/contributors

III Projects 3

Punch card

🖽 Wiki

Network

- Pulse

Members

yangdikun

fourndo

acmajedrez

#3

233 commits / 2,553 ++ / 1,934 --

125 commits / 9.988 ++ / 5.785 -

11 Pull requests 3

Code frequency



45 commits / 520 ++ / 363

**Python** computation

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Sign up

¥ Fork 1

#4

Sign in

Contributions: Commits -

Star 6

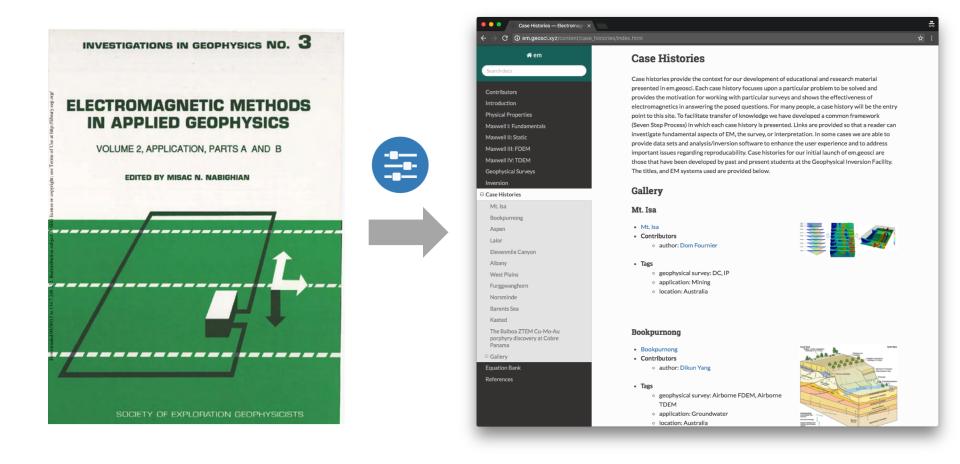
This repository Search

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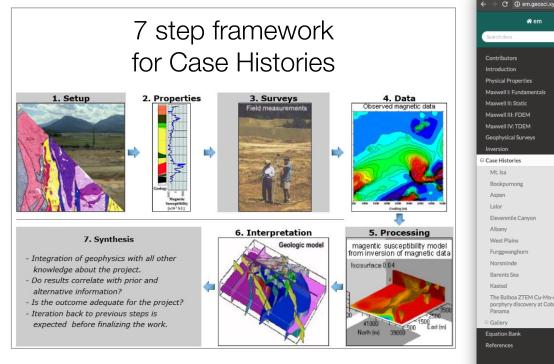
Dependents

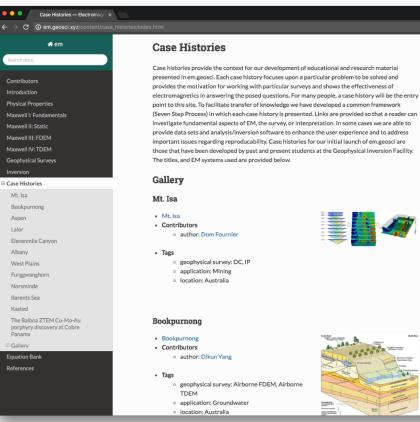
#### Resources: EM.geosci



#### http://em.geosci.xyz

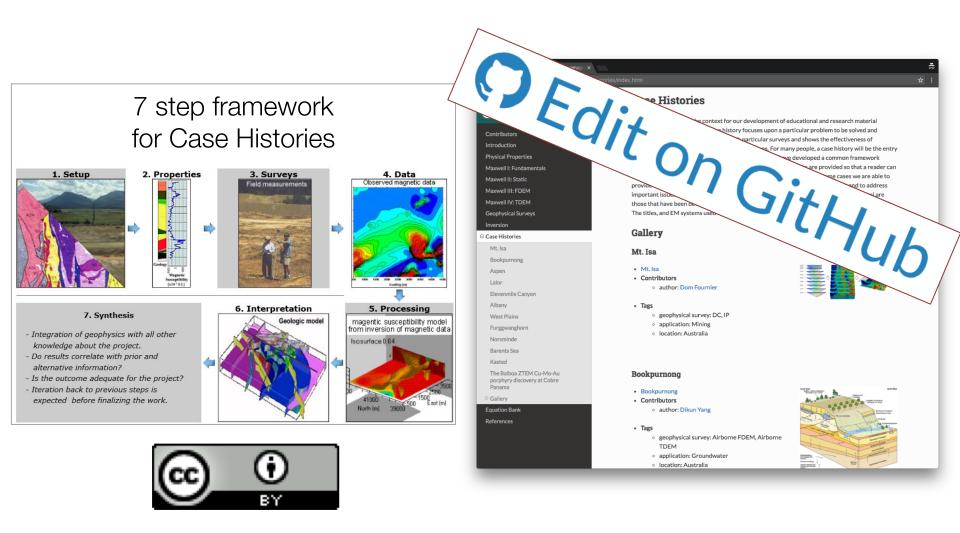
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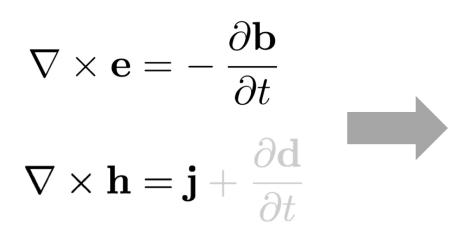
#### http://em.geosci.xyz

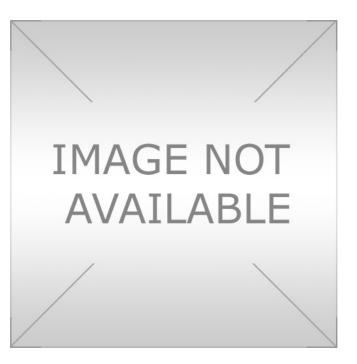
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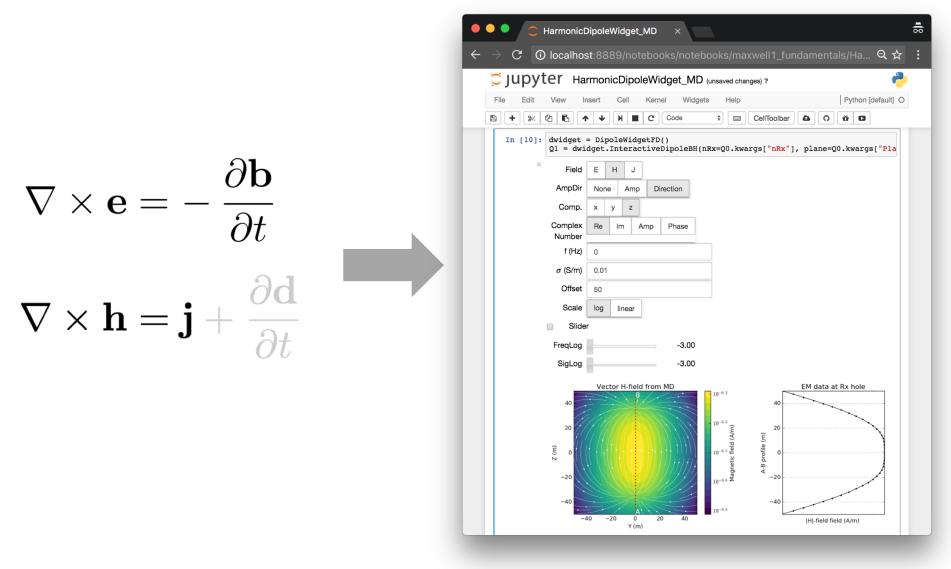
#### Why Apps





http://em.geosci.xyz/apps.html

# Why Apps



http://em.geosci.xyz/apps.html

#### Goals

- Motivation (questions supplemented with images)
  - We've seen Aarhus workshop; great examples; much information obtained with LCI;
  - What happens if the situation is 3D
  - how do the fields behave; do we need to work in 3D
  - If we decide to work in 3D what are we up against;
  - Forward modelling
  - Inversion
- Open Source plays a critical role in achieving goals
  - Talk more about this on Tuesday
  - Today: illustrate the benefits and needs of adopting this paradigm

### **Connecting & Contributing**

- Today: Slack
  - http://slack.geosci.xyz/



#### Join **GeoSci** on Slack. 3 users online now of **9** registered.

you@yourdomain.com

GET MY INVITE

- Contributing:
  - EM GeoSci
    - Case histories
    - Content
  - SimPEG
    - Software

← → C ③ em.geosci.xyz/content/case_h	iistories/index.html					
🕷 em	<b>Case Histories</b>					
Search docs						
	Case histories provide the context for our development of educational and research material presented in em.geosci. Each case history focuses upon a particular problem to be solved and provides the motivation for working with particular surveys and shows the effectiveness of					
Contributors						
Introduction	electromagnetics in answering the posed questions.	electromagnetics in answering the posed questions. For many people, a case history will be the entry point to this site. To facilitate transfer of knowledge we have developed a common framework				
Physical Properties						
Maxwell I: Fundamentals	(Seven Step Process) in which each case history is presented. Links are provided so that a reader can investigate fundamental aspects of EM, the survey, or interpretation. In some cases we are able to provide data sets and analysis/inversion software to enhance the user experience and to address					
Maxwell II: Static						
Maxwell III: FDEM		provide data sets and analysis/inversion sortware to ennance the user experience and to address important issues regarding reproducability. Case histories for our initial launch of em.geosci are				
Maxwell IV: TDEM	those that have been developed by past and present students at the Geophysical Inversion Facility.					
Geophysical Surveys	The titles, and EM systems used are provided below.					
Inversion						
□ Case Histories	Gallery					
Mt. Isa	Mt. Isa					
Bookpurnong						
Aspen	Mt. Isa					
Lalor	Contributors     author: Dom Fournier	::::::::::::::::::::::::::::::::::::::				
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Albany	Tags					
West Plains	<ul> <li>geophysical survey: DC, IP</li> </ul>					
Furggwanghorn	<ul> <li>application: Mining</li> <li>location: Australia</li> </ul>					
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Barents Sea						
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Gallery	Bookpurnong	Kuth Farl				
Equation Bank	Contributors     author: Dikun Yang					
Equation Bank References		Annual Annual Annual				
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	application: Groundwater     location: Australia	And				