

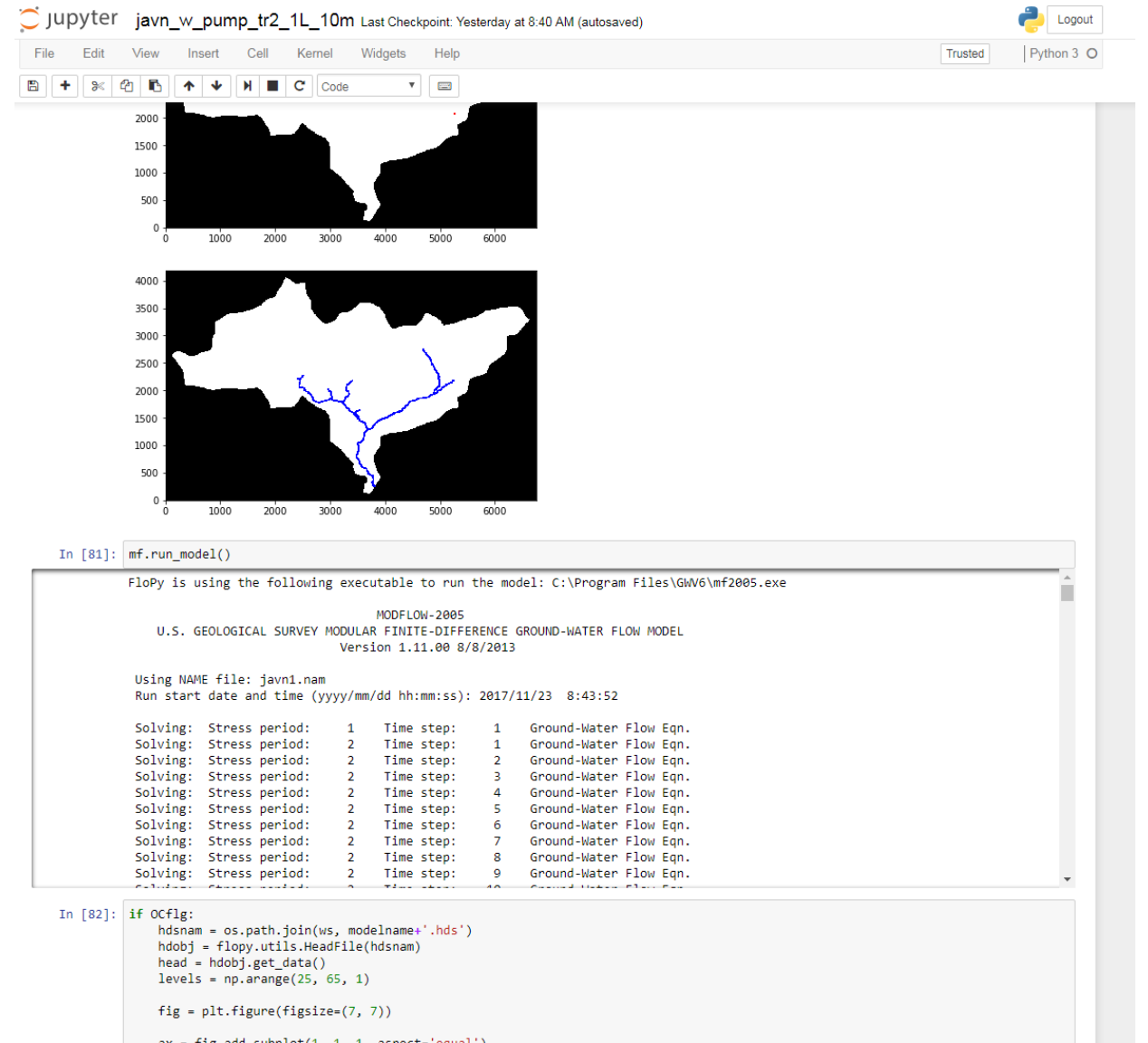
# GENTÆNK GRUNDEVANDSMODELLERING - NYE METODER TIL EFFEKTIV MODELUDVIKLING

*T.N. Vilhelmsen, S. Christensen, R.R. Frederiksen, E. Auken, A.V. Christiansen*



# INDHOLD

- Introduktion – rOpen forskningsprojektet
- Script-baseret grundvandsmodellering
- Eksempler på data mining
- Eksempler på modelopbygning
- Konklusion og perspektiver



The screenshot displays a Jupyter Notebook environment. At the top, the browser address bar shows 'jupyter javn\_w\_pump\_tr2\_1L\_10m' and the last checkpoint time 'Yesterday at 8:40 AM (autosaved)'. The notebook interface includes a menu bar (File, Edit, View, Insert, Cell, Kernel, Widgets, Help) and a toolbar with icons for file operations and execution. The main content area contains two vertically stacked maps of a geographical region. The top map is a black silhouette of the region with a white outline. The bottom map is a white silhouette of the region with a blue network of lines representing a river system. Below the maps, the notebook shows two code cells. The first cell, labeled 'In [81]:', contains the command 'mf.run\_model()'. The output of this cell is a terminal window showing the following text: 'FloPy is using the following executable to run the model: C:\Program Files\GW6\mf2005.exe', 'MODFLOW-2005', 'U.S. GEOLOGICAL SURVEY MODULAR FINITE-DIFFERENCE GROUND-WATER FLOW MODEL', 'Version 1.11.00 8/8/2013', 'Using NAME file: javn1.nam', 'Run start date and time (yyyy/mm/dd hh:mm:ss): 2017/11/23 8:43:52', and a list of solving steps: 'Solving: Stress period: 1 Time step: 1 Ground-Water Flow Eqn.', 'Solving: Stress period: 2 Time step: 1 Ground-Water Flow Eqn.', 'Solving: Stress period: 2 Time step: 2 Ground-Water Flow Eqn.', 'Solving: Stress period: 2 Time step: 3 Ground-Water Flow Eqn.', 'Solving: Stress period: 2 Time step: 4 Ground-Water Flow Eqn.', 'Solving: Stress period: 2 Time step: 5 Ground-Water Flow Eqn.', 'Solving: Stress period: 2 Time step: 6 Ground-Water Flow Eqn.', 'Solving: Stress period: 2 Time step: 7 Ground-Water Flow Eqn.', 'Solving: Stress period: 2 Time step: 8 Ground-Water Flow Eqn.', 'Solving: Stress period: 2 Time step: 9 Ground-Water Flow Eqn.'. The second cell, labeled 'In [82]:', contains the following code: 'if OCflg:', 'hdsnam = os.path.join(ws, modelname+'.hds')', 'hdoobj = flopy.utils.HeadFile(hdsnam)', 'head = hdoobj.get\_data()', 'levels = np.arange(25, 65, 1)', 'fig = plt.figure(figsize=(7, 7))', 'ax = fig.add\_subplot(1, 1, 1, aspect='equal')'.

# ROPEN FORSKNINGSPROJEKTET

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Photo: SEGES

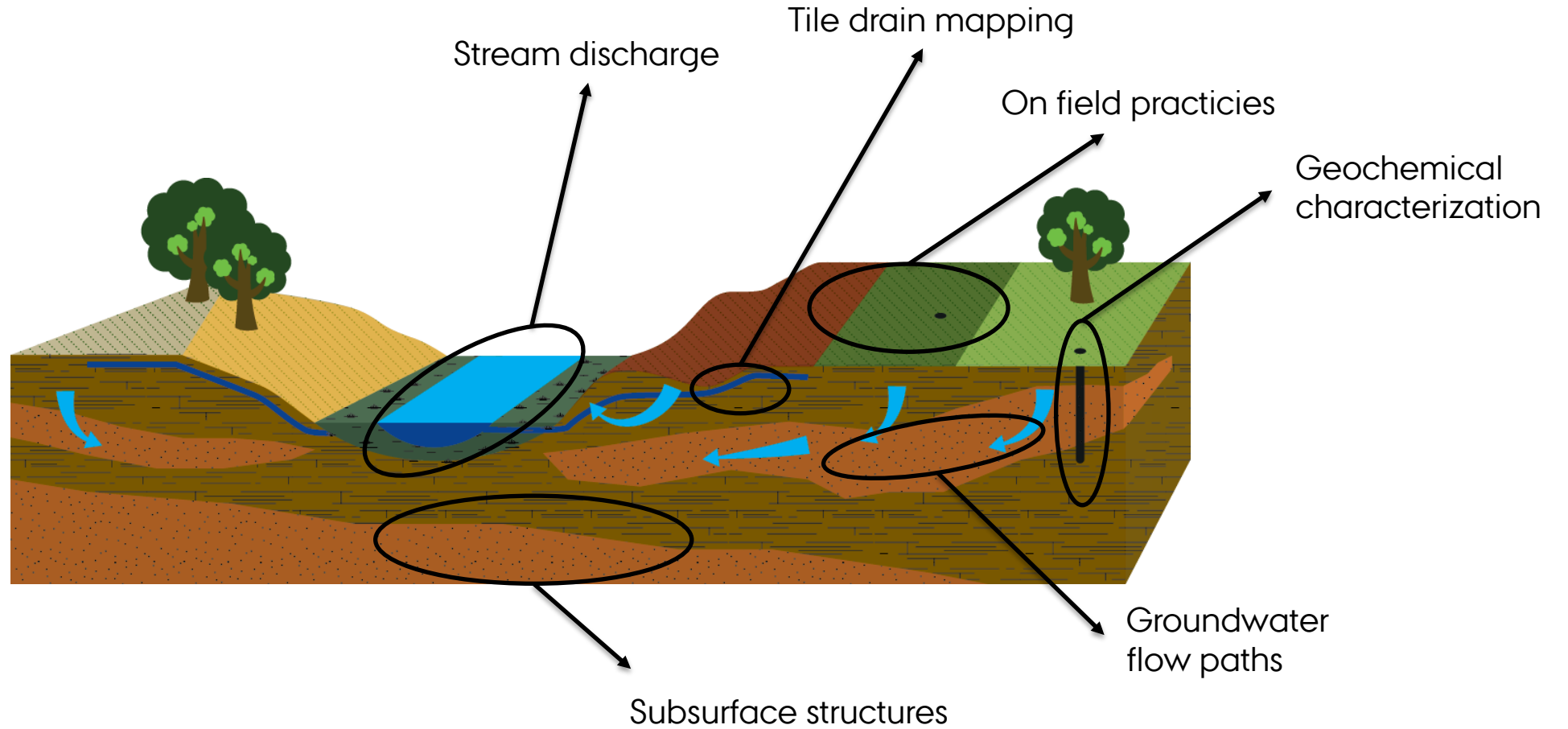
*"Identifikation af  
landbrugsarealer som er  
følsomme over for  
udvaskning af nitrat fra  
rodzonen"*



Innovation Fund Denmark

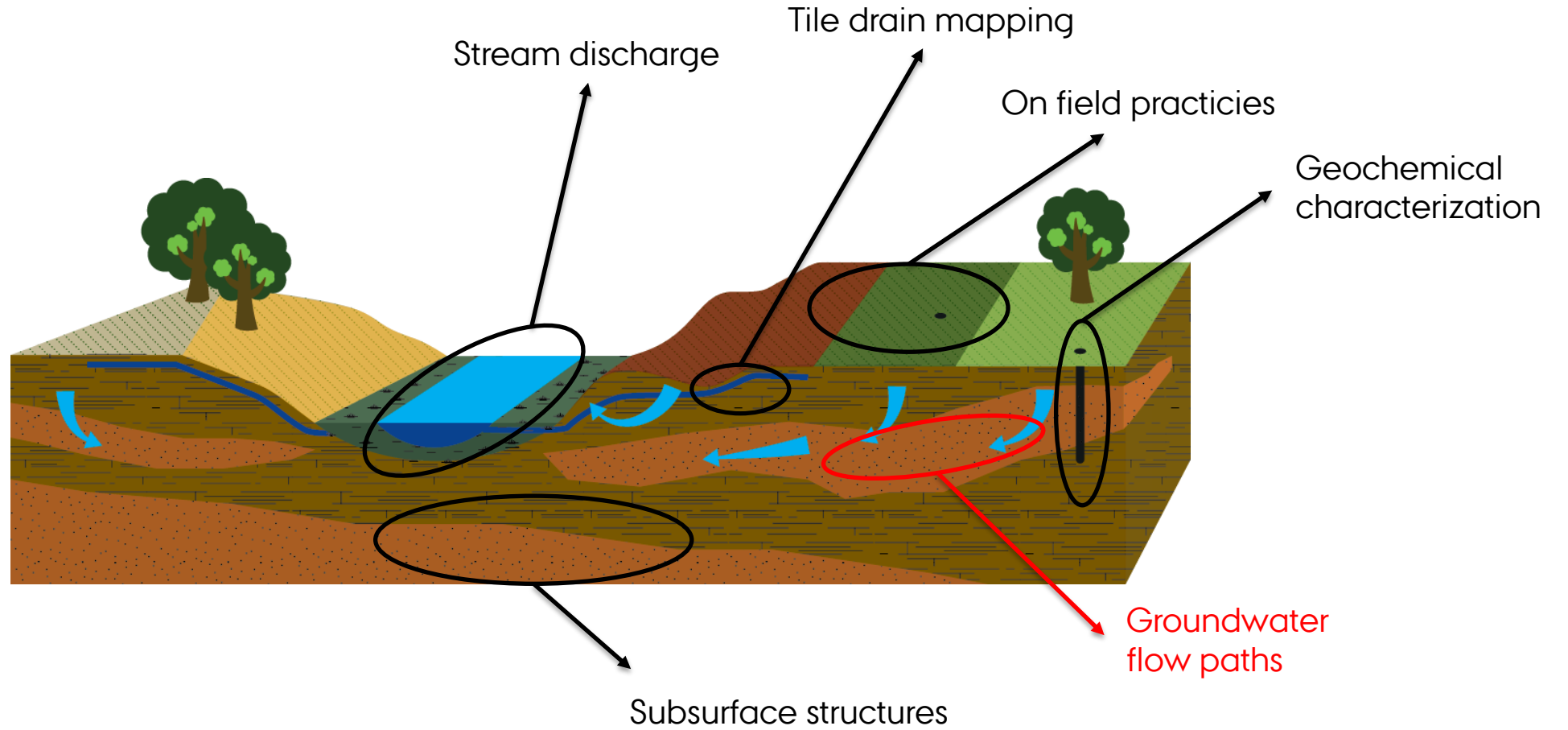
# ROPEN FORSKNINGSPROJEKTET

Analysis and management

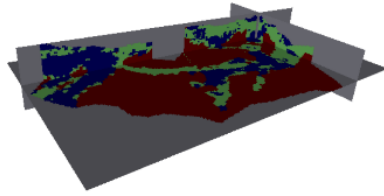
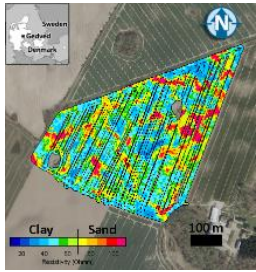


# ROPEN FORSKNINGSPROJEKTET

Analysis and management

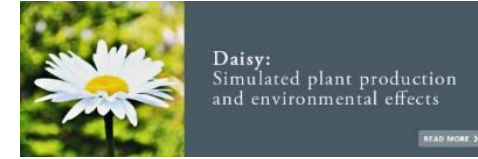


# Geophysical mapping and modelling



Dynamic model update with new data collection

# Soil - crop modelling

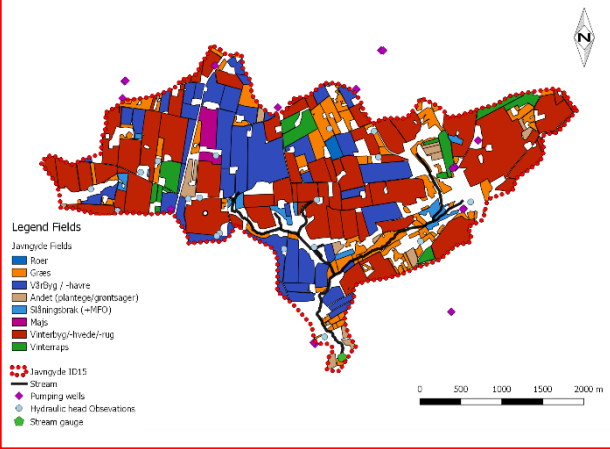


Hansen, Søren., Per Abrahamsen, Carsten T. Petersen, and Merete Styczen (2012). Daisy: Model use, calibration, and validation. Trans. ASABE 55(4): 1315-1333.

+ N-LES<sub>4</sub>

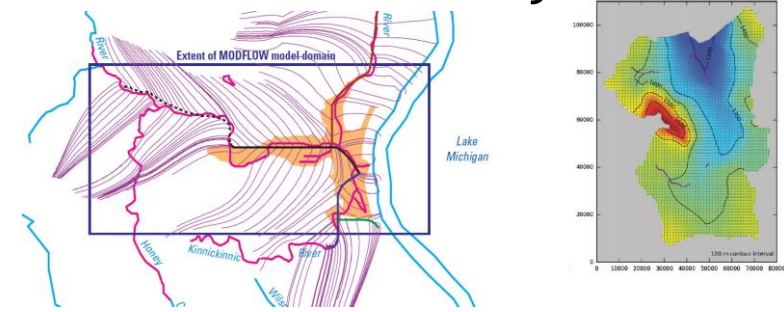
Kristian Kristensen, Jesper Waagepetersen, Christen Duus Børgesen, Finn Pilgaard Vinther, Ruth Grant and Gitte Blicher-Mathiesen (2008), Reestimation and further development in the model N-LES - N-LES<sub>3</sub> to N-LES<sub>4</sub>

GIS, land use, lithology, etc.



rOpen Decision support

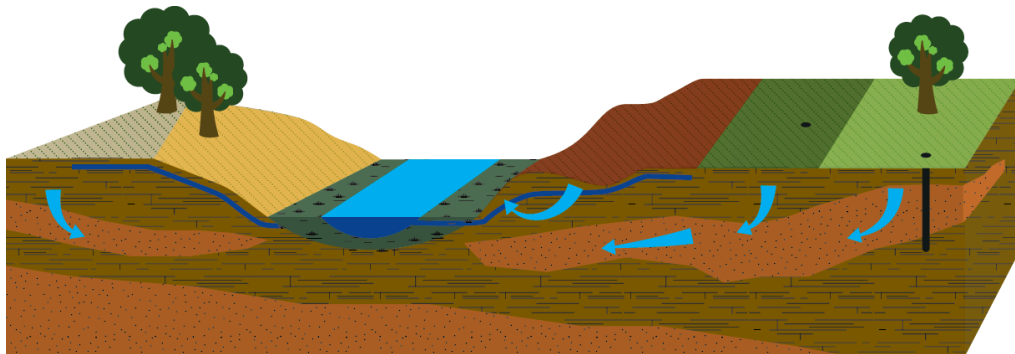
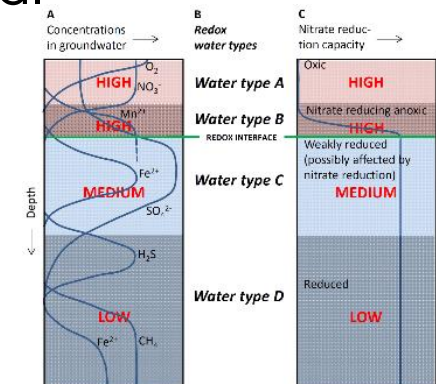
# Groundwater modelling



Harbaugh, A.W., 2005, MODFLOW-2005, The U.S. Geological Survey modular groundwater model—the Ground-Water Flow Process: U.S. Geological Survey Techniques and Methods 6-A16, variously p

Pollock, D.W., 2016, User guide for MODPATH Version 7—A particle-tracking model for MODFLOW: U.S. Geological Survey Open-File Report 2016-1086, 35 p., <http://dx.doi.org/10.3133/ofr20161086>.

# Geochemical modelling



- N-transport
- Vulnerability, streams and groundwater
- Nitrate degradation
- Identification of sensitive areas

# ROPEN FORSKNINGSPROJEKTET



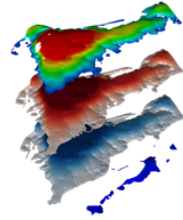
# HVAD ER SCRIPT MODELLERING?

Groundwater

Methods Note/

## Scripting MODFLOW Model Development Using Python and FloPy

by M. Bakker<sup>1</sup>, V. Post<sup>2,3</sup>, C. D. Langevin<sup>4</sup>, J. D. Hughes<sup>4</sup>, J. T. White<sup>5</sup>, J. J. Starn<sup>6</sup>, and M. N. Fioren<sup>7</sup>



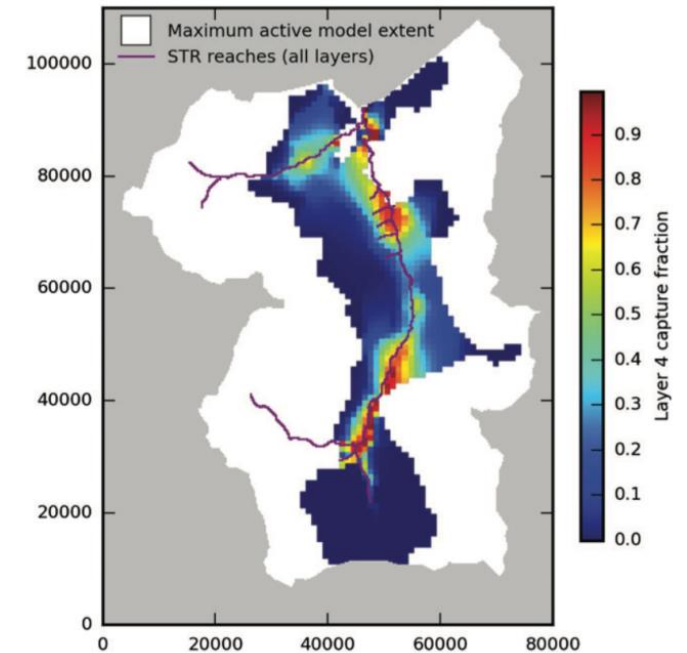
# FloPy<sub>3</sub>

a Python package to create, run, and post-process MODFLOW-based models

```
1 def cf_model(model, layer, row, col, base, Q):
2     model.remove_package('WEL')
3     lrcQ = {1: [[layer, row, col, Q]]}
4     wel = fpm.ModflowWel(model=model, stress_period_data=lrcQ)
5     wel.write_file()
6     model.run_model(silent=True)
7     hfile = fpu.HeadFile('DG.hds', precision='double')
8     cfile = fpu.CellBudgetFile('DG.cbc', precision='double')
9     step_period_list = hfile.get_kstpker()
10    h = hfile.get_ts((layer, row, col))
11    cap_frac = np.zeros((len(step_period_list)))
12    for tstep, step_period in enumerate(step_period_list):
13        if h[tstep, 1] == model.lpf.hdry:
14            capfrac[tstep] = np.nan
15        else:
16            v1 = cfile.get_data(kstpker=step_period,
17                               text='DRAINS', full3D=True)
18            v2 = cfile.get_data(kstpker=step_period,
19                               text='STREAM LEAKAGE', full3D=True)
20            v3 = cfile.get_data(kstpker=step_period, text='ET',
21                               full3D=True)
22            cap_frac[tstep] = ((v1[0].sum() + v2[0].sum() +
23                               v3[0].sum()) - base) / (-Q)
24    return cap_frac
```

**Python function to compute capture fraction of a well in a specific cell.**

flopy has advantages both in assisting in efficient MODFLOW model building and in scripting scenarios for rapid evaluation. The example here shows compact open-source Python code used to generate the image of call capture



**Figure 5.** FloPy generated map showing the computed capture fraction of water from head-dependent boundaries as a function of well location in the Upper San Pedro Basin model layer corresponding to the lower basin fill after 10 years of pumpage. The maximum areal extent of the active model domain and the location of stream boundary conditions in all model layers are also shown.



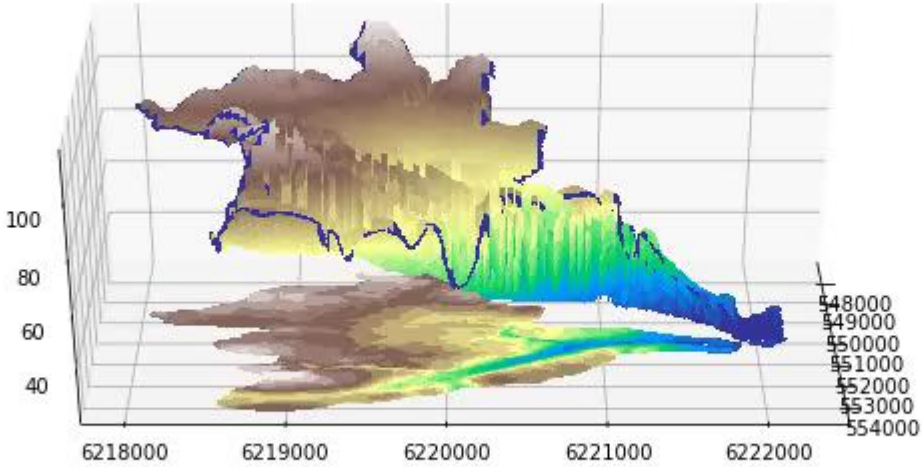
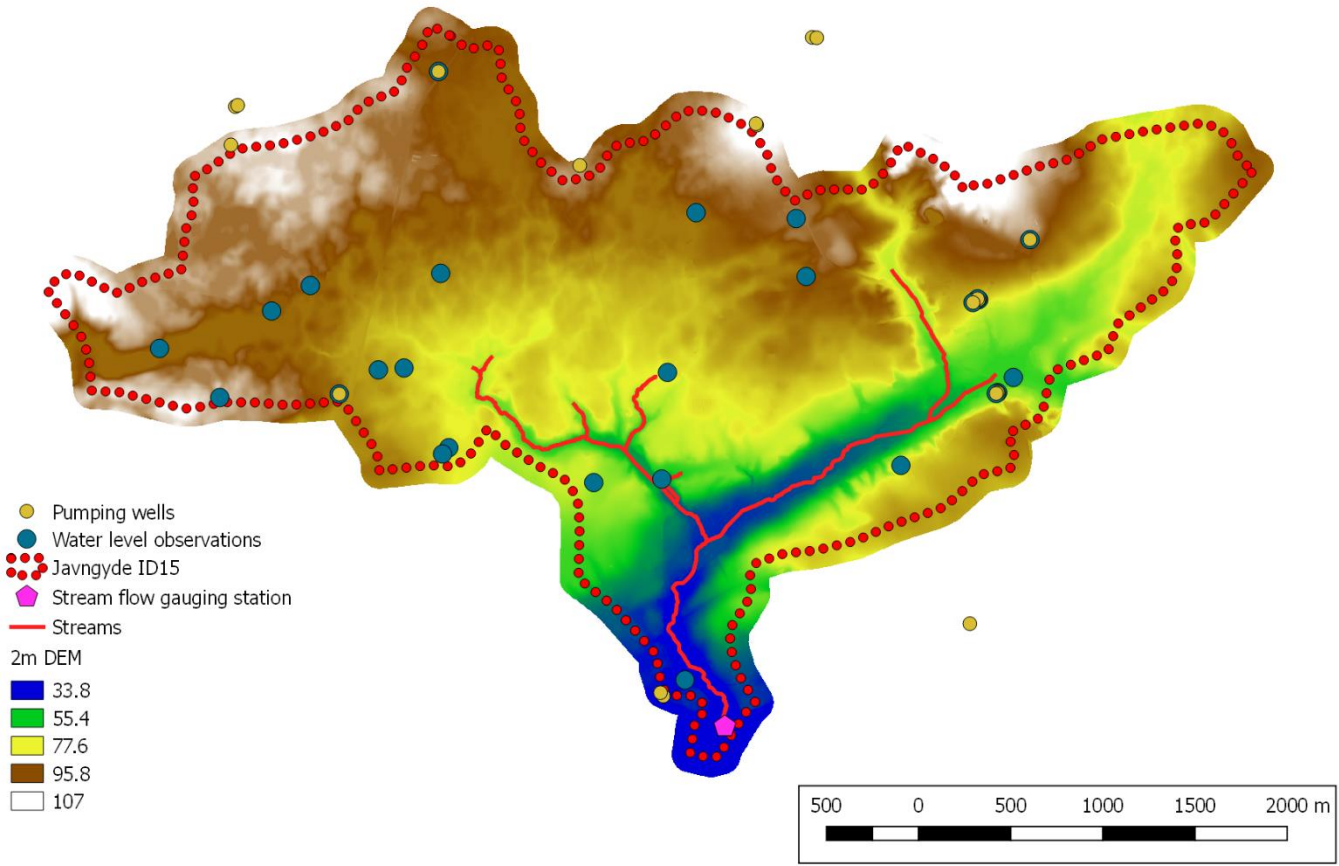
# HVORFOR SCRIPT MODELLERING?

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## Hvorfor?

- Mange arbejdsgange er generiske og gentages hver gang en ny grundvandsmodel sættes op – disse kan i høj grad automatiseres
- I Danmark har vi en relativt unik tilgang til gratis offentlige data i databaser – udtrækning af information til grundvandsmodeller kan i høj grad automatiseres
- Typen af modelanalyser, der kan udføres, kan udvides, da fleksibiliteten i modelopsætningen forøges
- Modeller kan nemmere opdateres med ny data indsamling, da dette kan gøres semiautomatisk
- Modelopbygningen og dataanalysen er dokumenteret og gennemsigtig

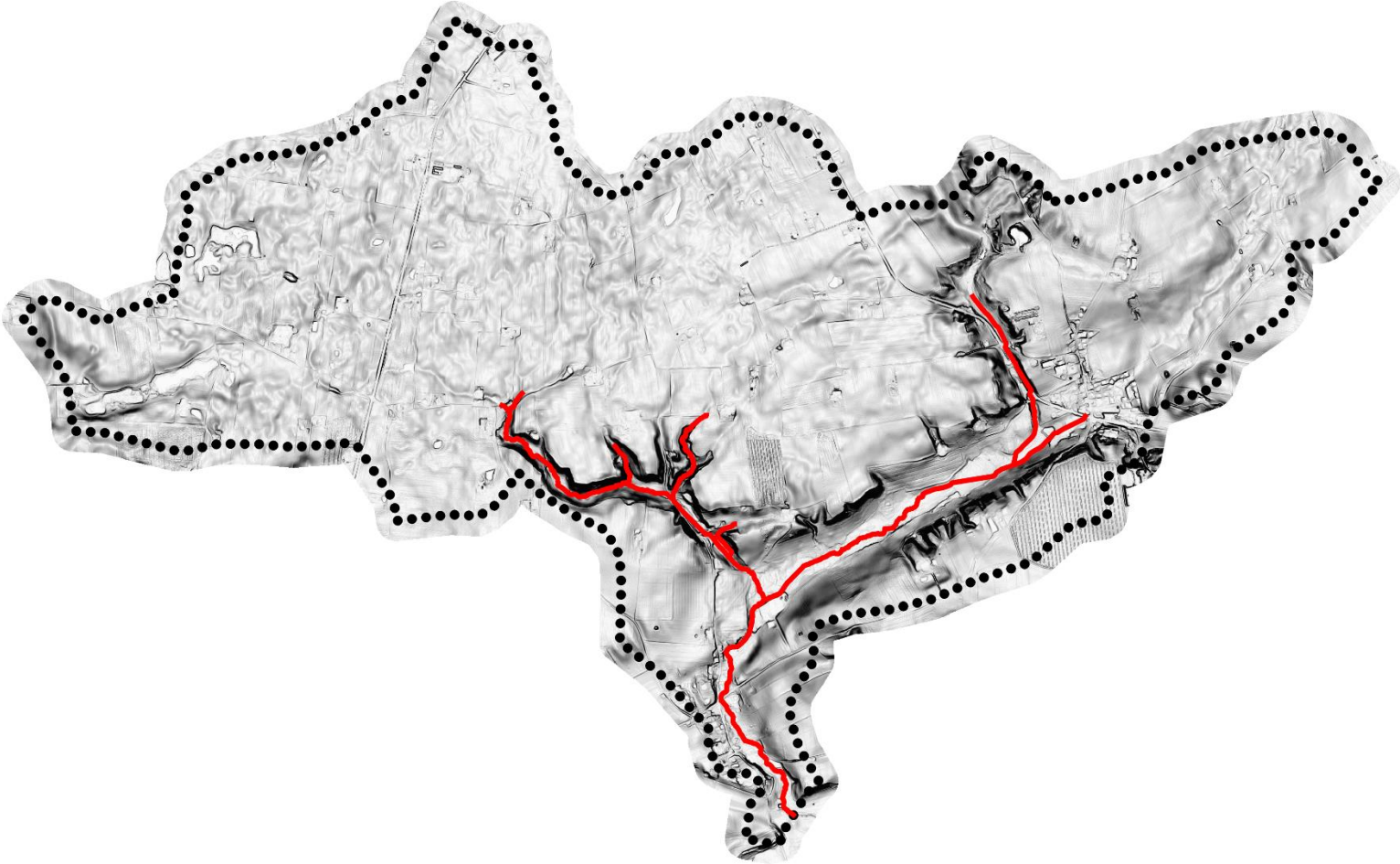
# GENERERING AF VANDLØBSINPUT FRA DHM



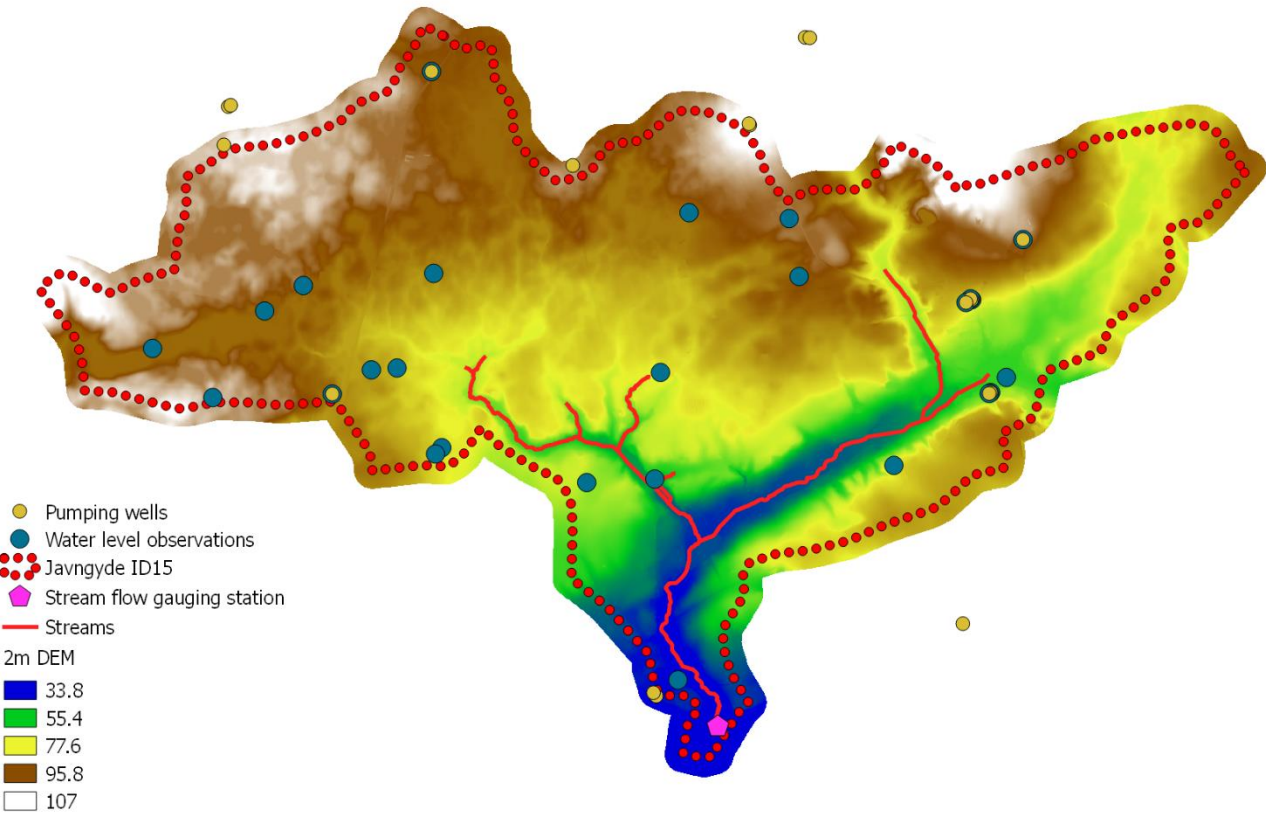
# GENERERING AF VANDLØBSINPUT FRA DHM



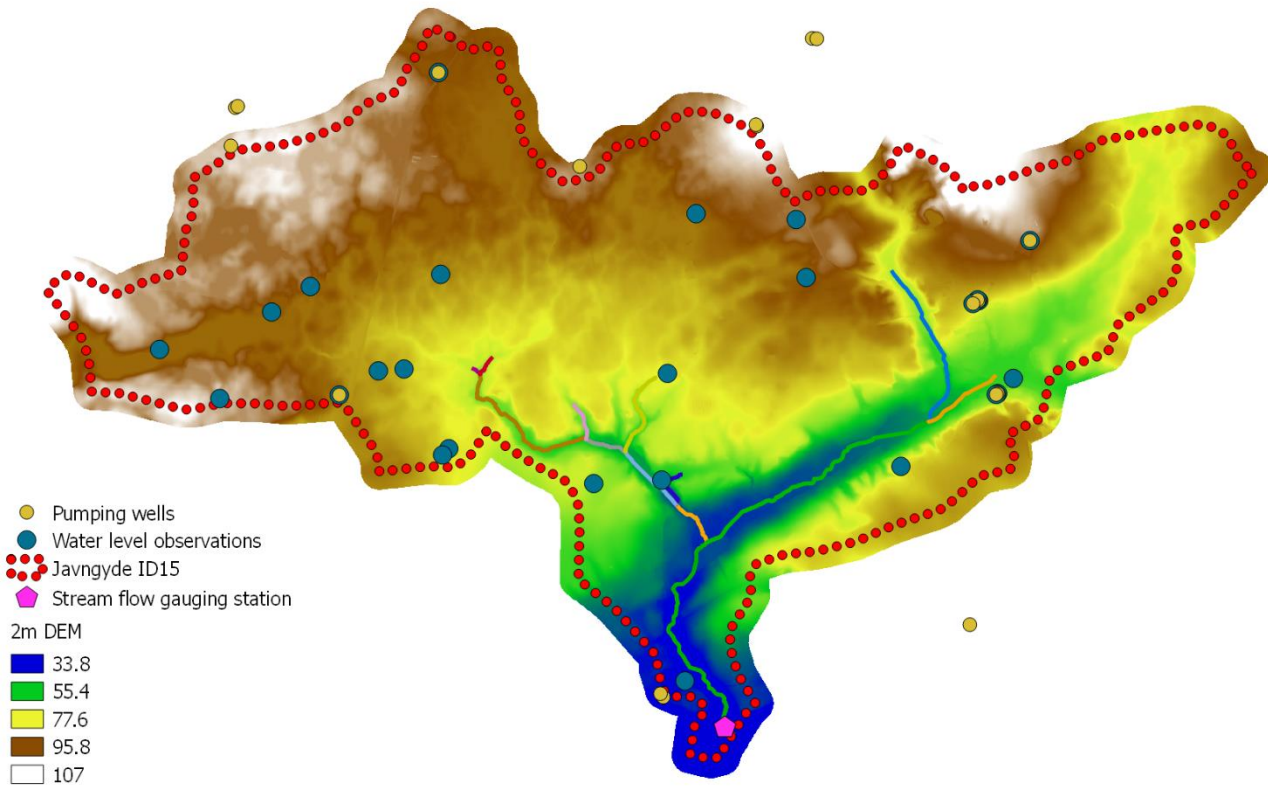
Terrain slope



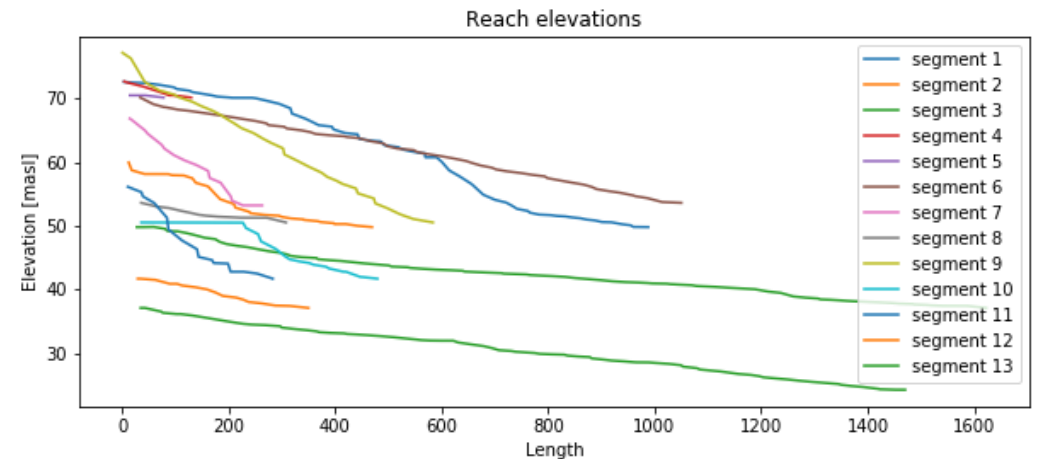
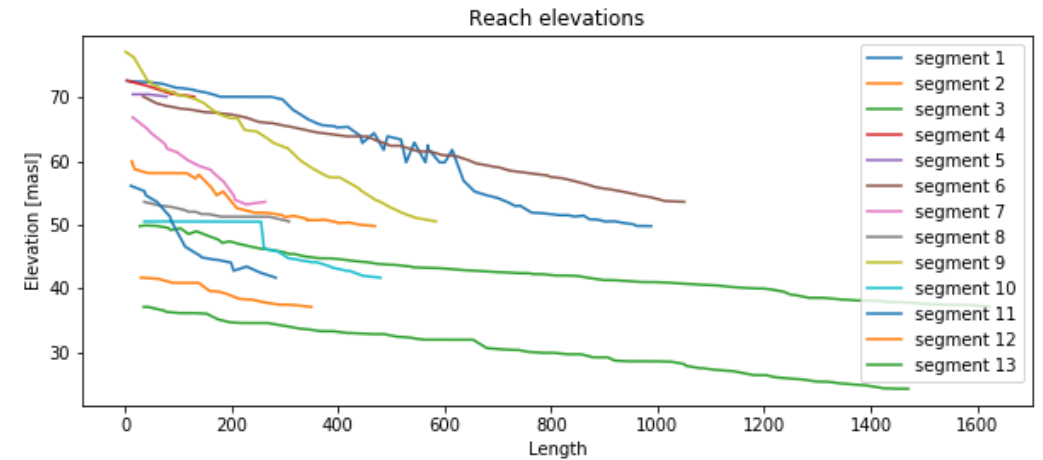
# GENERERING AF VANDLØBSINPUT FRA DHM



# GENERERING AF VANDLØBSINPUT FRA DHM



Manuel definerer af vandløbssektioner ud fra lokal kendskab



# DATA MINING FRA JUPITER

## Grundvandsindvinding fra Jupiter

### Define inputs for extracting information:

NB! format is hardwired to:

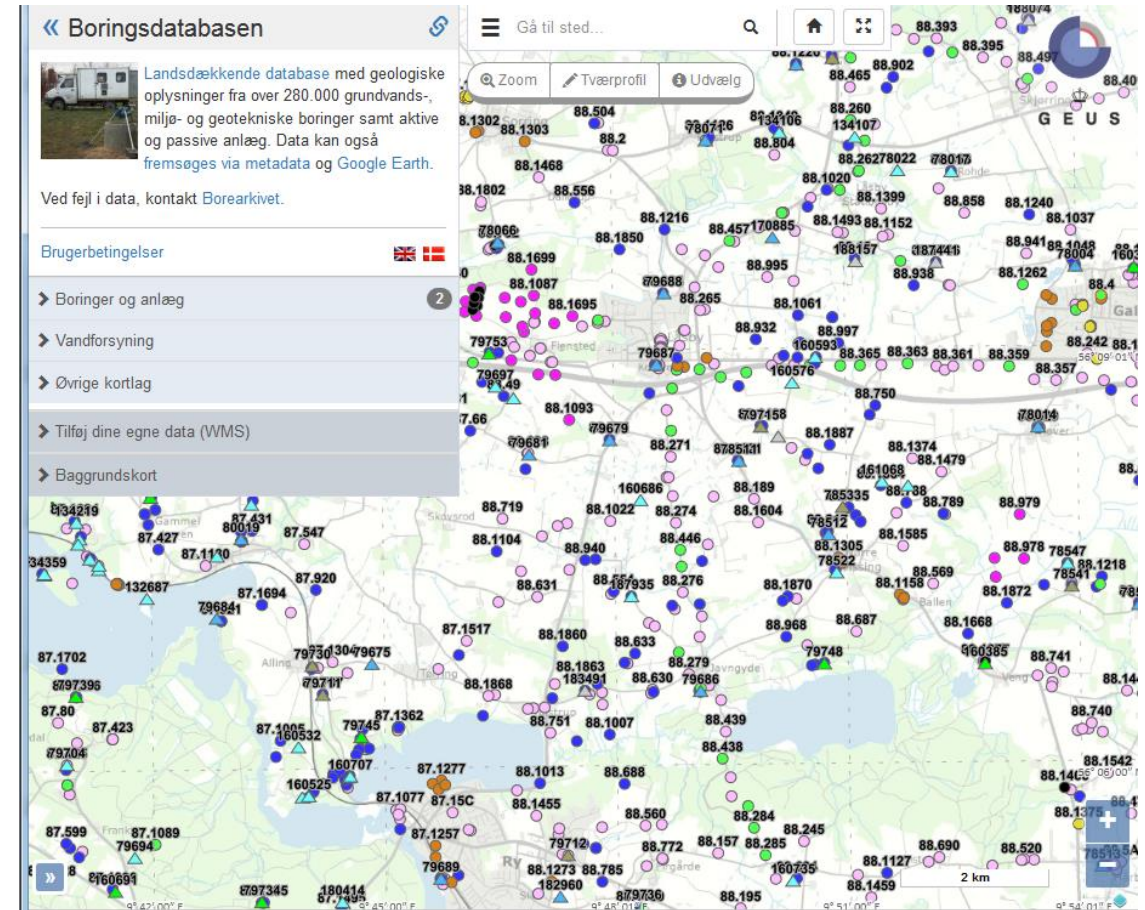
length: meters

time: days

In [2]:

```
# name of database. Must be Jupiter database en access 2000 format or newer:
data_base = 'z:\\Projects\\2017_rOPEN\\WP4\\jupiter\\db\\Jupiter_javngyde_xl_1.mdb'
# Base name for the outputs written to the disk:
area_name = 'Javngyde'
# Area outline: [xmin, xmax, ymin, ymax]
coordinates = [547490, 554205, 6218120, 6222100]
# folder where csv of pandas dataframes are stored:
datadir = os.path.join('data')
# folder where shape files are stored:
shpdir = os.path.join('shp')
# Length of each data period: 'AS' -> Anually start of year
period_length = 'AS'
# start of groundwater model simulation period:
start = '1993-01-01'
# end of groundwater model simulation period
end = '2005-01-01'

# check if directories exist. If not create them:
if not os.path.exists(datadir):
    os.makedirs(datadir)
if not os.path.exists(shpdir):
    os.makedirs(shpdir)
```



# DATA MINING FRA JUPITER

## Define inputs for extracting information:

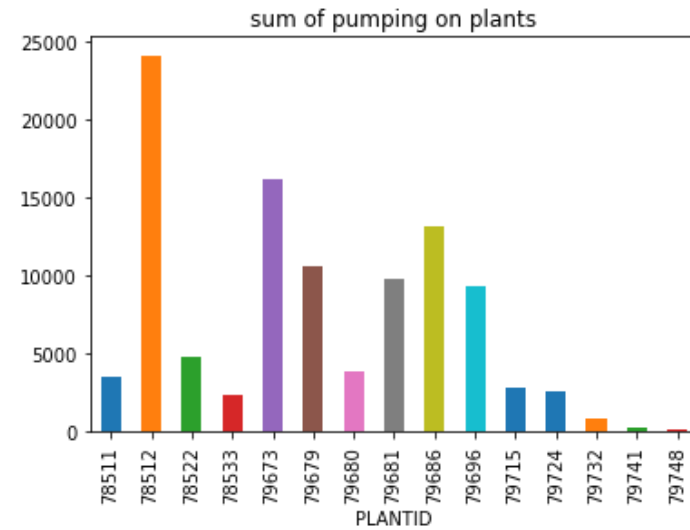
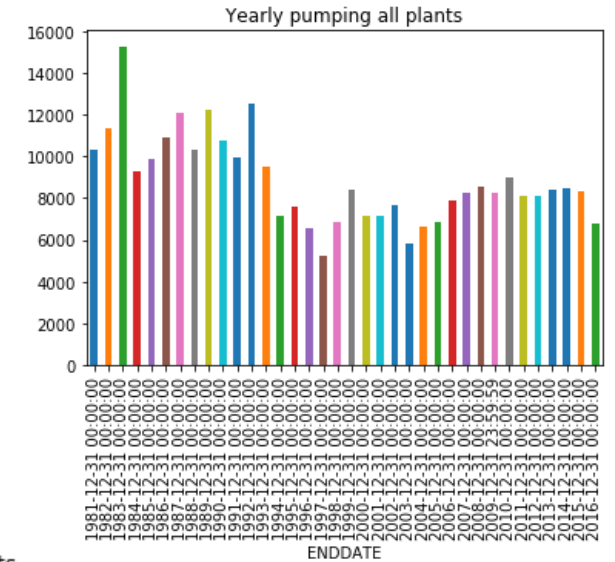
NB! format is hardwired to:

length: meters

time: days

```
In [2]: # name of database. Must be Jupiter database en access 2000 format or newer:
data_base = 'z:\\Projects\\2017_rOPEN\\WP4\\jupiter\\db\\Jupiter_javngyde_x1_1.mdb'
# Base name for the outputs written to the disk:
area_name = 'Javngyde'
# Area outline: [xmin, xmax, ymin, ymax]
coordinates = [547490,554205,6218120,6222100]
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# start of groundwater model simulation period:
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# end of groundwater model simulation period
end = '2005-01-01'

# check if directories exist. If not create them:
if not os.path.exists(datadir):
    os.makedirs(datadir)
if not os.path.exists(shpdir):
    os.makedirs(shpdir)
```



# DATA MINING FRA JUPITER

## Define inputs for extracting information:

**NB! format is hardwired to:**

length: meters

time: days

```
In [2]: # name of database. Must be Jupiter database en access 2000 format or newer:
data_base = 'z:\\Projects\\2017_rOPEN\\WP4\\jupiter\\db\\Jupiter_javngyde_x1_1.mdb'
# Base name for the outputs written to the disk:
area_name = 'Javngyde'
# Area outline: [xmin, xmax, ymin, ymax]
coordinates = [547490,554205,6218120,6222100]
# folder where csv of pandas dataframes are stored:
datadir = os.path.join('data')
# folder where shape files are stored:
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# Length of each data period: 'AS' -> Anually start of year
period_length = 'AS'
# start of groundwater model simulation period:
start = '1993-01-01'
# end of groundwater model simulation period
end = '2005-01-01'

# check if directories exist. If not create them:
if not os.path.exists(datadir):
    os.makedirs(datadir)
if not os.path.exists(shpdir):
    os.makedirs(shpdir)
```

Pumperate  
tilskrevet  
boringer

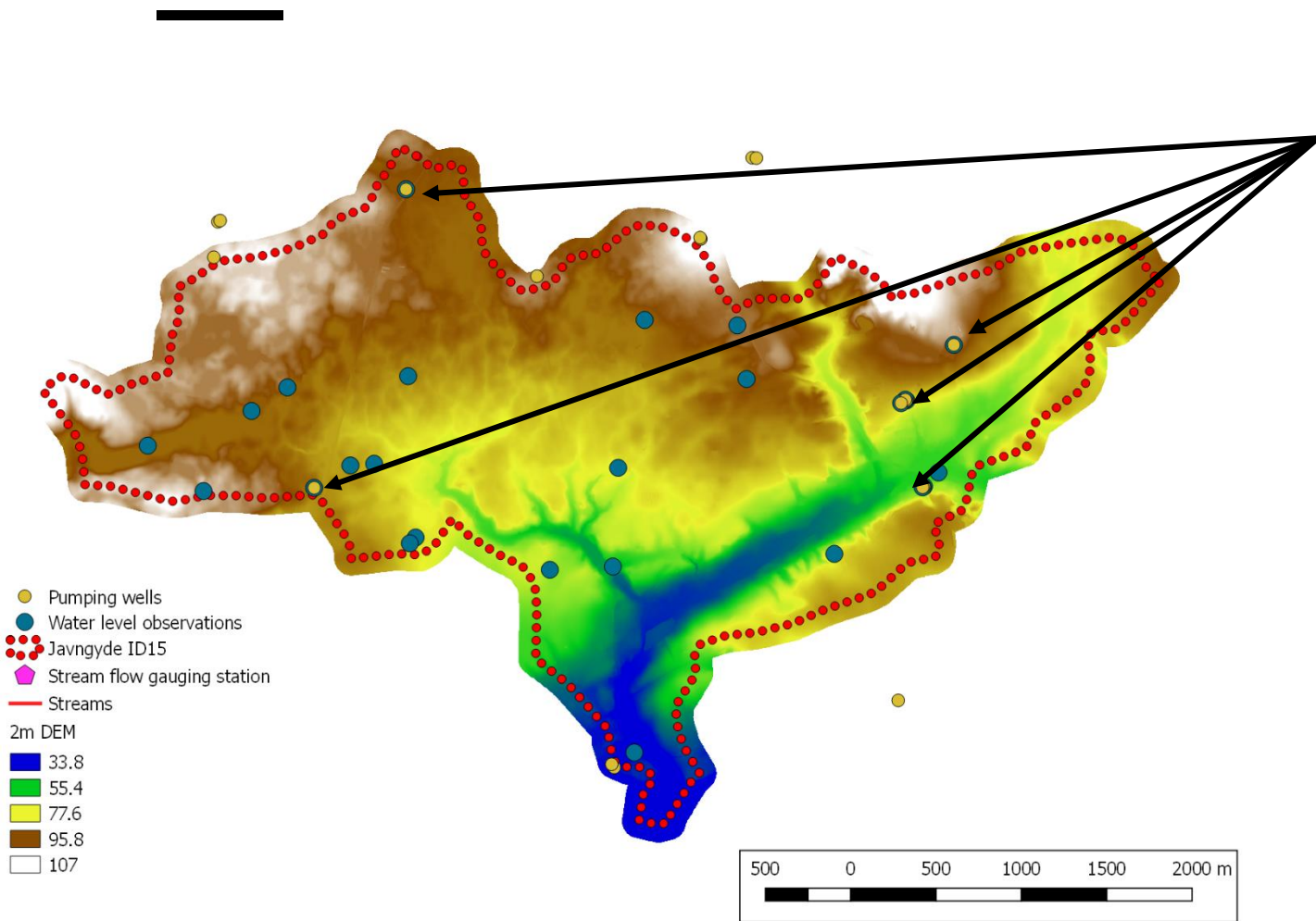
```
Pumping on plant 78511
      AMOUNT  BoreholeRate
1993-01-01  5054.0      6.923288
1994-01-01  3051.0      4.179452
1995-01-01  8639.0     11.834247
1996-01-01  3280.0      4.493151
1997-01-01  1946.0      2.665753
1998-01-01  2621.0      3.590411
1999-01-01     0.0      0.000000
2000-01-01  4091.0      5.604110
2001-01-01  2148.0      2.942466
2002-01-01  2148.0      2.942466
2003-01-01  2102.0      2.879452
2004-01-01  2246.0      3.076712
2005-01-01  2501.0      3.426027
*****
```

```
Pumping on plant 78512
      AMOUNT  BoreholeRate
1993-01-01  25710.0    23.479452
1994-01-01  25940.0    23.689498
1995-01-01  18395.0    16.799087
1996-01-01  18035.0    16.470320
1997-01-01  19090.0    17.433790
1998-01-01  19700.0    17.990868
1999-01-01  21420.0    19.561644
2000-01-01  25225.0    23.036530
2001-01-01  25292.0    23.097717
2002-01-01  26173.0    23.902283
2003-01-01  26305.0    24.022831
2004-01-01  25805.0    23.566210
2005-01-01  24357.0    22.243836
*****
```

```
Pumping on plant 78522
      AMOUNT  BoreholeRate
1993-01-01   800.0     1.095890
```



# DATA MINING FRA JUPITER



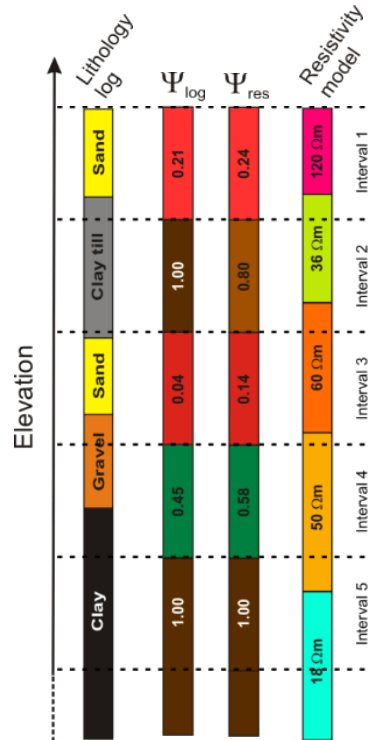
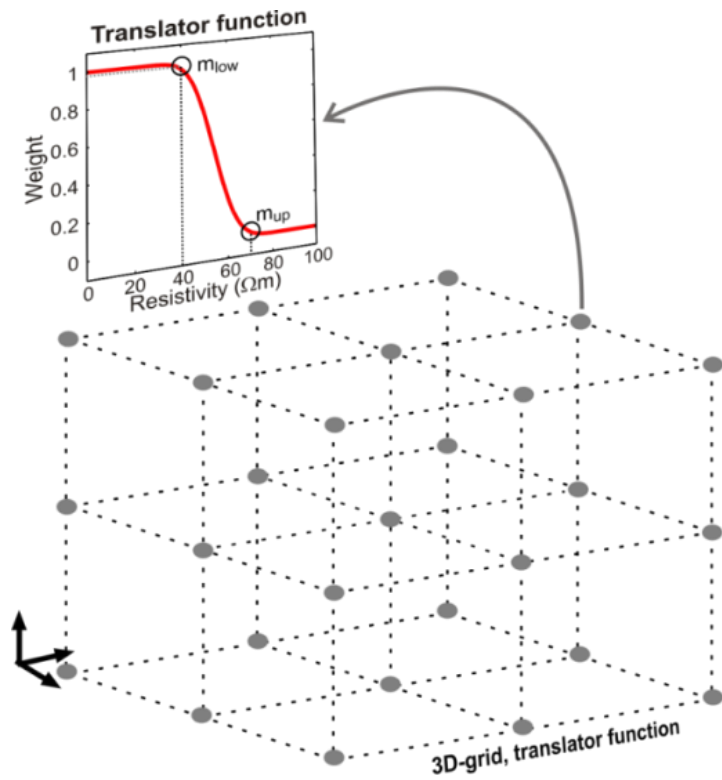
Boringer  
inden for  
opland

| Pumping on plant 78511 |        |              |
|------------------------|--------|--------------|
|                        | AMOUNT | BoreholeRate |
| 1993-01-01             | 5054.0 | 6.923288     |
| 1994-01-01             | 3051.0 | 4.179452     |
| 1995-01-01             | 8639.0 | 11.834247    |
| 1996-01-01             | 3280.0 | 4.493151     |
| 1997-01-01             | 1946.0 | 2.665753     |
| 1998-01-01             | 2621.0 | 3.590411     |
| 1999-01-01             | 0.0    | 0.000000     |
| 2000-01-01             | 4091.0 | 5.604110     |
| 2001-01-01             | 2148.0 | 2.942466     |
| 2002-01-01             | 2148.0 | 2.942466     |
| 2003-01-01             | 2102.0 | 2.879452     |
| 2004-01-01             | 2246.0 | 3.076712     |
| 2005-01-01             | 2501.0 | 3.426027     |
| *****                  |        |              |

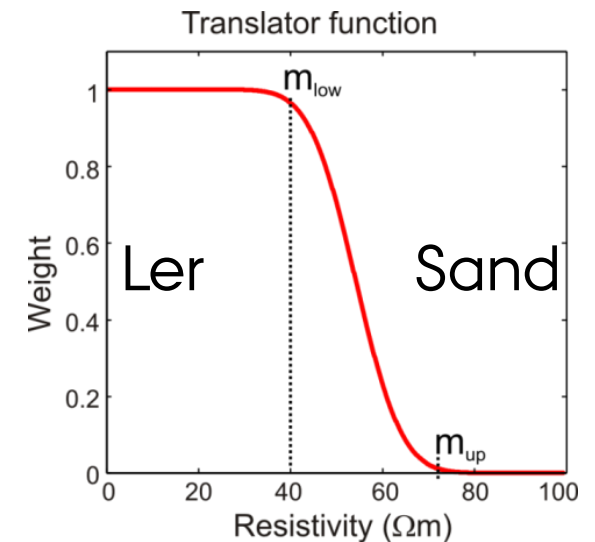
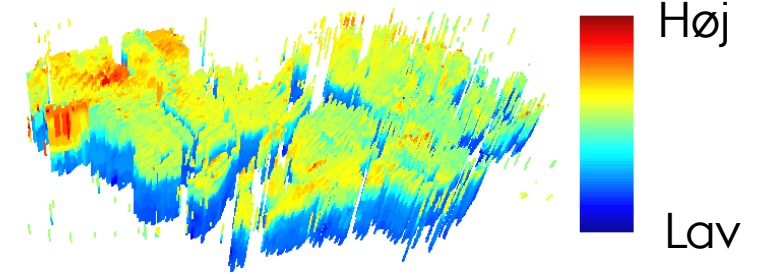
| Pumping on plant 78512 |         |              |
|------------------------|---------|--------------|
|                        | AMOUNT  | BoreholeRate |
| 1993-01-01             | 25710.0 | 23.479452    |
| 1994-01-01             | 25940.0 | 23.689498    |
| 1995-01-01             | 18395.0 | 16.799087    |
| 1996-01-01             | 18035.0 | 16.470320    |
| 1997-01-01             | 19090.0 | 17.433790    |
| 1998-01-01             | 19700.0 | 17.990868    |
| 1999-01-01             | 21420.0 | 19.561644    |
| 2000-01-01             | 25225.0 | 23.036530    |
| 2001-01-01             | 25292.0 | 23.097717    |
| 2002-01-01             | 26173.0 | 23.902283    |
| 2003-01-01             | 26305.0 | 24.022831    |
| 2004-01-01             | 25805.0 | 23.566210    |
| 2005-01-01             | 24357.0 | 22.243836    |
| *****                  |         |              |

| Pumping on plant 78522 |        |              |
|------------------------|--------|--------------|
|                        | AMOUNT | BoreholeRate |
| 1993-01-01             | 800.0  | 1.095890     |

# GENERERING AF MODEL STRUKTUR



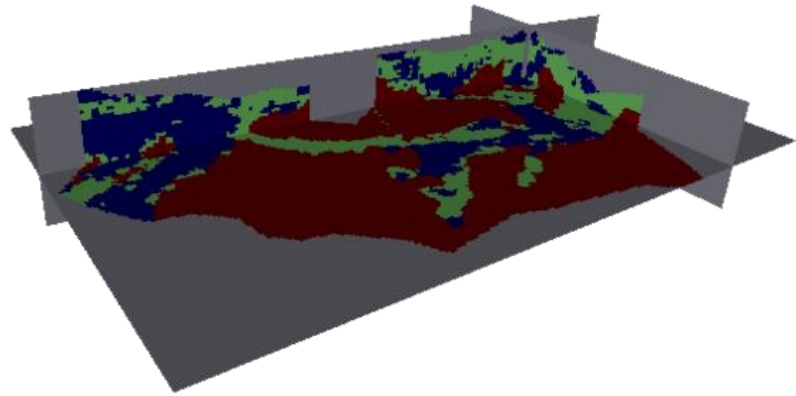
Resistivitet modeller



Foged et al., Hydrol. Earth Syst. Sci.,  
18, 4349–4362, 2014

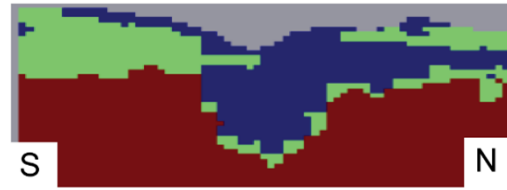
# GENERERING AF MODEL STRUKTUR

IK mode model

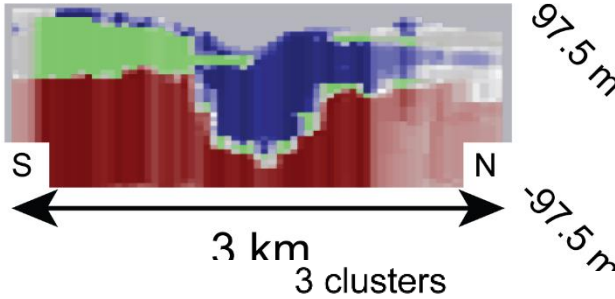


Cross section Ristrup

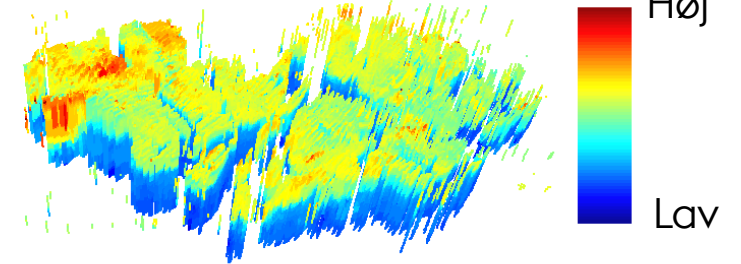
3 cluster mode model **A**



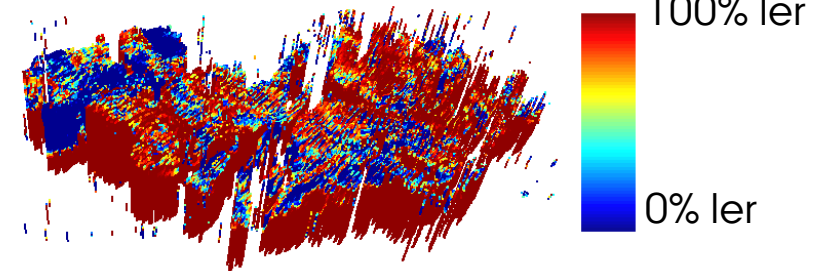
3 cluster model with unc. **B**



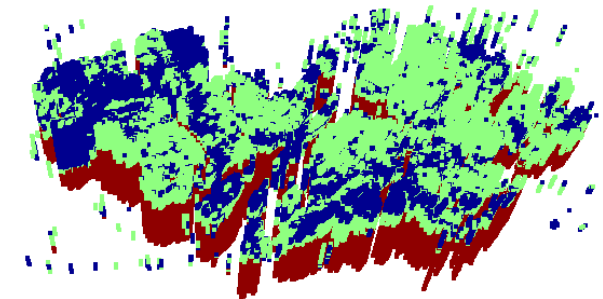
Resistivitet modeller



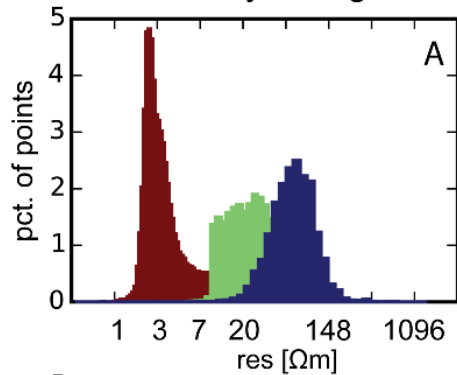
Lerfraktion



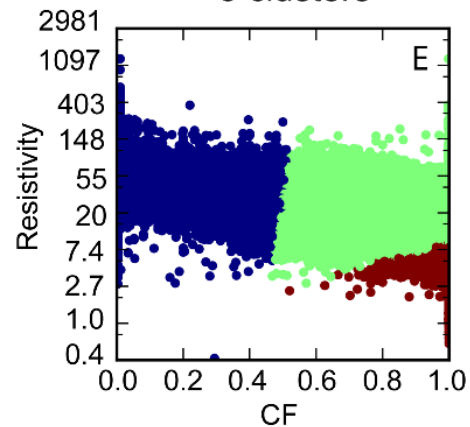
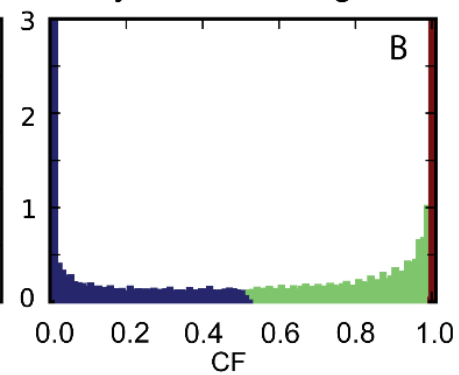
K-means clustering



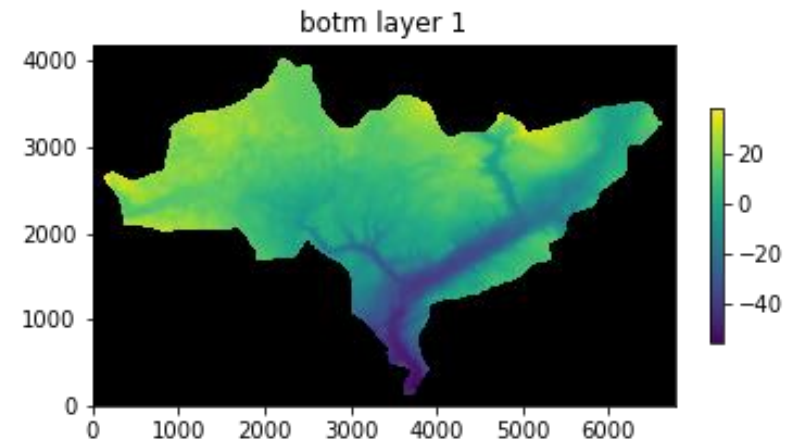
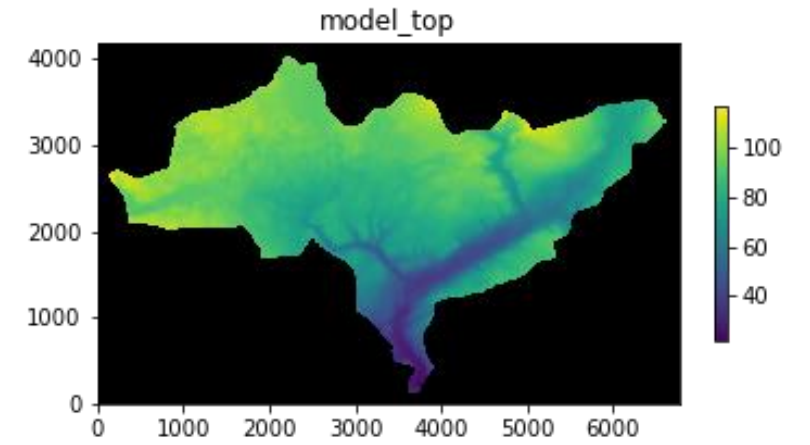
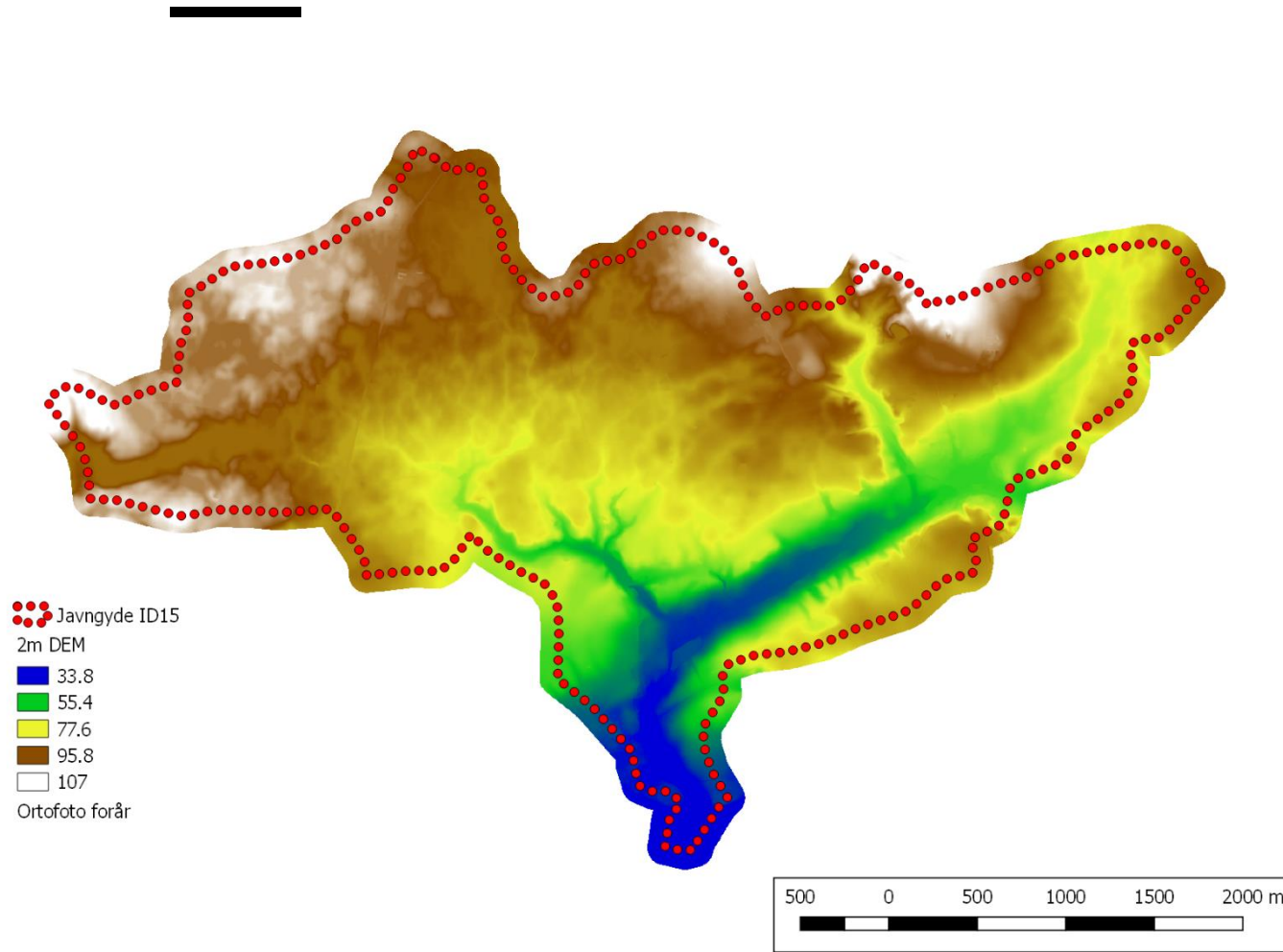
Resistivity histogram



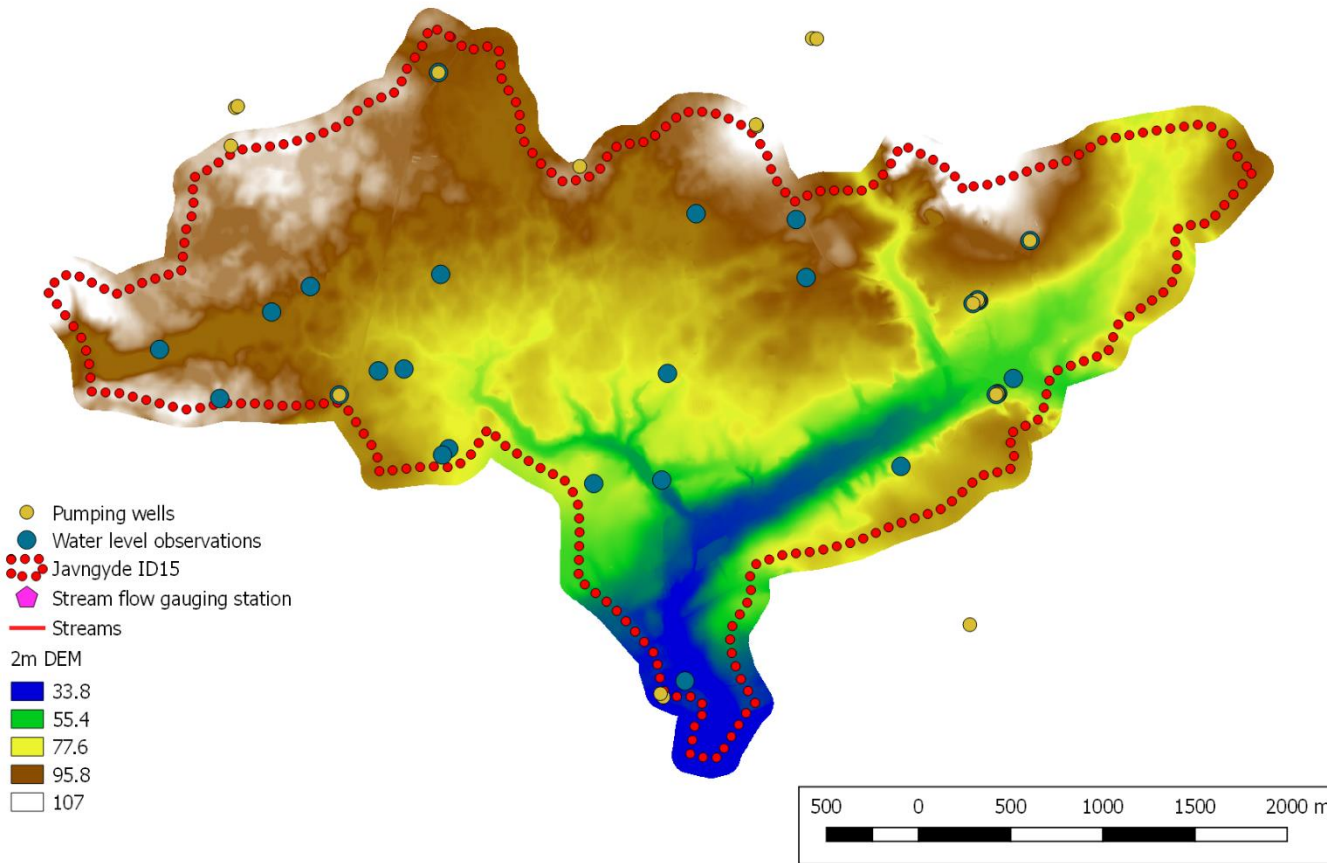
Clayfraction histogram



# PROJECTION OF DATA ONTO MODEL



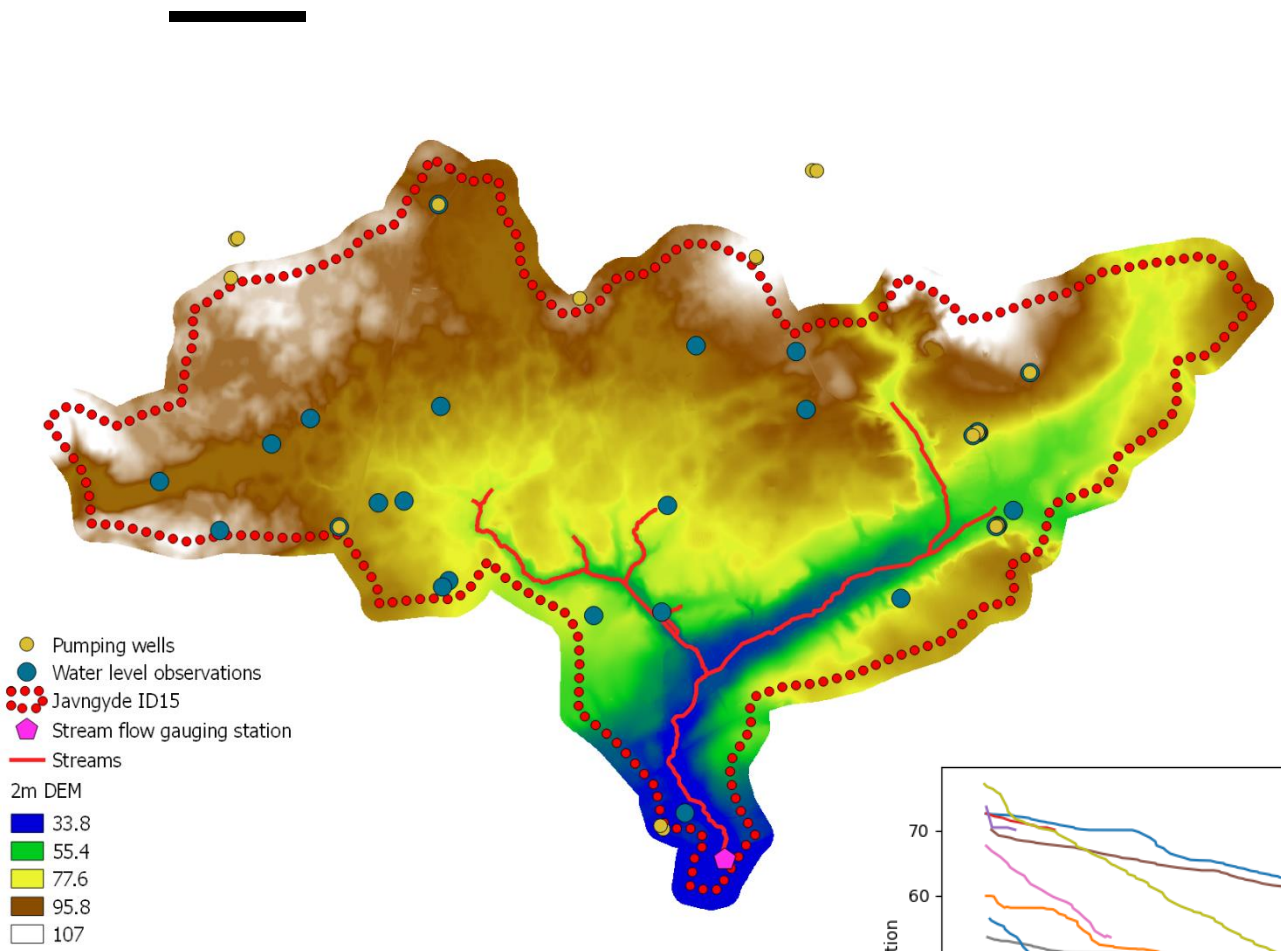
# PROJECTION OF DATA ONTO MODEL



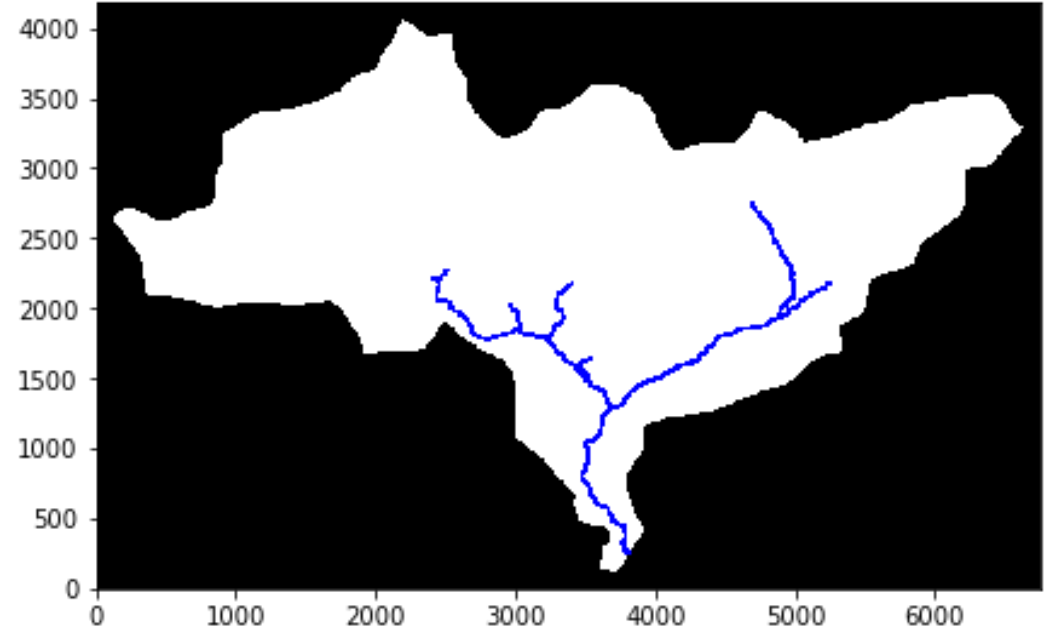
## Indvindingsboringer



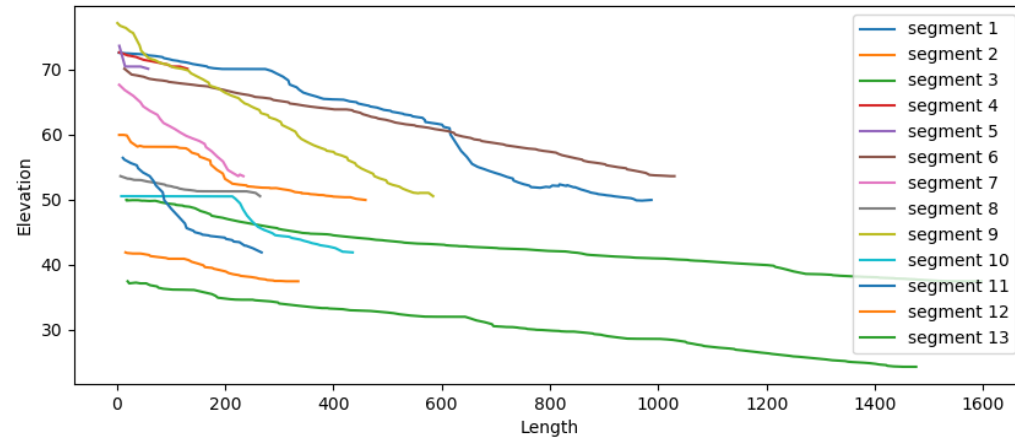
# PROJECTION OF DATA ONTO MODEL



## Vandløb

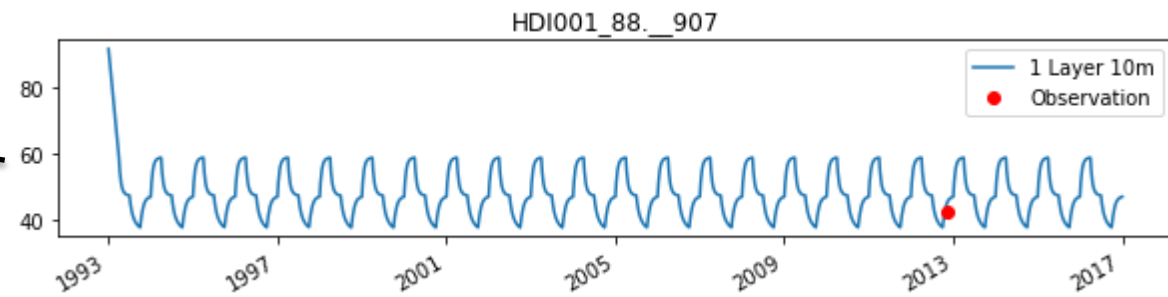
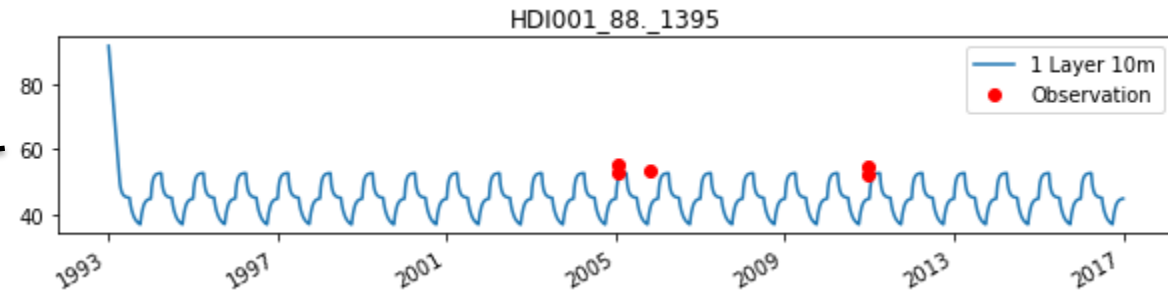
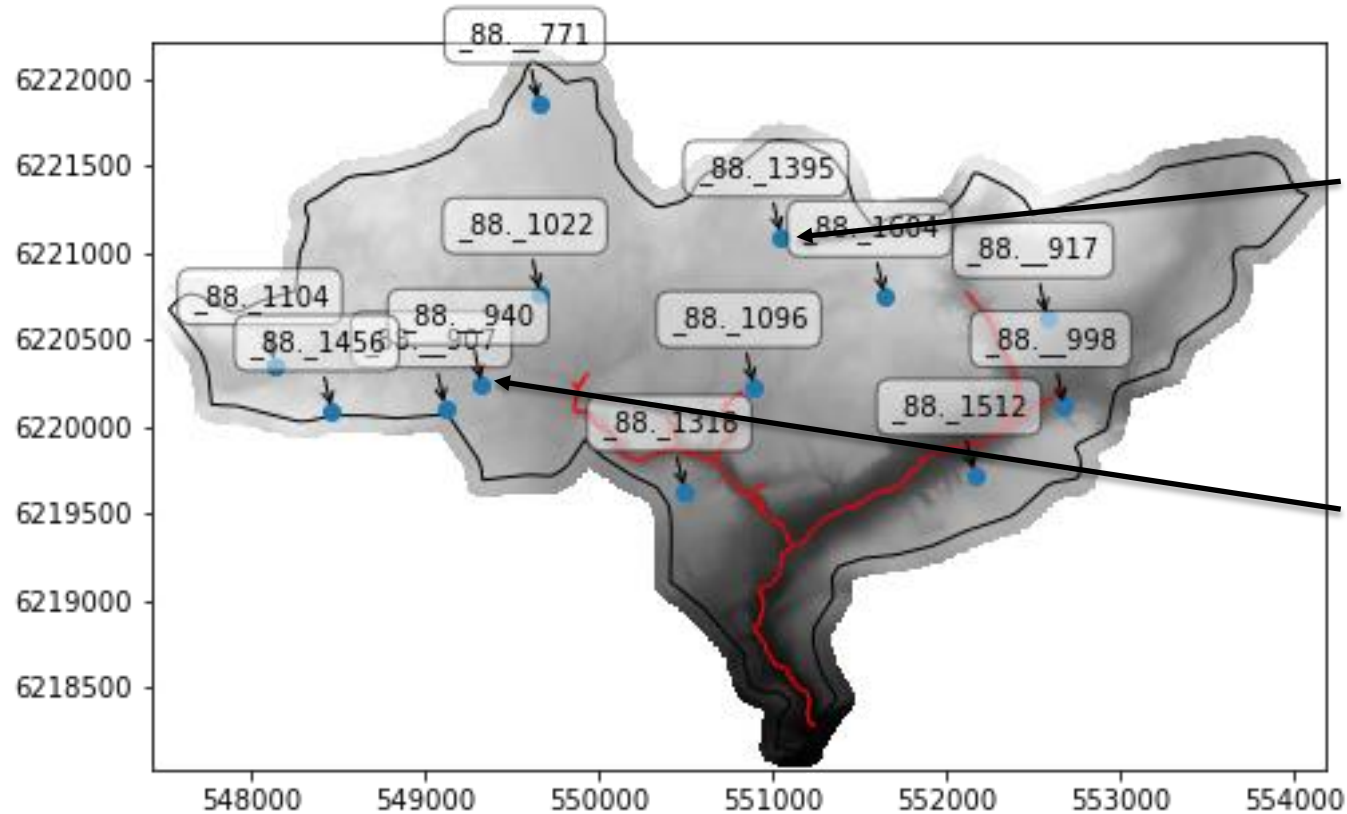


## Reach elevations



# OUTPUT EXAMPLES

Javngyde field site with streams and boreholes



Eksemplet er genereret med en triviel nedbørstidsserie, og uden struktur i undergrunden

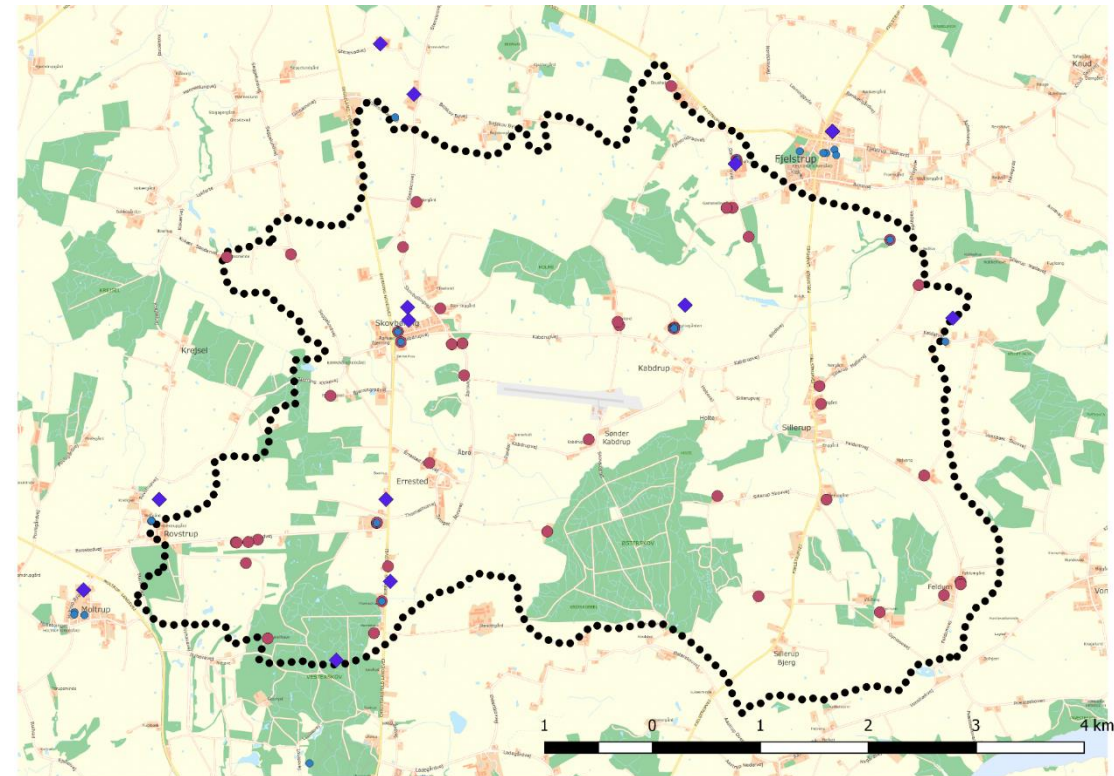
# HVORDAN SER DET UD I PRAKSIS?



```
jupyter javn_w_pump_tr2_1L_10m Last Checkpoint: Yesterday at 8:40 AM (autosaved) Logout
File Edit View Insert Cell Kernel Widgets Help Trusted Python 3
Code
2000
1500
1000
500
0
0 1000 2000 3000 4000 5000 6000
4000
3500
3000
2500
2000
1500
1000
500
0
0 1000 2000 3000 4000 5000 6000
In [81]: mf.run_model()
FloPy is using the following executable to run the model: C:\Program Files\GWV6\mf2005.exe
MODFLOW-2005
U.S. GEOLOGICAL SURVEY MODULAR FINITE-DIFFERENCE GROUND-WATER FLOW MODEL
Version 1.11.00 8/8/2013
Using NAME file: javn1.nam
Run start date and time (yyyy/mm/dd hh:mm:ss): 2017/11/23 8:43:52
Solving: Stress period: 1 Time step: 1 Ground-Water Flow Eqn.
Solving: Stress period: 2 Time step: 1 Ground-Water Flow Eqn.
Solving: Stress period: 2 Time step: 2 Ground-Water Flow Eqn.
Solving: Stress period: 2 Time step: 3 Ground-Water Flow Eqn.
Solving: Stress period: 2 Time step: 4 Ground-Water Flow Eqn.
Solving: Stress period: 2 Time step: 5 Ground-Water Flow Eqn.
Solving: Stress period: 2 Time step: 6 Ground-Water Flow Eqn.
Solving: Stress period: 2 Time step: 7 Ground-Water Flow Eqn.
Solving: Stress period: 2 Time step: 8 Ground-Water Flow Eqn.
Solving: Stress period: 2 Time step: 9 Ground-Water Flow Eqn.
Solving: Stress period: 2 Time step: 10 Ground-Water Flow Eqn.
In [82]: if OCflg:
hdsnam = os.path.join(ws, modelname+'.hds')
hdbj = flopy.utils.HeadFile(hdsnam)
head = hdbj.get_data()
levels = np.arange(25, 65, 1)
fig = plt.figure(figsize=(7, 7))
ax = fig.add_subplot(1, 1, 1, aspect='equal')
```

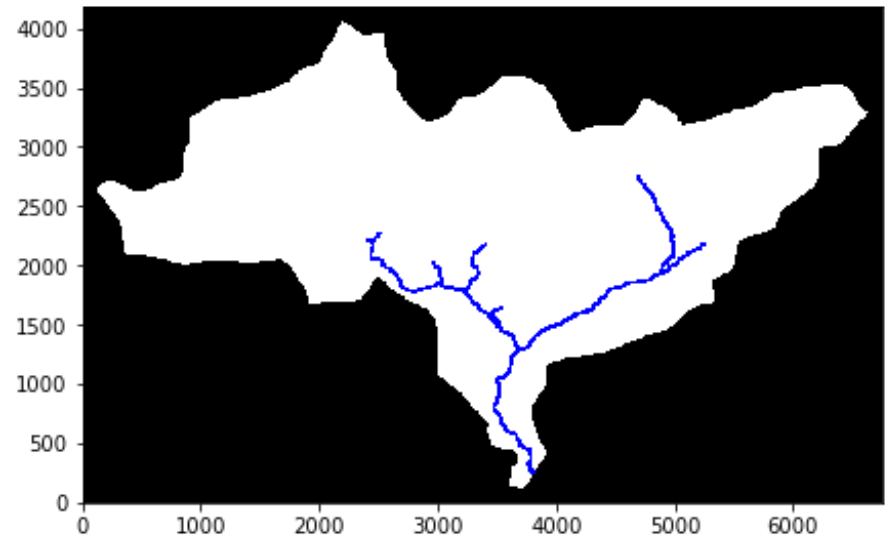
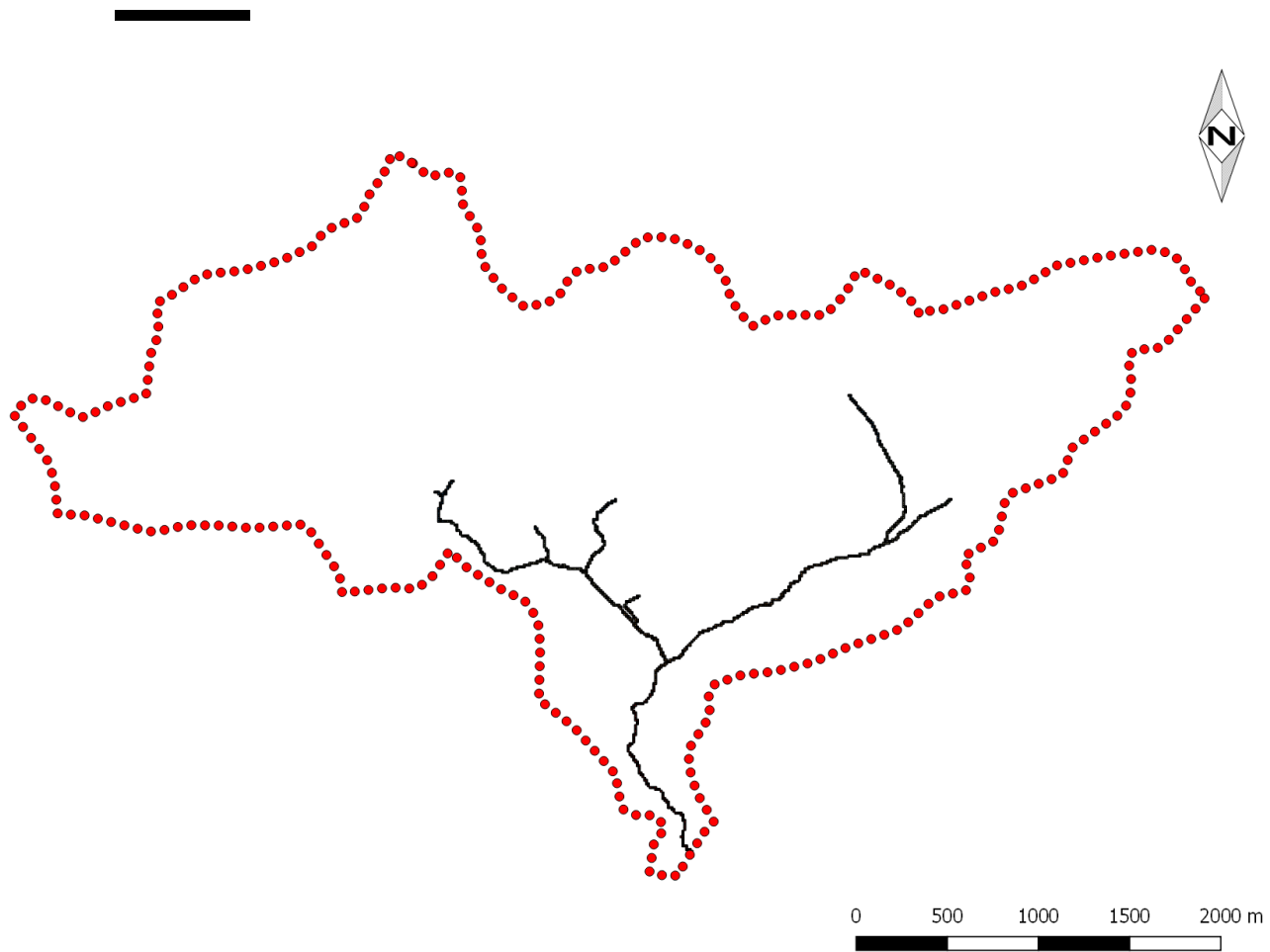
## Setting up and running groundwater model

Med relativt få ændringer kan modellen genereres for et alternativt opland

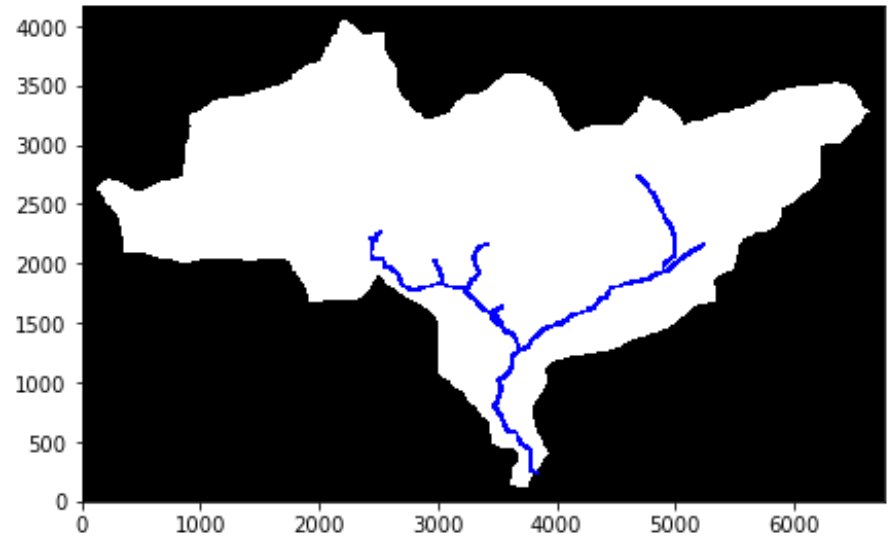
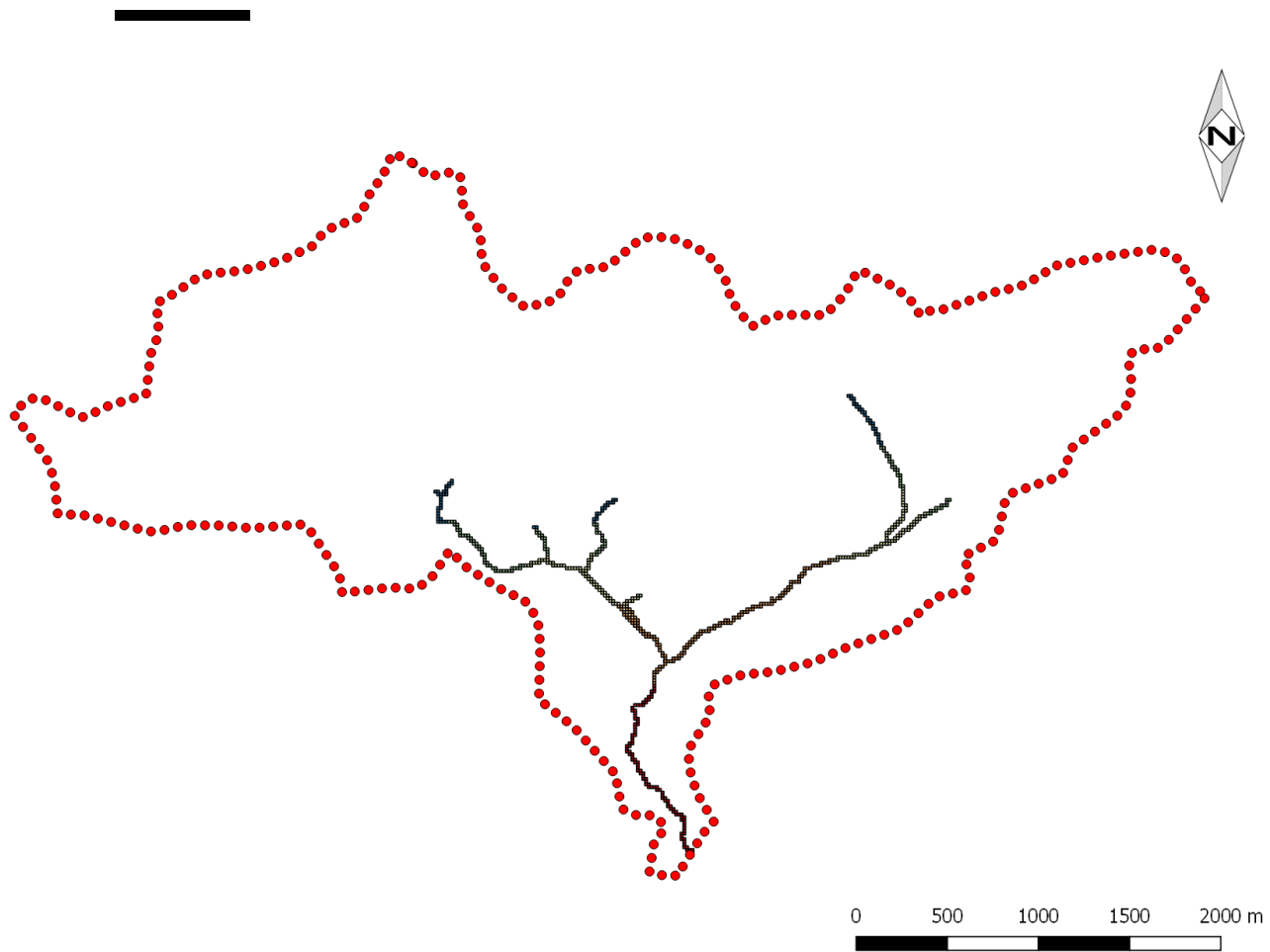




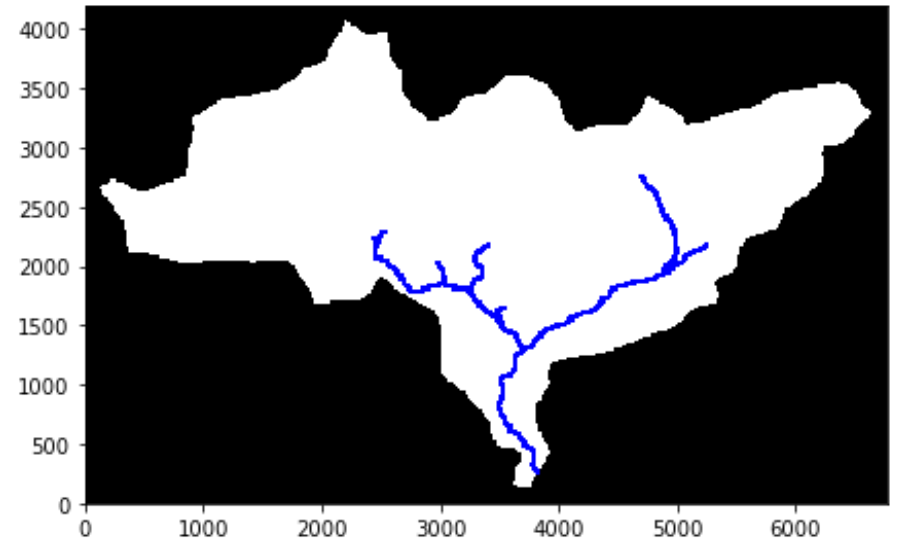
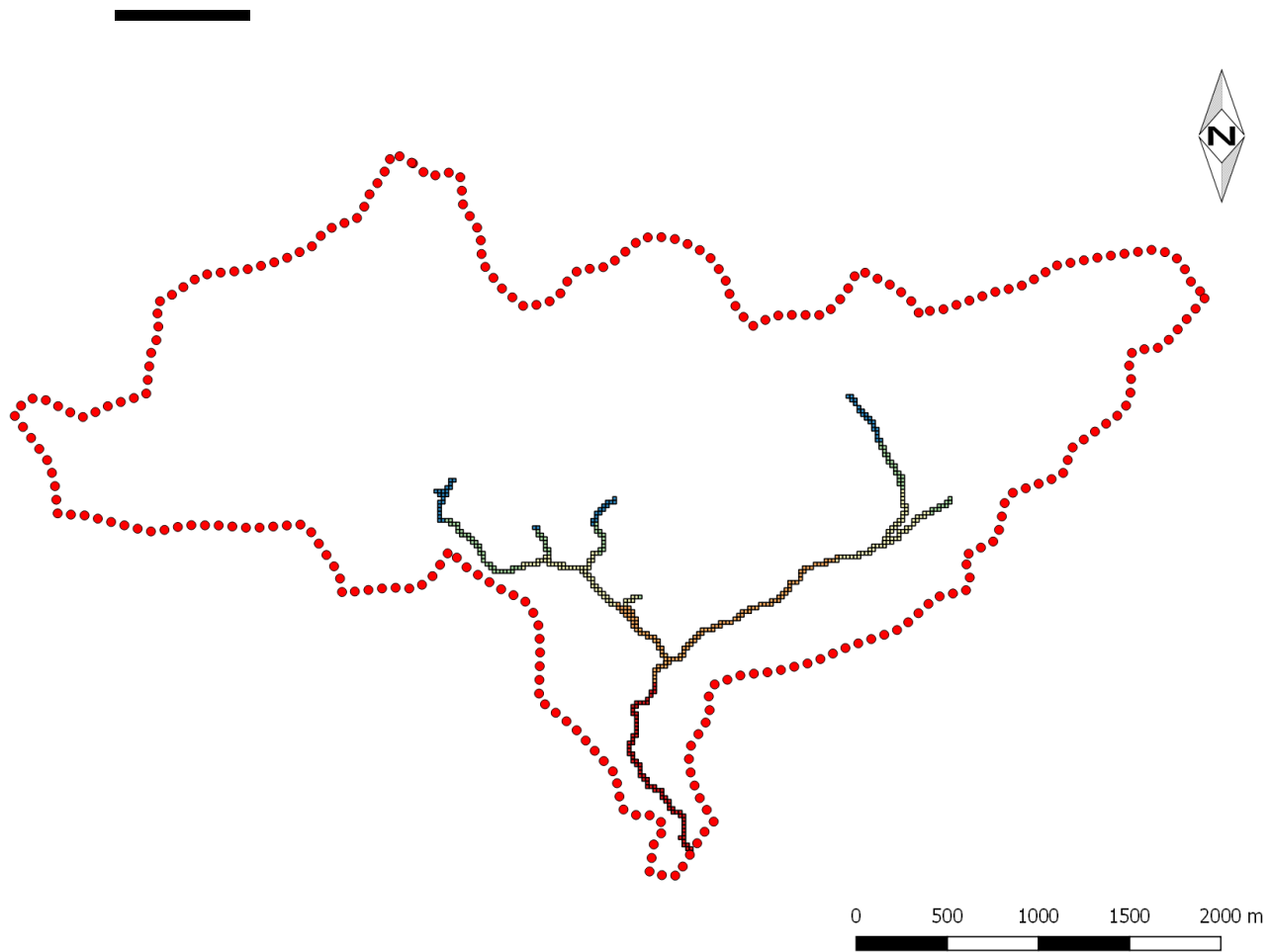
# ...ELLER MED EN ANDEN GRIDOPLØSNING



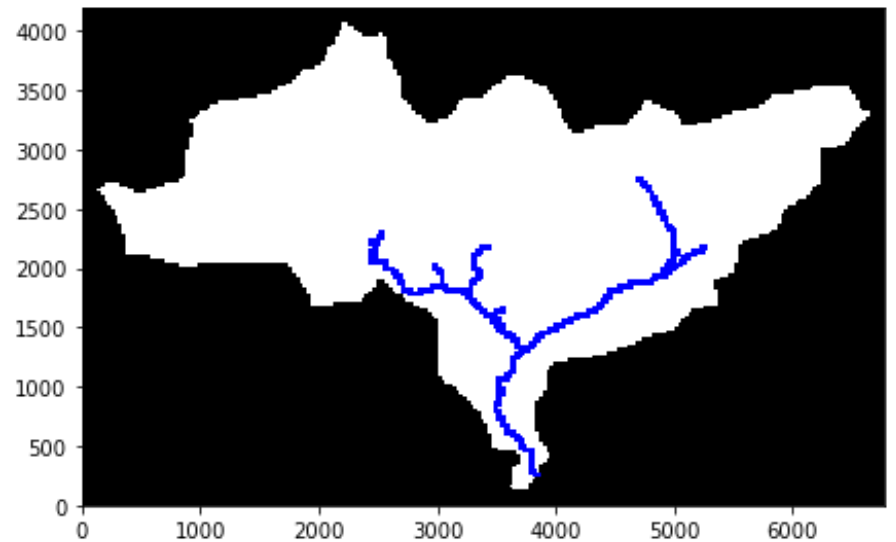
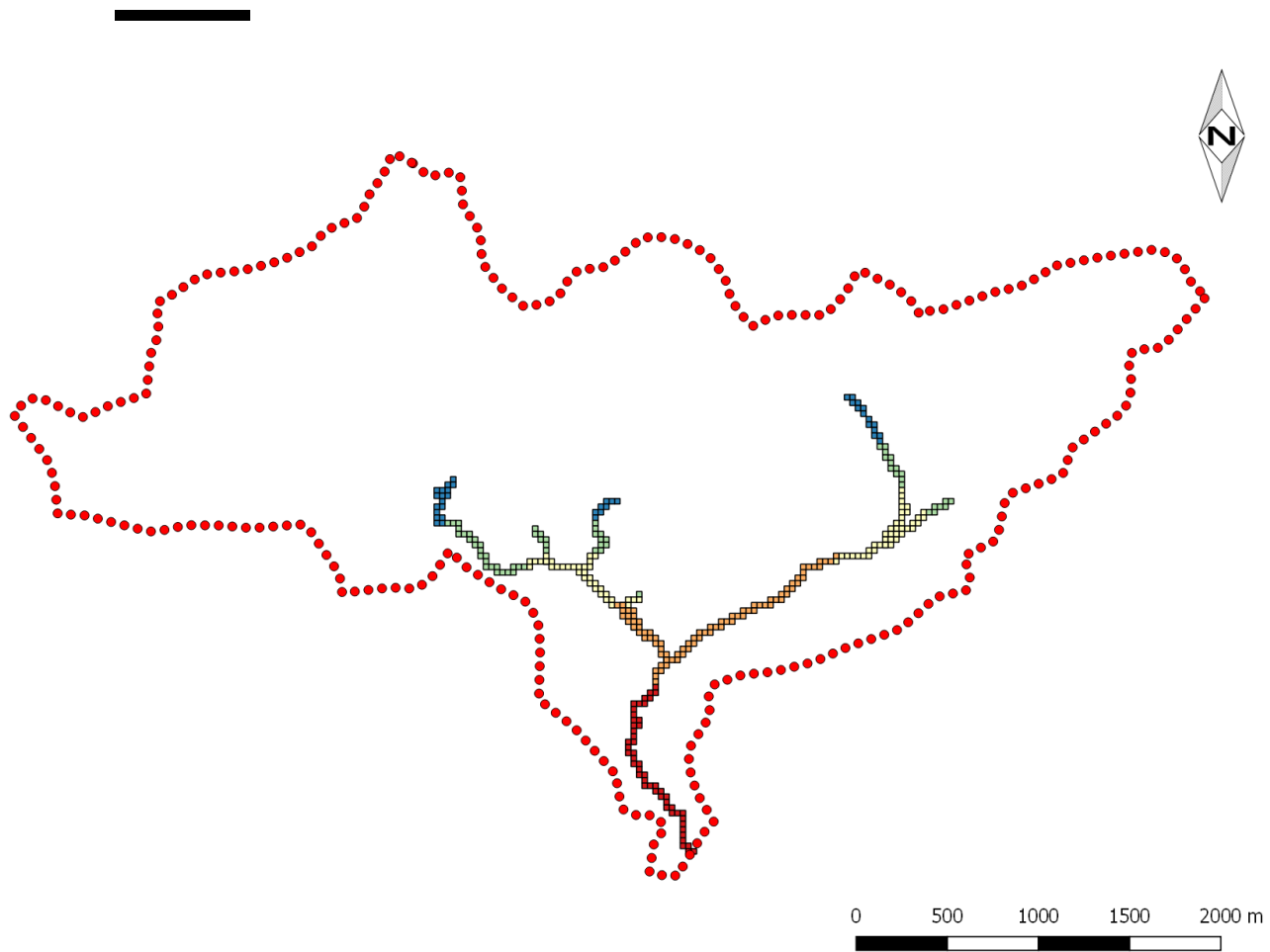
# ...ELLER MED EN ANDEN GRIDOPLØSNING



# ...ELLER MED EN ANDEN GRIDOPLØSNING



# ...ELLER MED EN ANDEN GRIDOPLØSNING



# KONKLUSIONER OG PERSPEKTIVER

- Hele workflowet er implementeret i python
- Det vil være Open source når rOpen er færdiggjort
- Model opbygningen er hurtig og data-dreven
- Det skal være fleksibelt med hensyn til analysetyper
- Det skal være simpelt at opdatere med ny data indsamling

