

# setup\_pest\_interface

July 17, 2019

## 1 Setup the PEST(++) interface around the enhanced Freyberg model

In this notebook, we will construct a complex model independent (non-intrusive) interface around an existing MODFLOW-NWT model using the python/flopy/pyemu stack.

```
In [1]: %matplotlib inline
import os
import shutil
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import flopy
import pyemu
import prep_deps
import redis
import matplotlib as mpl
plt.rcParams['font.size']=12
%matplotlib inline
```

flopy is installed in C:\Users\knowling\Dev\GW1876\activities\_csiro\notebooks\flopy

First we define a base directory b\_d from which we will read in a model already created freyberg.nam. This will form the basis of the remainder of the exercise (and those to follow)

```
In [2]: os.getcwd()
```

```
Out[2]: 'C:\\Users\\knowling\\Dev\\GW1876\\activities_csiro\\notebooks'
```

```
In [3]: b_d = os.path.join("../", "base_model_files")
        nam_file = "freyberg.nam"
```

### 1.0.1 load the existing Freyberg model. This version should run but is not yet connected with PEST++

```
In [4]: # note that to load a model in a different folder, you supply the namefile without path
        # to it in the model_ws variable
        m = flopy.modflow.Modflow.load(nam_file,model_ws=b_d,check=False,forgive=False)
```

## 1.0.2 some visuals

```
In [5]: # plot some model attributes
fig = plt.figure(figsize=(12,7))
ax = plt.subplot(111,aspect="equal")
mm = flopy.plot.ModelMap(model=m)
mm.plot_grid()
mm.plot_ibound()
mm.plot_bc('SFR')
ax = mm.ax
#m.wel.stress_period_data.plot(ax=ax,mflay=2)

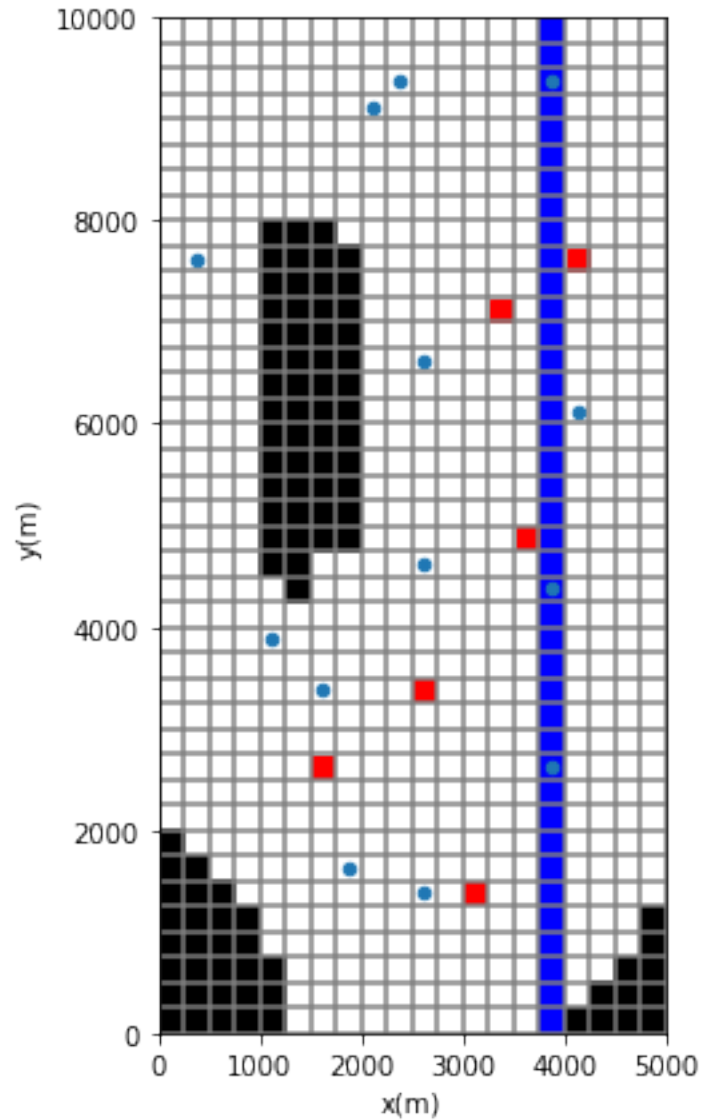
# plot obs locations
obs = pd.read_csv(os.path.join("../", "base_model_files", "obs_loc.csv"))

obs_x = [m.sr.xcentergrid[r-1,c-1] for r,c in obs.loc[:,["row","col"]].values]
obs_y = [m.sr.ycentergrid[r-1,c-1] for r,c in obs.loc[:,["row","col"]].values]
ax.scatter(obs_x,obs_y,marker='.',label="water-level obs",s=80)

#plot names on the pumping well locations
wel_data = m.wel.stress_period_data[0]
wel_x = m.sr.xcentergrid[wel_data["i"],wel_data["j"]]
wel_y = m.sr.ycentergrid[wel_data["i"],wel_data["j"]]
for i,(x,y) in enumerate(zip(wel_x,wel_y)):
    ax.scatter([x],[y],color="red",marker="s",s=50)
    #ax.text(x,y,"{0}".format(i+1),ha="center",va="center")

ax.set_ylabel("y(m)")
ax.set_xlabel("x(m)")
plt.show()
```

```
C:\Users\knowling\Dev\GW1876\activities_csiro\notebooks\flopy\plot\map.py:438: PendingDeprecat
warnings.warn(err_msg, PendingDeprecationWarning)
```



1.0.3 we can do a couple flopy things to move where the new model will be written

```
In [6]: # assign the executable name for the model
m.exe_name = "mfwt"

# now let's run this in a new folder called temp so we don't overwrite the original da
m.change_model_ws("temp",reset_external=True)

# this writes all the MODFLOW files in the new location
m.write_input()

# the following helps get the dependencies (both python and executables) in the right p
prep_deps.prep_template(t_d="temp")
```

```
changing model workspace...
temp
```

#### 1.0.4 now we can run the model once using a pyemu helper

This helper is particularly useful if you run on more than one platform (e.g. Mac and Windows)

```
In [7]: pyemu.os_utils.run("{0} {1}".format(m.exe_name,m.name+".nam"),cwd=m.model_ws)
```

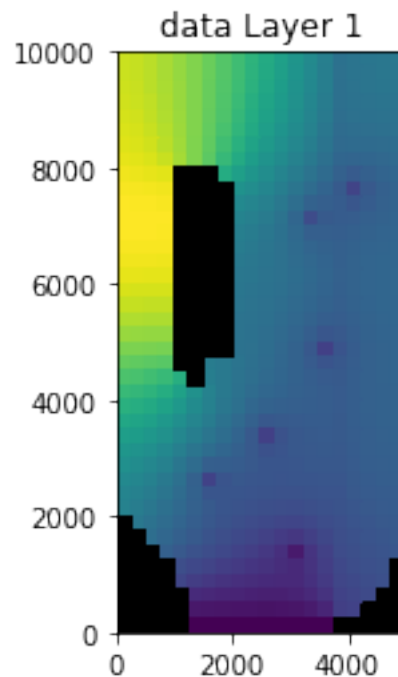
#### 1.0.5 read in the heads and plot them up along with the budget components

Note that there is a historic period and a scenario with future conditions that differ.

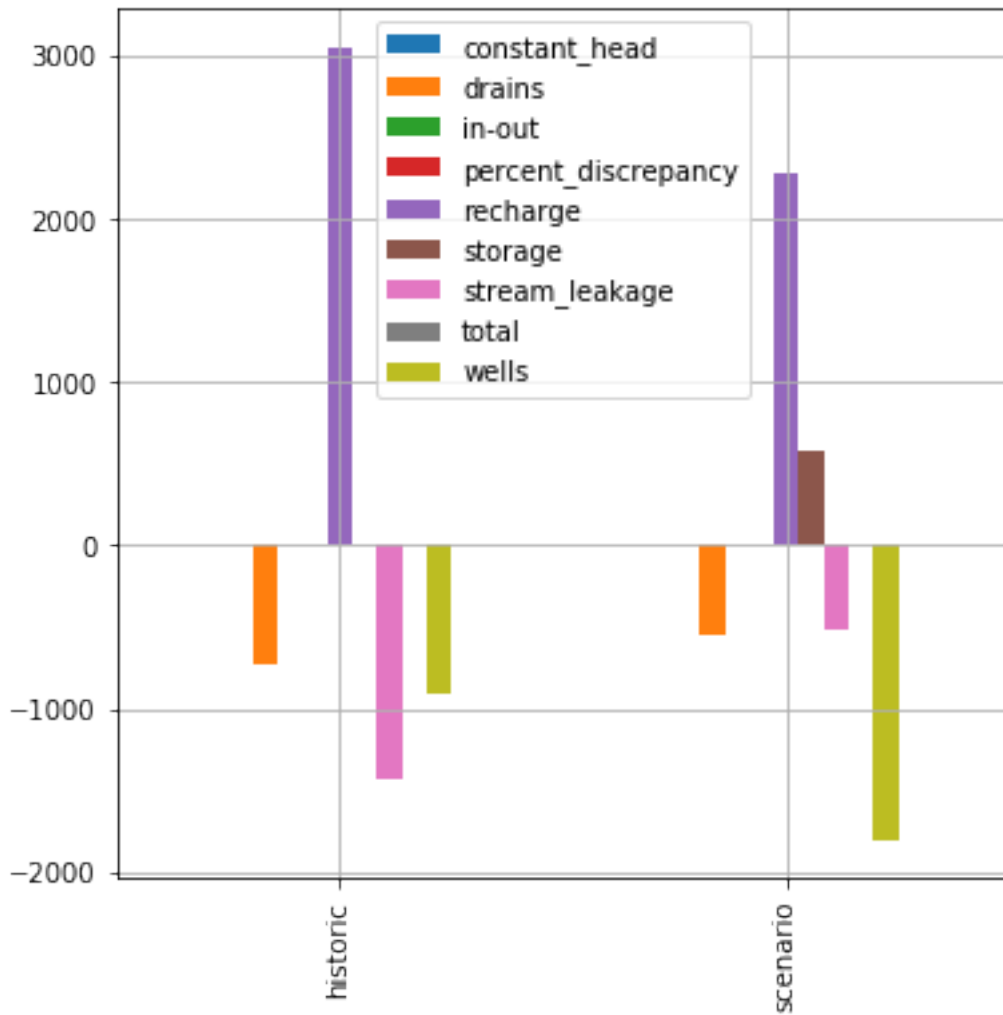
*For the future scenario, a serious drought, recharge is lower and pumping/abstraction is increased to make up for the presumed deficits in water for agriculture.*

```
In [8]: plt.figure()
        hds = flopy.utils.HeadFile(os.path.join(m.model_ws,m.name+".hds"),model=m)
        hds.plot(mfay=0)
        lst = flopy.utils.MfListBudget(os.path.join(m.model_ws,m.name+".list"))
        df = lst.get_dataframes(diff=True)[0]
        plt.figure()
        ax = df.plot(kind="bar",figsize=(6,6), grid=True)
        ax.set_xticklabels(["historic","scenario"])
```

```
Out[8]: [Text(0,0,'historic'), Text(0,0,'scenario')]
```



<matplotlib.figure.Figure at 0x280ef113da0>

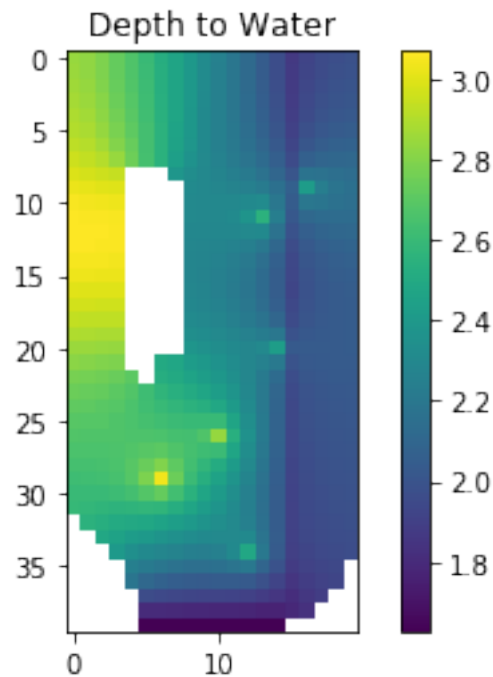


We can see the effect of the "scenario" in the second stress period with less recharge and more abstraction.

### 1.0.6 Plot depth to water

```
In [9]: dtw = m.dis.top.array - hds.get_data()[0,:,:]
dtw = np.ma.masked_where(m.bas6.ibound[0].array==0,dtw)
c = plt.imshow(dtw)
plt.title('Depth to Water')
plt.colorbar(c)
```

Out [9]: <matplotlib.colorbar.Colorbar at 0x280ef395d68>



we can see the river and well locations expressed in the depth to water pattern.

## 1.1 Setup data structures related to what we want to parameterize and what we want to observe

### 1.1.1 first the parameterization of model inputs

```
In [10]: props = []
         # here we specify which packages we wish to parameterize,
         # starting with those that do not change over time
         paks = ["upw.hk", "upw.vka", "upw.ss", "upw.sy", "bas6.strt", "extra.prsity"]  #"extra" be
         for k in range(m.nlay):
             props.extend([[p,k] for p in paks])
         # next we specify that we want to make parameters for recharge
         # for both stress periods (zero-based! Python style)
         props.append(["rch.rech", 0])
         props.append(["rch.rech", 1])

         props
```

```
Out [10]: [['upw.hk', 0],
           ['upw.vka', 0],
           ['upw.ss', 0],
           ['upw.sy', 0],
```

```

['bas6.strt', 0],
['extra.prsity', 0],
['upw.hk', 1],
['upw.vka', 1],
['upw.ss', 1],
['upw.sy', 1],
['bas6.strt', 1],
['extra.prsity', 1],
['upw.hk', 2],
['upw.vka', 2],
['upw.ss', 2],
['upw.sy', 2],
['bas6.strt', 2],
['extra.prsity', 2],
['rch.rech', 0],
['rch.rech', 1]]

```

### 1.1.2 we want to handle list-type parameters in two ways

for spatial\_list\_props this will apply a multiplier distributed spatially that applied in all stress periods throughout the model

for temporal\_list\_props this will apply a multiplier for each stress period applied to all the spatial locations

```

In [11]: spatial_list_props = [{"wel.flux",2},{"drn.cond",0}] # spatially by each list entry,
        temporal_list_props = [{"wel.flux",0},{"wel.flux",1}] # spatially uniform for each s

        spatial_list_props, temporal_list_props

```

```

Out[11]: (['wel.flux', 2], ['drn.cond', 0]), (['wel.flux', 0], ['wel.flux', 1])

```

### 1.1.3 next we want to set up the extraction of model outputs for which we have observations. First, we will setup a post-processor that will read the heads for all active cells in both stress periods - why not?

```

In [12]: hds_kperk = [[0,k] for k in range(m.nlay)]
        hds_kperk.extend([[1,k] for k in range(m.nlay)])

        hds_kperk

```

```

Out[12]: [[0, 0], [0, 1], [0, 2], [1, 0], [1, 1], [1, 2]]

```

### 1.1.4 then we setup monitoring of the SFR ASCII outputs.

we will accumulate the first 20 reaches and last 20 reaches (corresponding to the top and bottom half of the model, respectively) together to form forecasts of sw-gw exchange in the headwaters (hw) and tailwaters (tw). Then we will also add each reach individually for monitoring as well

```
In [13]: sfr_obs_dict = {}
         sfr_obs_dict["hw"] = np.arange(1,int(m.nrow/2))
         sfr_obs_dict["tw"] = np.arange(int(m.nrow/2),m.nrow)
         for i in range(m.nrow):
             sfr_obs_dict[i] = i+1
```

### 1.1.5 here we go...

This pyemu class has grown into a monster...it does (among other things): - sets up combinations of multiplier parameters for array inputs, including uniform, zones, pilot points, grids, and KL expansion types - sets up combinations of multiplier parameters for list inputs - handles several of the shitty modflow exceptions to the array and list style inputs - sets up large numbers of observations based on arrays or time series - writes .tpl, .ins, .pst, etc - writes a python forward run script - writes a prior parameter covaraince matrix using geostatistical correlations - draws from the prior parameter covariance matrix to generate a prior parameter ensemble

WAT?!

This will be slow because the pure python kriging...but, hey, its free!

For our purposes, we will setup combinations of constant (by layer), pilot points and grid-scale parameters for each of the array-based properties we defined earlier. This lets us explore options for parameterization and also start to understand how information flows in the history matching problem

```
In [14]: pst_helper = pyemu.helpers.PstFromFlopyModel(nam_file,new_model_ws="template",org_model_ws="template",
                                                    const_props=props,spatial_list_props=spatial_list_props,
                                                    temporal_list_props=temporal_list_props,
                                                    grid_props=props,pp_props=props,sfr_params=sfr_params,
                                                    sfr_obs=sfr_obs_dict,build_prior=False,
                                                    pp_space=4)
         prep_deps.prep_template(t_d=pst_helper.new_model_ws)
```

2019-07-17 01:00:44.812250 starting: loading flopy model

Creating new model with name: freyberg

Parsing the namefile --> temp\freyberg.nam

External unit dictionary:

{2: filename:temp\freyberg.list, filetype:LIST, 11: filename:temp\freyberg.dis, filetype:DIS, ...}

ModflowBas6 free format:True

loading dis package file...

Loading dis package with:

3 layers, 40 rows, 20 columns, and 2 stress periods

loading laycbd...



```

loading delr...
loading delc...
loading top...
loading botm...
    for 3 layers and 0 confining beds
loading stress period data...
    for 2 stress periods
adding Package:  DIS
    DIS  package load...success
    LIST package load...skipped
loading bas6 package file...
adding Package:  BAS6
    BAS6 package load...success
loading upw package file...
    loading ipakcb, HDRY, NPUPW, IPHDRY...
    loading LAYTYP...
    loading LAYAVG...
    loading CHANI...
    loading LAYVKA...
    loading LAYWET...
    loading hk layer   1...
    loading vka layer  1...
    loading ss layer   1...
    loading sy layer   1...
    loading hk layer   2...
    loading vka layer  2...
    loading ss layer   2...
    loading sy layer   2...
    loading hk layer   3...
    loading vka layer  3...
    loading ss layer   3...
    loading sy layer   3...
Adding freyberg.cbc (unit=50) to the output list.
adding Package:  UPW
    UPW  package load...success
loading rch package file...
    loading rech stress period  1...
    loading rech stress period  2...
adding Package:  RCH
    RCH  package load...success
loading nwt package file...
adding Package:  NWT
    NWT  package load...success
loading oc package file...
Adding freyberg.hds (unit=51) to the output list.
adding Package:  OC
    OC   package load...success
loading lmt package file...

```

```

adding Package:  LMT6
    LMT6 package load...success
loading wel package file...
    loading <class 'flopy.modflow.mfwel.ModflowWel'> for kper      1
    loading <class 'flopy.modflow.mfwel.ModflowWel'> for kper      2
adding Package:  WEL
    WEL package load...success
loading sfr2 package file...
Adding freyberg.sfr.out (unit=60) to the output list.
adding Package:  SFR
    SFR package load...success
loading drn package file...
    loading <class 'flopy.modflow.mfdrn.ModflowDrn'> for kper      1
    loading <class 'flopy.modflow.mfdrn.ModflowDrn'> for kper      2
adding Package:  DRN
    DRN package load...success
    DATA(BINARY) file load...skipped
        freyberg.cbc
    DATA(BINARY) file load...skipped
        freyberg.hds
    DATA file load...skipped
        freyberg.sfr.out
Warning: external file unit 0 does not exist in ext_unit_dict.

    The following 10 packages were successfully loaded.
        freyberg.dis
        freyberg.bas
        freyberg.upw
        freyberg.rch
        freyberg.nwt
        freyberg.oc
        freyberg.lmt6
        freyberg.wel
        freyberg.sfr
        freyberg.drn
    The following 1 packages were not loaded.
        freyberg.list
2019-07-17 01:00:44.912337 finished: loading flopy model took: 0:00:00.100087
2019-07-17 01:00:44.912337 starting: updating model attributes
2019-07-17 01:00:44.912337 finished: updating model attributes took: 0:00:00
2019-07-17 01:00:44.912337 WARNING: removing existing 'new_model_ws'

creating model workspace...
    template

changing model workspace...
    template
2019-07-17 01:00:47.313601 starting: writing new modflow input files

```

Writing packages:

Package: DIS

Util2d:delr: resetting 'how' to external

Util2d:delc: resetting 'how' to external

Util2d:model\_top: resetting 'how' to external

Util2d:botm\_layer\_0: resetting 'how' to external

Util2d:botm\_layer\_1: resetting 'how' to external

Util2d:botm\_layer\_2: resetting 'how' to external

Package: BAS6

Util2d:ibound\_layer\_0: resetting 'how' to external

Util2d:ibound\_layer\_1: resetting 'how' to external

Util2d:ibound\_layer\_2: resetting 'how' to external

Util2d:strt\_layer\_0: resetting 'how' to external

Util2d:strt\_layer\_1: resetting 'how' to external

Util2d:strt\_layer\_2: resetting 'how' to external

Package: UPW

Util2d:hk: resetting 'how' to external

Util2d:vka: resetting 'how' to external

Util2d:ss: resetting 'how' to external

Util2d:sy: resetting 'how' to external

Util2d:hk: resetting 'how' to external

Util2d:vka: resetting 'how' to external

Util2d:ss: resetting 'how' to external

Util2d:sy: resetting 'how' to external

Util2d:hk: resetting 'how' to external

Util2d:vka: resetting 'how' to external

Util2d:ss: resetting 'how' to external

Util2d:sy: resetting 'how' to external

Package: RCH

Util2d:rech\_1: resetting 'how' to external

Util2d:rech\_2: resetting 'how' to external

Package: NWT

Package: OC

Package: LMT6

Package: WEL

Package: SFR

Package: DRN

2019-07-17 01:00:47.818075 finished: writing new modflow input files took: 0:00:00.504474

2019-07-17 01:00:47.819076 forward\_run line:pyemu.os\_utils.run('mfntw freyberg.nam 1>freyberg.

2019-07-17 01:00:47.819076 starting: setting up 'template\arr\_org' dir

2019-07-17 01:00:47.821077 finished: setting up 'template\arr\_org' dir took: 0:00:00.002001

2019-07-17 01:00:47.821077 starting: setting up 'template\arr\_mlt' dir

2019-07-17 01:00:47.823077 finished: setting up 'template\arr\_mlt' dir took: 0:00:00.002000

2019-07-17 01:00:47.823077 starting: setting up 'template\list\_org' dir

2019-07-17 01:00:47.826082 finished: setting up 'template\list\_org' dir took: 0:00:00.003005

2019-07-17 01:00:47.826082 starting: setting up 'template\list\_mlt' dir

```

2019-07-17 01:00:47.827082 finished: setting up 'template\list_mlt' dir took: 0:00:00.001000
2019-07-17 01:00:47.828083 starting: processing temporal_list_props
2019-07-17 01:00:47.876123 finished: processing temporal_list_props took: 0:00:00.048040
2019-07-17 01:00:47.877124 starting: processing spatial_list_props
2019-07-17 01:00:48.034254 finished: processing spatial_list_props took: 0:00:00.157130
2019-07-17 01:00:48.116325 forward_run line:pyemu.helpers.apply_list_pars()

2019-07-17 01:00:48.207402 'extra' pak detected:extra.prsity
2019-07-17 01:00:48.325501 'extra' pak detected:extra.prsity
2019-07-17 01:00:48.431588 'extra' pak detected:extra.prsity
2019-07-17 01:00:48.538679 'extra' pak detected:extra.prsity
2019-07-17 01:00:48.604734 'extra' pak detected:extra.prsity
2019-07-17 01:00:48.670789 'extra' pak detected:extra.prsity
2019-07-17 01:00:48.761865 'extra' pak detected:extra.prsity
2019-07-17 01:00:48.828921 'extra' pak detected:extra.prsity
2019-07-17 01:00:48.894976 'extra' pak detected:extra.prsity
2019-07-17 01:00:49.038096 starting: writing grid tpl:hk3.dat_gr.tpl
2019-07-17 01:00:49.061116 finished: writing grid tpl:hk3.dat_gr.tpl took: 0:00:00.023020
2019-07-17 01:00:49.065120 starting: writing grid tpl:vka3.dat_gr.tpl
2019-07-17 01:00:49.087138 finished: writing grid tpl:vka3.dat_gr.tpl took: 0:00:00.022018
2019-07-17 01:00:49.091141 starting: writing grid tpl:ss3.dat_gr.tpl
2019-07-17 01:00:49.111158 finished: writing grid tpl:ss3.dat_gr.tpl took: 0:00:00.020017
2019-07-17 01:00:49.115161 starting: writing grid tpl:sy3.dat_gr.tpl
2019-07-17 01:00:49.136179 finished: writing grid tpl:sy3.dat_gr.tpl took: 0:00:00.021018
2019-07-17 01:00:49.140182 starting: writing grid tpl:strt3.dat_gr.tpl
2019-07-17 01:00:49.163202 finished: writing grid tpl:strt3.dat_gr.tpl took: 0:00:00.023020
2019-07-17 01:00:49.167205 starting: writing grid tpl:prsity3.dat_gr.tpl
2019-07-17 01:00:49.192226 finished: writing grid tpl:prsity3.dat_gr.tpl took: 0:00:00.025021
2019-07-17 01:00:49.196229 starting: writing grid tpl:hk4.dat_gr.tpl
2019-07-17 01:00:49.218247 finished: writing grid tpl:hk4.dat_gr.tpl took: 0:00:00.022018
2019-07-17 01:00:49.222251 starting: writing grid tpl:vka4.dat_gr.tpl
2019-07-17 01:00:49.250273 finished: writing grid tpl:vka4.dat_gr.tpl took: 0:00:00.028022
2019-07-17 01:00:49.255278 starting: writing grid tpl:ss4.dat_gr.tpl
2019-07-17 01:00:49.276296 finished: writing grid tpl:ss4.dat_gr.tpl took: 0:00:00.021018
2019-07-17 01:00:49.280299 starting: writing grid tpl:sy4.dat_gr.tpl
2019-07-17 01:00:49.299315 finished: writing grid tpl:sy4.dat_gr.tpl took: 0:00:00.019016
2019-07-17 01:00:49.303318 starting: writing grid tpl:strt4.dat_gr.tpl
2019-07-17 01:00:49.323335 finished: writing grid tpl:strt4.dat_gr.tpl took: 0:00:00.020017
2019-07-17 01:00:49.327339 starting: writing grid tpl:prsity4.dat_gr.tpl
2019-07-17 01:00:49.349358 finished: writing grid tpl:prsity4.dat_gr.tpl took: 0:00:00.022019
2019-07-17 01:00:49.353361 starting: writing grid tpl:hk5.dat_gr.tpl
2019-07-17 01:00:49.371375 finished: writing grid tpl:hk5.dat_gr.tpl took: 0:00:00.018014
2019-07-17 01:00:49.375379 starting: writing grid tpl:vka5.dat_gr.tpl
2019-07-17 01:00:49.396397 finished: writing grid tpl:vka5.dat_gr.tpl took: 0:00:00.021018
2019-07-17 01:00:49.400400 starting: writing grid tpl:ss5.dat_gr.tpl
2019-07-17 01:00:49.420417 finished: writing grid tpl:ss5.dat_gr.tpl took: 0:00:00.020017
2019-07-17 01:00:49.424420 starting: writing grid tpl:sy5.dat_gr.tpl
2019-07-17 01:00:49.444436 finished: writing grid tpl:sy5.dat_gr.tpl took: 0:00:00.020016

```

2019-07-17 01:00:49.448440 starting: writing grid tpl:strt5.dat\_gr.tpl  
 2019-07-17 01:00:49.479467 finished: writing grid tpl:strt5.dat\_gr.tpl took: 0:00:00.031027  
 2019-07-17 01:00:49.484471 starting: writing grid tpl:prsity5.dat\_gr.tpl  
 2019-07-17 01:00:49.511493 finished: writing grid tpl:prsity5.dat\_gr.tpl took: 0:00:00.027022  
 2019-07-17 01:00:49.515496 starting: writing grid tpl:rech2.dat\_gr.tpl  
 2019-07-17 01:00:49.537514 finished: writing grid tpl:rech2.dat\_gr.tpl took: 0:00:00.022018  
 2019-07-17 01:00:49.541518 starting: writing grid tpl:rech3.dat\_gr.tpl  
 2019-07-17 01:00:49.564538 finished: writing grid tpl:rech3.dat\_gr.tpl took: 0:00:00.023020  
 2019-07-17 01:00:49.568540 starting: writing const tpl:hk6.dat\_cn.tpl  
 2019-07-17 01:00:49.584554 finished: writing const tpl:hk6.dat\_cn.tpl took: 0:00:00.016014  
 2019-07-17 01:00:49.588558 starting: writing const tpl:vka6.dat\_cn.tpl  
 2019-07-17 01:00:49.603570 finished: writing const tpl:vka6.dat\_cn.tpl took: 0:00:00.015012  
 2019-07-17 01:00:49.607573 starting: writing const tpl:ss6.dat\_cn.tpl  
 2019-07-17 01:00:49.625589 finished: writing const tpl:ss6.dat\_cn.tpl took: 0:00:00.018016  
 2019-07-17 01:00:49.629592 starting: writing const tpl:sy6.dat\_cn.tpl  
 2019-07-17 01:00:49.643603 finished: writing const tpl:sy6.dat\_cn.tpl took: 0:00:00.014011  
 2019-07-17 01:00:49.647607 starting: writing const tpl:strt6.dat\_cn.tpl  
 2019-07-17 01:00:49.663620 finished: writing const tpl:strt6.dat\_cn.tpl took: 0:00:00.016013  
 2019-07-17 01:00:49.670631 starting: writing const tpl:prsity6.dat\_cn.tpl  
 2019-07-17 01:00:49.684638 finished: writing const tpl:prsity6.dat\_cn.tpl took: 0:00:00.014007  
 2019-07-17 01:00:49.688641 starting: writing const tpl:hk7.dat\_cn.tpl  
 2019-07-17 01:00:49.701652 finished: writing const tpl:hk7.dat\_cn.tpl took: 0:00:00.013011  
 2019-07-17 01:00:49.705656 starting: writing const tpl:vka7.dat\_cn.tpl  
 2019-07-17 01:00:49.720668 finished: writing const tpl:vka7.dat\_cn.tpl took: 0:00:00.015012  
 2019-07-17 01:00:49.724672 starting: writing const tpl:ss7.dat\_cn.tpl  
 2019-07-17 01:00:49.737682 finished: writing const tpl:ss7.dat\_cn.tpl took: 0:00:00.013010  
 2019-07-17 01:00:49.741686 starting: writing const tpl:sy7.dat\_cn.tpl  
 2019-07-17 01:00:49.759701 finished: writing const tpl:sy7.dat\_cn.tpl took: 0:00:00.018015  
 2019-07-17 01:00:49.763704 starting: writing const tpl:strt7.dat\_cn.tpl  
 2019-07-17 01:00:49.779717 finished: writing const tpl:strt7.dat\_cn.tpl took: 0:00:00.016013  
 2019-07-17 01:00:49.783721 starting: writing const tpl:prsity7.dat\_cn.tpl  
 2019-07-17 01:00:49.799734 finished: writing const tpl:prsity7.dat\_cn.tpl took: 0:00:00.016013  
 2019-07-17 01:00:49.803737 starting: writing const tpl:hk8.dat\_cn.tpl  
 2019-07-17 01:00:49.816748 finished: writing const tpl:hk8.dat\_cn.tpl took: 0:00:00.013011  
 2019-07-17 01:00:49.820752 starting: writing const tpl:vka8.dat\_cn.tpl  
 2019-07-17 01:00:49.832762 finished: writing const tpl:vka8.dat\_cn.tpl took: 0:00:00.012010  
 2019-07-17 01:00:49.836765 starting: writing const tpl:ss8.dat\_cn.tpl  
 2019-07-17 01:00:49.848775 finished: writing const tpl:ss8.dat\_cn.tpl took: 0:00:00.012010  
 2019-07-17 01:00:49.852779 starting: writing const tpl:sy8.dat\_cn.tpl  
 2019-07-17 01:00:49.865790 finished: writing const tpl:sy8.dat\_cn.tpl took: 0:00:00.013011  
 2019-07-17 01:00:49.869793 starting: writing const tpl:strt8.dat\_cn.tpl  
 2019-07-17 01:00:49.885806 finished: writing const tpl:strt8.dat\_cn.tpl took: 0:00:00.016013  
 2019-07-17 01:00:49.889810 starting: writing const tpl:prsity8.dat\_cn.tpl  
 2019-07-17 01:00:49.908826 finished: writing const tpl:prsity8.dat\_cn.tpl took: 0:00:00.019016  
 2019-07-17 01:00:49.913834 starting: writing const tpl:rech4.dat\_cn.tpl  
 2019-07-17 01:00:49.930844 finished: writing const tpl:rech4.dat\_cn.tpl took: 0:00:00.017010  
 2019-07-17 01:00:49.934848 starting: writing const tpl:rech5.dat\_cn.tpl  
 2019-07-17 01:00:49.950861 finished: writing const tpl:rech5.dat\_cn.tpl took: 0:00:00.016013

```

2019-07-17 01:00:49.978884 starting: setting up pilot point process
2019-07-17 01:00:49.978884 WARNING: pp_geostruc is None, using ExpVario with contribution=1 and
2019-07-17 01:00:49.982888 pp_dict: {0: ['hk0', 'prsity0', 'rech0', 'rech1', 'ss0', 'strt0', 'sy0', 'vka0', 'hk1', 'hk2']}
2019-07-17 01:00:49.982888 starting: calling setup_pilot_point_grid()
error importing shapefile, try pip install pyshp...No module named 'shapefile'
2019-07-17 01:00:50.998788 640 pilot point parameters created
2019-07-17 01:00:50.999791 pilot point 'pargp':hk0,prsity0,rech0,rech1,ss0,strt0,sy0,vka0,hk1,hk2
2019-07-17 01:00:50.999791 finished: calling setup_pilot_point_grid() took: 0:00:01.016903
2019-07-17 01:00:51.002791 starting: calculating factors for p=hk0, k=0
2019-07-17 01:00:51.004793 saving krige variance file:template\pp_k0_general_zn.fac
2019-07-17 01:00:51.004793 saving krige factors file:template\pp_k0_general_zn.fac
starting interp point loop for 800 points
took 3.951309 seconds
2019-07-17 01:00:55.090214 finished: calculating factors for p=hk0, k=0 took: 0:00:04.087423
2019-07-17 01:00:55.092216 starting: calculating factors for p=prsity0, k=0
2019-07-17 01:00:55.093216 finished: calculating factors for p=prsity0, k=0 took: 0:00:00.001001
2019-07-17 01:00:55.095218 starting: calculating factors for p=rech0, k=0
2019-07-17 01:00:55.096219 finished: calculating factors for p=rech0, k=0 took: 0:00:00.001001
2019-07-17 01:00:55.097221 starting: calculating factors for p=rech1, k=0
2019-07-17 01:00:55.098221 finished: calculating factors for p=rech1, k=0 took: 0:00:00.001000
2019-07-17 01:00:55.099270 starting: calculating factors for p=ss0, k=0
2019-07-17 01:00:55.101223 finished: calculating factors for p=ss0, k=0 took: 0:00:00.001953
2019-07-17 01:00:55.102224 starting: calculating factors for p=strt0, k=0
2019-07-17 01:00:55.103226 finished: calculating factors for p=strt0, k=0 took: 0:00:00.001002
2019-07-17 01:00:55.104226 starting: calculating factors for p=sy0, k=0
2019-07-17 01:00:55.106228 finished: calculating factors for p=sy0, k=0 took: 0:00:00.002002
2019-07-17 01:00:55.107229 starting: calculating factors for p=vka0, k=0
2019-07-17 01:00:55.108230 finished: calculating factors for p=vka0, k=0 took: 0:00:00.001001
2019-07-17 01:00:55.109231 starting: calculating factors for p=hk1, k=1
2019-07-17 01:00:55.110232 saving krige variance file:template\pp_k1_general_zn.fac
2019-07-17 01:00:55.111232 saving krige factors file:template\pp_k1_general_zn.fac
starting interp point loop for 800 points
took 4.076412 seconds
2019-07-17 01:00:59.296736 finished: calculating factors for p=hk1, k=1 took: 0:00:04.187505
2019-07-17 01:00:59.298737 starting: calculating factors for p=prsity1, k=1
2019-07-17 01:00:59.299739 finished: calculating factors for p=prsity1, k=1 took: 0:00:00.001001
2019-07-17 01:00:59.300739 starting: calculating factors for p=ss1, k=1
2019-07-17 01:00:59.301740 finished: calculating factors for p=ss1, k=1 took: 0:00:00.001001
2019-07-17 01:00:59.302741 starting: calculating factors for p=strt1, k=1
2019-07-17 01:00:59.303742 finished: calculating factors for p=strt1, k=1 took: 0:00:00.001001
2019-07-17 01:00:59.304743 starting: calculating factors for p=sy1, k=1
2019-07-17 01:00:59.306744 finished: calculating factors for p=sy1, k=1 took: 0:00:00.002001
2019-07-17 01:00:59.307745 starting: calculating factors for p=vka1, k=1
2019-07-17 01:00:59.308746 finished: calculating factors for p=vka1, k=1 took: 0:00:00.001001
2019-07-17 01:00:59.309747 starting: calculating factors for p=hk2, k=2
2019-07-17 01:00:59.310747 saving krige variance file:template\pp_k2_general_zn.fac
2019-07-17 01:00:59.311748 saving krige factors file:template\pp_k2_general_zn.fac
starting interp point loop for 800 points

```

took 3.925293 seconds

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2019-07-17 01:01:03.396175 finished: calculating factors for p=hk2, k=2 took: 0:00:04.086428
2019-07-17 01:01:03.399173 starting: calculating factors for p=prsity2, k=2
2019-07-17 01:01:03.402175 finished: calculating factors for p=prsity2, k=2 took: 0:00:00.003000
2019-07-17 01:01:03.404182 starting: calculating factors for p=ss2, k=2
2019-07-17 01:01:03.407184 finished: calculating factors for p=ss2, k=2 took: 0:00:00.003002
2019-07-17 01:01:03.409182 starting: calculating factors for p=strt2, k=2
2019-07-17 01:01:03.411187 finished: calculating factors for p=strt2, k=2 took: 0:00:00.002005
2019-07-17 01:01:03.414190 starting: calculating factors for p=sy2, k=2
2019-07-17 01:01:03.416192 finished: calculating factors for p=sy2, k=2 took: 0:00:00.002002
2019-07-17 01:01:03.419195 starting: calculating factors for p=vka2, k=2
2019-07-17 01:01:03.422197 finished: calculating factors for p=vka2, k=2 took: 0:00:00.003002
2019-07-17 01:01:03.422197 starting: processing pp_prefix:hk0
2019-07-17 01:01:03.441208 starting: processing pp_prefix:prsity0
2019-07-17 01:01:03.455220 starting: processing pp_prefix:rech0
2019-07-17 01:01:03.470232 starting: processing pp_prefix:rech1
2019-07-17 01:01:03.483243 starting: processing pp_prefix:ss0
2019-07-17 01:01:03.501258 starting: processing pp_prefix:strt0
2019-07-17 01:01:03.515270 starting: processing pp_prefix:sy0
2019-07-17 01:01:03.528281 starting: processing pp_prefix:vka0
2019-07-17 01:01:03.542037 starting: processing pp_prefix:hk1
2019-07-17 01:01:03.556041 starting: processing pp_prefix:prsity1
2019-07-17 01:01:03.569047 starting: processing pp_prefix:ss1
2019-07-17 01:01:03.583065 starting: processing pp_prefix:strt1
2019-07-17 01:01:03.597075 starting: processing pp_prefix:sy1
2019-07-17 01:01:03.610080 starting: processing pp_prefix:vka1
2019-07-17 01:01:03.624094 starting: processing pp_prefix:hk2
2019-07-17 01:01:03.637102 starting: processing pp_prefix:prsity2
2019-07-17 01:01:03.651119 starting: processing pp_prefix:ss2
2019-07-17 01:01:03.664118 starting: processing pp_prefix:strt2
2019-07-17 01:01:03.678142 starting: processing pp_prefix:sy2
2019-07-17 01:01:03.692145 starting: processing pp_prefix:vka2
2019-07-17 01:01:03.886319 finished: setting up pilot point process took: 0:00:13.907435
2019-07-17 01:01:03.887315 starting: setting up grid process
2019-07-17 01:01:03.887315 WARNING: grid_geostruc is None, using ExpVario with contribution=1
2019-07-17 01:01:03.887315 finished: setting up grid process took: 0:00:00
2019-07-17 01:01:03.904323 starting: save test mlt array arr_mlt\hk0.dat_pp
2019-07-17 01:01:03.920337 finished: save test mlt array arr_mlt\hk0.dat_pp took: 0:00:00.016000
2019-07-17 01:01:03.922342 starting: save test mlt array arr_mlt\vka0.dat_pp
2019-07-17 01:01:03.940356 finished: save test mlt array arr_mlt\vka0.dat_pp took: 0:00:00.018000
2019-07-17 01:01:03.941354 starting: save test mlt array arr_mlt\ss0.dat_pp
2019-07-17 01:01:03.955371 finished: save test mlt array arr_mlt\ss0.dat_pp took: 0:00:00.014000
2019-07-17 01:01:03.956367 starting: save test mlt array arr_mlt\sy0.dat_pp
2019-07-17 01:01:03.970393 finished: save test mlt array arr_mlt\sy0.dat_pp took: 0:00:00.014000
2019-07-17 01:01:03.971393 starting: save test mlt array arr_mlt\strt0.dat_pp
2019-07-17 01:01:03.984409 finished: save test mlt array arr_mlt\strt0.dat_pp took: 0:00:00.011000
2019-07-17 01:01:03.985409 starting: save test mlt array arr_mlt\prsity0.dat_pp
2019-07-17 01:01:03.998416 finished: save test mlt array arr_mlt\prsity0.dat_pp took: 0:00:00.011000
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2019-07-17 01:01:03.999421 starting: save test mlt array arr\_mlt\hk1.dat\_pp  
 2019-07-17 01:01:04.012428 finished: save test mlt array arr\_mlt\hk1.dat\_pp took: 0:00:00.0130  
 2019-07-17 01:01:04.013433 starting: save test mlt array arr\_mlt\vka1.dat\_pp  
 2019-07-17 01:01:04.026439 finished: save test mlt array arr\_mlt\vka1.dat\_pp took: 0:00:00.0130  
 2019-07-17 01:01:04.027445 starting: save test mlt array arr\_mlt\ss1.dat\_pp  
 2019-07-17 01:01:04.040459 finished: save test mlt array arr\_mlt\ss1.dat\_pp took: 0:00:00.0130  
 2019-07-17 01:01:04.042457 starting: save test mlt array arr\_mlt\sy1.dat\_pp  
 2019-07-17 01:01:04.055468 finished: save test mlt array arr\_mlt\sy1.dat\_pp took: 0:00:00.0130  
 2019-07-17 01:01:04.056475 starting: save test mlt array arr\_mlt\strt1.dat\_pp  
 2019-07-17 01:01:04.069479 finished: save test mlt array arr\_mlt\strt1.dat\_pp took: 0:00:00.0130  
 2019-07-17 01:01:04.070482 starting: save test mlt array arr\_mlt\prsity1.dat\_pp  
 2019-07-17 01:01:04.083492 finished: save test mlt array arr\_mlt\prsity1.dat\_pp took: 0:00:00.0130  
 2019-07-17 01:01:04.084500 starting: save test mlt array arr\_mlt\hk2.dat\_pp  
 2019-07-17 01:01:04.097503 finished: save test mlt array arr\_mlt\hk2.dat\_pp took: 0:00:00.0130  
 2019-07-17 01:01:04.098507 starting: save test mlt array arr\_mlt\vka2.dat\_pp  
 2019-07-17 01:01:04.115512 finished: save test mlt array arr\_mlt\vka2.dat\_pp took: 0:00:00.0170  
 2019-07-17 01:01:04.117514 starting: save test mlt array arr\_mlt\ss2.dat\_pp  
 2019-07-17 01:01:04.130527 finished: save test mlt array arr\_mlt\ss2.dat\_pp took: 0:00:00.0130  
 2019-07-17 01:01:04.132532 starting: save test mlt array arr\_mlt\sy2.dat\_pp  
 2019-07-17 01:01:04.145540 finished: save test mlt array arr\_mlt\sy2.dat\_pp took: 0:00:00.0130  
 2019-07-17 01:01:04.146544 starting: save test mlt array arr\_mlt\strt2.dat\_pp  
 2019-07-17 01:01:04.159560 finished: save test mlt array arr\_mlt\strt2.dat\_pp took: 0:00:00.0130  
 2019-07-17 01:01:04.160556 starting: save test mlt array arr\_mlt\prsity2.dat\_pp  
 2019-07-17 01:01:04.173567 finished: save test mlt array arr\_mlt\prsity2.dat\_pp took: 0:00:00.0130  
 2019-07-17 01:01:04.175573 starting: save test mlt array arr\_mlt\rech0.dat\_pp  
 2019-07-17 01:01:04.189584 finished: save test mlt array arr\_mlt\rech0.dat\_pp took: 0:00:00.0130  
 2019-07-17 01:01:04.190581 starting: save test mlt array arr\_mlt\rech1.dat\_pp  
 2019-07-17 01:01:04.203592 finished: save test mlt array arr\_mlt\rech1.dat\_pp took: 0:00:00.0130  
 2019-07-17 01:01:04.204597 starting: save test mlt array arr\_mlt\hk3.dat\_gr  
 2019-07-17 01:01:04.217600 finished: save test mlt array arr\_mlt\hk3.dat\_gr took: 0:00:00.0130  
 2019-07-17 01:01:04.218605 starting: save test mlt array arr\_mlt\vka3.dat\_gr  
 2019-07-17 01:01:04.231624 finished: save test mlt array arr\_mlt\vka3.dat\_gr took: 0:00:00.0130  
 2019-07-17 01:01:04.232616 starting: save test mlt array arr\_mlt\ss3.dat\_gr  
 2019-07-17 01:01:04.245636 finished: save test mlt array arr\_mlt\ss3.dat\_gr took: 0:00:00.0130  
 2019-07-17 01:01:04.246628 starting: save test mlt array arr\_mlt\sy3.dat\_gr  
 2019-07-17 01:01:04.260649 finished: save test mlt array arr\_mlt\sy3.dat\_gr took: 0:00:00.0140  
 2019-07-17 01:01:04.261637 starting: save test mlt array arr\_mlt\strt3.dat\_gr  
 2019-07-17 01:01:04.274652 finished: save test mlt array arr\_mlt\strt3.dat\_gr took: 0:00:00.0130  
 2019-07-17 01:01:04.275652 starting: save test mlt array arr\_mlt\prsity3.dat\_gr  
 2019-07-17 01:01:04.290665 finished: save test mlt array arr\_mlt\prsity3.dat\_gr took: 0:00:00.0130  
 2019-07-17 01:01:04.291666 starting: save test mlt array arr\_mlt\hk4.dat\_gr  
 2019-07-17 01:01:04.305673 finished: save test mlt array arr\_mlt\hk4.dat\_gr took: 0:00:00.0140  
 2019-07-17 01:01:04.307676 starting: save test mlt array arr\_mlt\vka4.dat\_gr  
 2019-07-17 01:01:04.322688 finished: save test mlt array arr\_mlt\vka4.dat\_gr took: 0:00:00.0150  
 2019-07-17 01:01:04.323693 starting: save test mlt array arr\_mlt\ss4.dat\_gr  
 2019-07-17 01:01:04.335699 finished: save test mlt array arr\_mlt\ss4.dat\_gr took: 0:00:00.0120  
 2019-07-17 01:01:04.336707 starting: save test mlt array arr\_mlt\sy4.dat\_gr  
 2019-07-17 01:01:04.346712 finished: save test mlt array arr\_mlt\sy4.dat\_gr took: 0:00:00.0100



2019-07-17 01:01:04.347709 starting: save test mlt array arr\_mlt\strt4.dat\_gr  
 2019-07-17 01:01:04.359727 finished: save test mlt array arr\_mlt\strt4.dat\_gr took: 0:00:00.011  
 2019-07-17 01:01:04.360731 starting: save test mlt array arr\_mlt\prsity4.dat\_gr  
 2019-07-17 01:01:04.370736 finished: save test mlt array arr\_mlt\prsity4.dat\_gr took: 0:00:00.011  
 2019-07-17 01:01:04.371733 starting: save test mlt array arr\_mlt\hk5.dat\_gr  
 2019-07-17 01:01:04.385751 finished: save test mlt array arr\_mlt\hk5.dat\_gr took: 0:00:00.0140  
 2019-07-17 01:01:04.386746 starting: save test mlt array arr\_mlt\vka5.dat\_gr  
 2019-07-17 01:01:04.396754 finished: save test mlt array arr\_mlt\vka5.dat\_gr took: 0:00:00.010  
 2019-07-17 01:01:04.397748 starting: save test mlt array arr\_mlt\ss5.dat\_gr  
 2019-07-17 01:01:04.412762 finished: save test mlt array arr\_mlt\ss5.dat\_gr took: 0:00:00.0150  
 2019-07-17 01:01:04.413763 starting: save test mlt array arr\_mlt\sy5.dat\_gr  
 2019-07-17 01:01:04.422771 finished: save test mlt array arr\_mlt\sy5.dat\_gr took: 0:00:00.0090  
 2019-07-17 01:01:04.423771 starting: save test mlt array arr\_mlt\strt5.dat\_gr  
 2019-07-17 01:01:04.432784 finished: save test mlt array arr\_mlt\strt5.dat\_gr took: 0:00:00.009  
 2019-07-17 01:01:04.433785 starting: save test mlt array arr\_mlt\prsity5.dat\_gr  
 2019-07-17 01:01:04.445790 finished: save test mlt array arr\_mlt\prsity5.dat\_gr took: 0:00:00.011  
 2019-07-17 01:01:04.446791 starting: save test mlt array arr\_mlt\rech2.dat\_gr  
 2019-07-17 01:01:04.455797 finished: save test mlt array arr\_mlt\rech2.dat\_gr took: 0:00:00.009  
 2019-07-17 01:01:04.456799 starting: save test mlt array arr\_mlt\rech3.dat\_gr  
 2019-07-17 01:01:04.468818 finished: save test mlt array arr\_mlt\rech3.dat\_gr took: 0:00:00.011  
 2019-07-17 01:01:04.469810 starting: save test mlt array arr\_mlt\hk6.dat\_cn  
 2019-07-17 01:01:04.480817 finished: save test mlt array arr\_mlt\hk6.dat\_cn took: 0:00:00.0110  
 2019-07-17 01:01:04.481820 starting: save test mlt array arr\_mlt\vka6.dat\_cn  
 2019-07-17 01:01:04.491827 finished: save test mlt array arr\_mlt\vka6.dat\_cn took: 0:00:00.010  
 2019-07-17 01:01:04.492829 starting: save test mlt array arr\_mlt\ss6.dat\_cn  
 2019-07-17 01:01:04.501837 finished: save test mlt array arr\_mlt\ss6.dat\_cn took: 0:00:00.0090  
 2019-07-17 01:01:04.502838 starting: save test mlt array arr\_mlt\sy6.dat\_cn  
 2019-07-17 01:01:04.515849 finished: save test mlt array arr\_mlt\sy6.dat\_cn took: 0:00:00.0130  
 2019-07-17 01:01:04.516848 starting: save test mlt array arr\_mlt\strt6.dat\_cn  
 2019-07-17 01:01:04.527863 finished: save test mlt array arr\_mlt\strt6.dat\_cn took: 0:00:00.011  
 2019-07-17 01:01:04.528865 starting: save test mlt array arr\_mlt\prsity6.dat\_cn  
 2019-07-17 01:01:04.537872 finished: save test mlt array arr\_mlt\prsity6.dat\_cn took: 0:00:00.011  
 2019-07-17 01:01:04.538873 starting: save test mlt array arr\_mlt\hk7.dat\_cn  
 2019-07-17 01:01:04.551877 finished: save test mlt array arr\_mlt\hk7.dat\_cn took: 0:00:00.0130  
 2019-07-17 01:01:04.552880 starting: save test mlt array arr\_mlt\vka7.dat\_cn  
 2019-07-17 01:01:04.563887 finished: save test mlt array arr\_mlt\vka7.dat\_cn took: 0:00:00.011  
 2019-07-17 01:01:04.564895 starting: save test mlt array arr\_mlt\ss7.dat\_cn  
 2019-07-17 01:01:04.577901 finished: save test mlt array arr\_mlt\ss7.dat\_cn took: 0:00:00.0130  
 2019-07-17 01:01:04.578901 starting: save test mlt array arr\_mlt\sy7.dat\_cn  
 2019-07-17 01:01:04.587907 finished: save test mlt array arr\_mlt\sy7.dat\_cn took: 0:00:00.0090  
 2019-07-17 01:01:04.588910 starting: save test mlt array arr\_mlt\strt7.dat\_cn  
 2019-07-17 01:01:04.597917 finished: save test mlt array arr\_mlt\strt7.dat\_cn took: 0:00:00.009  
 2019-07-17 01:01:04.598918 starting: save test mlt array arr\_mlt\prsity7.dat\_cn  
 2019-07-17 01:01:04.608926 finished: save test mlt array arr\_mlt\prsity7.dat\_cn took: 0:00:00.011  
 2019-07-17 01:01:04.609927 starting: save test mlt array arr\_mlt\hk8.dat\_cn  
 2019-07-17 01:01:04.619940 finished: save test mlt array arr\_mlt\hk8.dat\_cn took: 0:00:00.0100  
 2019-07-17 01:01:04.620941 starting: save test mlt array arr\_mlt\vka8.dat\_cn  
 2019-07-17 01:01:04.631946 finished: save test mlt array arr\_mlt\vka8.dat\_cn took: 0:00:00.011

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2019-07-17 01:01:04.632951 starting: save test mlt array arr_mlt\ss8.dat_cn
2019-07-17 01:01:04.644962 finished: save test mlt array arr_mlt\ss8.dat_cn took: 0:00:00.0120
2019-07-17 01:01:04.646963 starting: save test mlt array arr_mlt\sy8.dat_cn
2019-07-17 01:01:04.656967 finished: save test mlt array arr_mlt\sy8.dat_cn took: 0:00:00.0100
2019-07-17 01:01:04.657973 starting: save test mlt array arr_mlt\strt8.dat_cn
2019-07-17 01:01:04.670978 finished: save test mlt array arr_mlt\strt8.dat_cn took: 0:00:00.01
2019-07-17 01:01:04.671984 starting: save test mlt array arr_mlt\prsity8.dat_cn
2019-07-17 01:01:04.681988 finished: save test mlt array arr_mlt\prsity8.dat_cn took: 0:00:00.
2019-07-17 01:01:04.682986 starting: save test mlt array arr_mlt\rech4.dat_cn
2019-07-17 01:01:04.693002 finished: save test mlt array arr_mlt\rech4.dat_cn took: 0:00:00.01
2019-07-17 01:01:04.694002 starting: save test mlt array arr_mlt\rech5.dat_cn
2019-07-17 01:01:04.703003 finished: save test mlt array arr_mlt\rech5.dat_cn took: 0:00:00.00
2019-07-17 01:01:05.902861 forward_run line:pyemu.helpers.apply_array_pars()

all zeros for runoff...skipping...
all zeros for hcond1...skipping...
all zeros for pptsw...skipping...
2019-07-17 01:01:06.115287 starting: processing obs type mflist water budget obs
2019-07-17 01:01:06.579671 forward_run line:pyemu.gw_utils.apply_mflist_budget_obs('freyberg.1
2019-07-17 01:01:06.580672 finished: processing obs type mflist water budget obs took: 0:00:00
2019-07-17 01:01:06.580672 starting: processing obs type hyd file
2019-07-17 01:01:06.580672 finished: processing obs type hyd file took: 0:00:00
2019-07-17 01:01:06.581673 starting: processing obs type external obs-sim smp files
2019-07-17 01:01:06.581673 finished: processing obs type external obs-sim smp files took: 0:00
2019-07-17 01:01:06.581673 starting: processing obs type hob
2019-07-17 01:01:06.582674 finished: processing obs type hob took: 0:00:00.001001
2019-07-17 01:01:06.582674 starting: processing obs type hds
[[0, 0], [0, 1], [0, 2], [1, 0], [1, 1], [1, 2]]
2019-07-17 01:01:07.333311 finished: processing obs type hds took: 0:00:00.750637
2019-07-17 01:01:07.333311 starting: processing obs type sfr
writing 'sfr_obs.config' to template\sfr_obs.config
2019-07-17 01:01:07.805703 finished: processing obs type sfr took: 0:00:00.472392
2019-07-17 01:01:07.805703 changing dir in to template
2019-07-17 01:01:07.807710 starting: instantiating control file from i/o files
2019-07-17 01:01:07.807710 tpl files: wel.csv.tpl,drn.csv.tpl,hk3.dat_gr.tpl,vka3.dat_gr.tpl,s
2019-07-17 01:01:07.807710 ins files: flux.dat.ins,freyberg.hds.dat.ins,freyberg.sfr.out.proces
2019-07-17 01:01:08.991924 finished: instantiating control file from i/o files took: 0:00:01.1
2019-07-17 01:01:09.332252 starting: writing forward_run.py
2019-07-17 01:01:09.345260 finished: writing forward_run.py took: 0:00:00.013008
2019-07-17 01:01:09.345260 writing pst template\freyberg.pst
noptmax:0, npar_adj:14819, nnz_obs:4434
2019-07-17 01:01:13.127420 starting: running pestchek on freyberg.pst
2019-07-17 01:01:13.388647 WARNING: error running pestchek:run() returned non-zero
2019-07-17 01:01:13.406007 pestcheck:
2019-07-17 01:01:13.406007 pestcheck:PESTCHEK Version 14.02. Watermark Numerical Computing.
2019-07-17 01:01:13.406007 pestcheck:
2019-07-17 01:01:13.406007 pestcheck:Errors ----->
2019-07-17 01:01:13.407017 pestcheck:Line 2403 of file freyberg.pst: parameter name "prsity300

```

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]



[illegible]

[illegible]

```

2019-07-17 01:01:13.456058 pestcheck:once.
2019-07-17 01:01:13.456058 pestcheck:Line 2505 of file freyberg.pst: parameter name "prsity3000
2019-07-17 01:01:13.456058 pestcheck:12 characters long.
2019-07-17 01:01:13.456058 pestcheck:Line 2505 of file freyberg.pst: parameter name "prsity3000
2019-07-17 01:01:13.457058 pestcheck:once.
2019-07-17 01:01:13.457058 pestcheck:Line 2506 of file freyberg.pst: parameter name "prsity3000
2019-07-17 01:01:13.457058 pestcheck:12 characters long.
2019-07-17 01:01:13.457058 pestcheck:Line 2506 of file freyberg.pst: parameter name "prsity3000
2019-07-17 01:01:13.457058 pestcheck:once.
2019-07-17 01:01:13.457058 pestcheck:Line 2507 of file freyberg.pst: parameter name "prsity3000
2019-07-17 01:01:13.457058 pestcheck:12 characters long.
2019-07-17 01:01:13.457058 pestcheck:Line 2507 of file freyberg.pst: parameter name "prsity3000
2019-07-17 01:01:13.457058 pestcheck:once.
2019-07-17 01:01:13.458061 pestcheck:Line 2508 of file freyberg.pst: parameter name "prsity3000
2019-07-17 01:01:13.458061 pestcheck:12 characters long.
2019-07-17 01:01:13.458061 finished: running pestchek on freyberg.pst took: 0:00:00.330641
2019-07-17 01:01:13.458061 starting: saving intermediate _setup_<> dfs into template
2019-07-17 01:01:13.763314 finished: saving intermediate _setup_<> dfs into template took: 0:00:00.306411
2019-07-17 01:01:13.764315 all done

```

The `pst_helper` instance contains the `pyemu.Pst` instance:

```

In [15]: # so, pull out the `pyemu.Pst` instance which
         #contains all the input that ultimately goes in the PEST control %%file
         pst = pst_helper.pst
         pst.npar,pst.nobs

```

```

Out[15]: (14819, 4434)

```

### 1.1.6 Oh snap!

`pyemu` uses pandas data frame format for the parameter and observation data sections. This offers plenty of querying and bulk editing options.

Let's stop for a moment to get a better feel for what just happened! Let's dig in..

```

In [16]: # check out hydraulic conductivity parameters
         pst.parameter_data.loc[pst.parameter_data.parnme.apply(lambda x: "hk" in x),:]

```

```

Out[16]:

```

	parnme	partrans	parchglim	parval1	parlbnd	parubnd	pargp	\
hk000	hk000	log	factor	1.0	0.01	100.0	pp_hk0	
hk001	hk001	log	factor	1.0	0.01	100.0	pp_hk0	
hk002	hk002	log	factor	1.0	0.01	100.0	pp_hk0	
hk003	hk003	log	factor	1.0	0.01	100.0	pp_hk0	
hk004	hk004	log	factor	1.0	0.01	100.0	pp_hk0	
hk005	hk005	log	factor	1.0	0.01	100.0	pp_hk0	
hk006	hk006	log	factor	1.0	0.01	100.0	pp_hk0	
hk007	hk007	log	factor	1.0	0.01	100.0	pp_hk0	
hk008	hk008	log	factor	1.0	0.01	100.0	pp_hk0	

hk009	hk009	log	factor	1.0	0.01	100.0	pp_hk0
hk010	hk010	log	factor	1.0	0.01	100.0	pp_hk0
hk011	hk011	log	factor	1.0	0.01	100.0	pp_hk0
hk012	hk012	log	factor	1.0	0.01	100.0	pp_hk0
hk013	hk013	log	factor	1.0	0.01	100.0	pp_hk0
hk014	hk014	log	factor	1.0	0.01	100.0	pp_hk0
hk015	hk015	log	factor	1.0	0.01	100.0	pp_hk0
hk016	hk016	log	factor	1.0	0.01	100.0	pp_hk0
hk017	hk017	log	factor	1.0	0.01	100.0	pp_hk0
hk018	hk018	log	factor	1.0	0.01	100.0	pp_hk0
hk019	hk019	log	factor	1.0	0.01	100.0	pp_hk0
hk020	hk020	log	factor	1.0	0.01	100.0	pp_hk0
hk021	hk021	log	factor	1.0	0.01	100.0	pp_hk0
hk022	hk022	log	factor	1.0	0.01	100.0	pp_hk0
hk023	hk023	log	factor	1.0	0.01	100.0	pp_hk0
hk024	hk024	log	factor	1.0	0.01	100.0	pp_hk0
hk025	hk025	log	factor	1.0	0.01	100.0	pp_hk0
hk026	hk026	log	factor	1.0	0.01	100.0	pp_hk0
hk027	hk027	log	factor	1.0	0.01	100.0	pp_hk0
hk028	hk028	log	factor	1.0	0.01	100.0	pp_hk0
hk029	hk029	log	factor	1.0	0.01	100.0	pp_hk0
...	...	...	...	...	...	...	...
hk5037013	hk5037013	log	factor	1.0	0.01	100.0	gr_hk5
hk5037014	hk5037014	log	factor	1.0	0.01	100.0	gr_hk5
hk5037015	hk5037015	log	factor	1.0	0.01	100.0	gr_hk5
hk5037016	hk5037016	log	factor	1.0	0.01	100.0	gr_hk5
hk5037017	hk5037017	log	factor	1.0	0.01	100.0	gr_hk5
hk5038005	hk5038005	log	factor	1.0	0.01	100.0	gr_hk5
hk5038006	hk5038006	log	factor	1.0	0.01	100.0	gr_hk5
hk5038007	hk5038007	log	factor	1.0	0.01	100.0	gr_hk5
hk5038008	hk5038008	log	factor	1.0	0.01	100.0	gr_hk5
hk5038009	hk5038009	log	factor	1.0	0.01	100.0	gr_hk5
hk5038010	hk5038010	log	factor	1.0	0.01	100.0	gr_hk5
hk5038011	hk5038011	log	factor	1.0	0.01	100.0	gr_hk5
hk5038012	hk5038012	log	factor	1.0	0.01	100.0	gr_hk5
hk5038013	hk5038013	log	factor	1.0	0.01	100.0	gr_hk5
hk5038014	hk5038014	log	factor	1.0	0.01	100.0	gr_hk5
hk5038015	hk5038015	log	factor	1.0	0.01	100.0	gr_hk5
hk5038016	hk5038016	log	factor	1.0	0.01	100.0	gr_hk5
hk5039005	hk5039005	log	factor	1.0	0.01	100.0	gr_hk5
hk5039006	hk5039006	log	factor	1.0	0.01	100.0	gr_hk5
hk5039007	hk5039007	log	factor	1.0	0.01	100.0	gr_hk5
hk5039008	hk5039008	log	factor	1.0	0.01	100.0	gr_hk5
hk5039009	hk5039009	log	factor	1.0	0.01	100.0	gr_hk5
hk5039010	hk5039010	log	factor	1.0	0.01	100.0	gr_hk5
hk5039011	hk5039011	log	factor	1.0	0.01	100.0	gr_hk5
hk5039012	hk5039012	log	factor	1.0	0.01	100.0	gr_hk5
hk5039013	hk5039013	log	factor	1.0	0.01	100.0	gr_hk5

hk5039014	hk5039014	log	factor	1.0	0.01	100.0	gr_hk5
hk6_cn	hk6_cn	log	factor	1.0	0.01	100.0	cn_hk6
hk7_cn	hk7_cn	log	factor	1.0	0.01	100.0	cn_hk7
hk8_cn	hk8_cn	log	factor	1.0	0.01	100.0	cn_hk8

	scale	offset	dercom
hk000	1.0	0.0	1
hk001	1.0	0.0	1
hk002	1.0	0.0	1
hk003	1.0	0.0	1
hk004	1.0	0.0	1
hk005	1.0	0.0	1
hk006	1.0	0.0	1
hk007	1.0	0.0	1
hk008	1.0	0.0	1
hk009	1.0	0.0	1
hk010	1.0	0.0	1
hk011	1.0	0.0	1
hk012	1.0	0.0	1
hk013	1.0	0.0	1
hk014	1.0	0.0	1
hk015	1.0	0.0	1
hk016	1.0	0.0	1
hk017	1.0	0.0	1
hk018	1.0	0.0	1
hk019	1.0	0.0	1
hk020	1.0	0.0	1
hk021	1.0	0.0	1
hk022	1.0	0.0	1
hk023	1.0	0.0	1
hk024	1.0	0.0	1
hk025	1.0	0.0	1
hk026	1.0	0.0	1
hk027	1.0	0.0	1
hk028	1.0	0.0	1
hk029	1.0	0.0	1
...	...	...	...
hk5037013	1.0	0.0	1
hk5037014	1.0	0.0	1
hk5037015	1.0	0.0	1
hk5037016	1.0	0.0	1
hk5037017	1.0	0.0	1
hk5038005	1.0	0.0	1
hk5038006	1.0	0.0	1
hk5038007	1.0	0.0	1
hk5038008	1.0	0.0	1
hk5038009	1.0	0.0	1
hk5038010	1.0	0.0	1

hk5038011	1.0	0.0	1
hk5038012	1.0	0.0	1
hk5038013	1.0	0.0	1
hk5038014	1.0	0.0	1
hk5038015	1.0	0.0	1
hk5038016	1.0	0.0	1
hk5039005	1.0	0.0	1
hk5039006	1.0	0.0	1
hk5039007	1.0	0.0	1
hk5039008	1.0	0.0	1
hk5039009	1.0	0.0	1
hk5039010	1.0	0.0	1
hk5039011	1.0	0.0	1
hk5039012	1.0	0.0	1
hk5039013	1.0	0.0	1
hk5039014	1.0	0.0	1
hk6_cn	1.0	0.0	1
hk7_cn	1.0	0.0	1
hk8_cn	1.0	0.0	1

[2214 rows x 10 columns]

```
In [17]: # what about observations? in particular, the sfr flow-out observations in the last s
pst.observation_data.loc[(pst.observation_data.obgnme.apply(lambda x: "flout" in x)) &
                        (pst.observation_data.obsnme.apply(lambda x: "1980" in x)),:]
```

```
Out[17]:
```

	obsnme	obsval	weight	obgnme
fo_0_19801229	fo_0_19801229	10054.0	1.0	flout
fo_10_19801229	fo_10_19801229	10374.0	1.0	flout
fo_11_19801229	fo_11_19801229	10376.0	1.0	flout
fo_12_19801229	fo_12_19801229	10385.0	1.0	flout
fo_13_19801229	fo_13_19801229	10401.0	1.0	flout
fo_14_19801229	fo_14_19801229	10422.0	1.0	flout
fo_15_19801229	fo_15_19801229	10444.0	1.0	flout
fo_16_19801229	fo_16_19801229	10466.0	1.0	flout
fo_17_19801229	fo_17_19801229	10486.0	1.0	flout
fo_18_19801229	fo_18_19801229	10501.0	1.0	flout
fo_19_19801229	fo_19_19801229	10506.0	1.0	flout
fo_1_19801229	fo_1_19801229	10108.0	1.0	flout
fo_20_19801229	fo_20_19801229	10499.0	1.0	flout
fo_21_19801229	fo_21_19801229	10504.0	1.0	flout
fo_22_19801229	fo_22_19801229	10516.0	1.0	flout
fo_23_19801229	fo_23_19801229	10532.0	1.0	flout
fo_24_19801229	fo_24_19801229	10550.0	1.0	flout
fo_25_19801229	fo_25_19801229	10567.0	1.0	flout
fo_26_19801229	fo_26_19801229	10584.0	1.0	flout
fo_27_19801229	fo_27_19801229	10600.0	1.0	flout
fo_28_19801229	fo_28_19801229	10615.0	1.0	flout

fo_29_19801229	fo_29_19801229	10627.0	1.0	flout
fo_2_19801229	fo_2_19801229	10162.0	1.0	flout
fo_30_19801229	fo_30_19801229	10637.0	1.0	flout
fo_31_19801229	fo_31_19801229	10643.0	1.0	flout
fo_32_19801229	fo_32_19801229	10643.0	1.0	flout
fo_33_19801229	fo_33_19801229	10637.0	1.0	flout
fo_34_19801229	fo_34_19801229	10624.0	1.0	flout
fo_35_19801229	fo_35_19801229	10607.0	1.0	flout
fo_36_19801229	fo_36_19801229	10584.0	1.0	flout
fo_37_19801229	fo_37_19801229	10552.0	1.0	flout
fo_38_19801229	fo_38_19801229	10512.0	1.0	flout
fo_39_19801229	fo_39_19801229	10512.0	1.0	flout
fo_3_19801229	fo_3_19801229	10213.0	1.0	flout
fo_4_19801229	fo_4_19801229	10262.0	1.0	flout
fo_5_19801229	fo_5_19801229	10306.0	1.0	flout
fo_6_19801229	fo_6_19801229	10343.0	1.0	flout
fo_7_19801229	fo_7_19801229	10370.0	1.0	flout
fo_8_19801229	fo_8_19801229	10382.0	1.0	flout
fo_9_19801229	fo_9_19801229	10375.0	1.0	flout
fo_hw_19801229	fo_hw_19801229	196430.0	1.0	flout
fo_tw_19801229	fo_tw_19801229	211539.0	1.0	flout

### 1.1.7 Add modpath input files, instruction files and calls

First copy over all the MODPATH-related files from the base directory identified in the `b_d` variable. We will track a single particle for forecast purposes

```
In [18]: mp_files = [f for f in os.listdir(b_d) if "mp" in f or "location" in f]
          [shutil.copy2(os.path.join(b_d,f),os.path.join(pst_helper.new_model_ws,f)) for f in mp_files]
```

```
Out[18]: ['template\\freyberg.locations',
          'template\\freyberg.mpbas',
          'template\\freyberg.mpnam',
          'template\\freyberg.mpsim',
          'template\\mp_ibound_1.ref',
          'template\\mp_ibound_2.ref',
          'template\\mp_ibound_3.ref']
```

The following `frun_post_lines` property adds statements at the end of the `forward_run.py` script. In this case, it runs MODPATH using `mp6`. We will also identify any additional temporary files that the forward run script will attempt to remove at the start of a run.

```
In [19]: #pst_helper.frun_post_lines.append("os.system('mp6 freyberg.mpsim >mp6.stdout')")
          pst_helper.frun_post_lines.append("pyemu.os_utils.run('mp6 freyberg.mpsim >mp6.stdout'")
          pst_helper.tmp_files.append("freyberg.mpenpt") # placed at top of `forward_run.py`
          pst_helper.write_forward_run()
```

Create and add instruction files and related observations for MODPATH

```
In [20]: out_file = "freyberg.mpenpt"
ins_file = out_file + ".ins"
with open(os.path.join(pst_helper.new_model_ws,ins_file),'w') as f:
    f.write("pif ~\n")
    f.write("l7 w w w !part_status! w w !part_time!\n")

In [21]: df = pst_helper.pst.add_observations(os.path.join(pst_helper.new_model_ws,ins_file),
                                             os.path.join(pst_helper.new_model_ws,out_file),
                                             pst_path=".")
```

error using inschek for instruction file .\freyberg.mpenpt.ins:run() returned non-zero observations in this instruction file will have generic values.

We also need to copy the original prsity arrays to the arr\_org dir for use in the multiplier parameterization scheme

```
In [22]: for k in range(m.nlay):
        np.savetxt(os.path.join(pst_helper.new_model_ws,"arr_org","prsity_layer_{0}.ref".format(k)),
                   np.zeros((m.nrow,m.ncol))+0.001,fmt="%15.6E")
```

### 1.1.8 Final bits and bobs

We need to set some realistic parameter bounds and account for expected (but stochastic) scenario conditions:

```
In [23]: par = pst.parameter_data # we inspected this guy earlier
# properties
tag_dict = {"hk": [0.1,10.0], "vka": [0.1,10], "strt": [0.95,1.05], "pr": [0.8,1.2]}
for t,[l,u] in tag_dict.items():
    t_pars = par.loc[par.parnme.apply(lambda x: t in x), "parnme"]
    par.loc[t_pars, "parubnd"] = u
    par.loc[t_pars, "parlbnd"] = l
```

given the combinations of multipliers, we need to set a hard upper bound on sy since it has a physical upper limit (note: separate to bounds handled explicitly by pest)

```
In [24]: arr_csv = os.path.join(pst_helper.new_model_ws, "arr_pars.csv")
df = pd.read_csv(arr_csv, index_col=0)
df.head()
```

```
Out[24]:
```

	layer	mlt_file	model_file	org_file	\
0	0	arr_mlt\hk0.dat_pp	.\hk_Layer_1.ref	arr_org\hk_Layer_1.ref	
1	0	arr_mlt\vka0.dat_pp	.\vka1.ref	arr_org\vka1.ref	
2	0	arr_mlt\ss0.dat_pp	.\ss_Layer_1.ref	arr_org\ss_Layer_1.ref	
3	0	arr_mlt\sy0.dat_pp	.\sy_Layer_1.ref	arr_org\sy_Layer_1.ref	
4	0	arr_mlt\strt0.dat_pp	.\strt_layer_1.ref	arr_org\strt_layer_1.ref	

	suffix	prefix	attr_name	tpl_file	fac_file	pp_file
--	--------	--------	-----------	----------	----------	---------



0	_pp	hk0	hk	NaN	pp_k0_general_zn.fac	hk0pp.dat
1	_pp	vka0	vka	NaN	pp_k0_general_zn.fac	vka0pp.dat
2	_pp	ss0	ss	NaN	pp_k0_general_zn.fac	ss0pp.dat
3	_pp	sy0	sy	NaN	pp_k0_general_zn.fac	sy0pp.dat
4	_pp	strt0	strt	NaN	pp_k0_general_zn.fac	strt0pp.dat

```
In [25]: sy_pr = df.model_file.apply(lambda x: "sy" in x or "pr" in x)
df.loc[:, "upper_bound"] = np.NaN
df.loc[sy_pr, "upper_bound"] = 0.4
df.to_csv(arr_csv)
```

```
In [26]: # table can also be written to a .tex file (report-ready!)
pst.write_par_summary_table(filename="none").sort_index()
```

```
Out [26]:
```

	type	transform	count	initial	value	upper bound	\
cn_hk6	cn_hk6	log	1	0	1		
cn_hk7	cn_hk7	log	1	0	1		
cn_hk8	cn_hk8	log	1	0	1		
cn_prsity6	cn_prsity6	log	1	0	0.0791812		
cn_prsity7	cn_prsity7	log	1	0	0.0791812		
cn_prsity8	cn_prsity8	log	1	0	0.0791812		
cn_rech4	cn_rech4	log	1	0	0.0413927		
cn_rech5	cn_rech5	log	1	0	0.0413927		
cn_ss6	cn_ss6	log	1	0	1		
cn_ss7	cn_ss7	log	1	0	1		
cn_ss8	cn_ss8	log	1	0	1		
cn_strt6	cn_strt6	log	1	0	0.0211893		
cn_strt7	cn_strt7	log	1	0	0.0211893		
cn_strt8	cn_strt8	log	1	0	0.0211893		
cn_sy6	cn_sy6	log	1	0	0.243038		
cn_sy7	cn_sy7	log	1	0	0.243038		
cn_sy8	cn_sy8	log	1	0	0.243038		
cn_vka6	cn_vka6	log	1	0	1		
cn_vka7	cn_vka7	log	1	0	1		
cn_vka8	cn_vka8	log	1	0	1		
drncond_k00	drncond_k00	log	10	0	1		
flow	flow	log	1	0	0.09691		
gr_hk3	gr_hk3	log	705	0	1		
gr_hk4	gr_hk4	log	705	0	1		
gr_hk5	gr_hk5	log	705	0	1		
gr_prsity3	gr_prsity3	log	705	0	0.0791812		
gr_prsity4	gr_prsity4	log	705	0	0.0791812		
gr_prsity5	gr_prsity5	log	705	0	0.0791812		
gr_rech2	gr_rech2	log	705	0	0.0413927		
gr_rech3	gr_rech3	log	705	0	0.0413927		
...	...	...	...	...	...		
gr_strt5	gr_strt5	log	705	0	0.0211893		
gr_sy3	gr_sy3	log	705	0	0.243038		

gr_sy4	gr_sy4	log	705	0	0.243038
gr_sy5	gr_sy5	log	705	0	0.243038
gr_vka3	gr_vka3	log	705	0	1
gr_vka4	gr_vka4	log	705	0	1
gr_vka5	gr_vka5	log	705	0	1
pp_hk0	pp_hk0	log	32	0	1
pp_hk1	pp_hk1	log	32	0	1
pp_hk2	pp_hk2	log	32	0	1
pp_prsity0	pp_prsity0	log	32	0	0.0791812
pp_prsity1	pp_prsity1	log	32	0	0.0791812
pp_prsity2	pp_prsity2	log	32	0	0.0791812
pp_rech0	pp_rech0	log	32	0	0.0413927
pp_rech1	pp_rech1	log	32	0	0.0413927
pp_ss0	pp_ss0	log	32	0	1
pp_ss1	pp_ss1	log	32	0	1
pp_ss2	pp_ss2	log	32	0	1
pp_strt0	pp_strt0	log	32	0	0.0211893
pp_strt1	pp_strt1	log	32	0	0.0211893
pp_strt2	pp_strt2	log	32	0	0.0211893
pp_sy0	pp_sy0	log	32	0	0.243038
pp_sy1	pp_sy1	log	32	0	0.243038
pp_sy2	pp_sy2	log	32	0	0.243038
pp_vka0	pp_vka0	log	32	0	1
pp_vka1	pp_vka1	log	32	0	1
pp_vka2	pp_vka2	log	32	0	1
strk	strk	log	40	0	2
welflux	welflux	log	2	0	1
welflux_k02	welflux_k02	log	6	0	1

lower bound standard deviation

cn_hk6	-1	0.5
cn_hk7	-1	0.5
cn_hk8	-1	0.5
cn_prsity6	-0.09691	0.0440228
cn_prsity7	-0.09691	0.0440228
cn_prsity8	-0.09691	0.0440228
cn_rech4	-0.0457575	0.0217875
cn_rech5	-0.0457575	0.0217875
cn_ss6	-1	0.5
cn_ss7	-1	0.5
cn_ss8	-1	0.5
cn_strt6	-0.0222764	0.0108664
cn_strt7	-0.0222764	0.0108664
cn_strt8	-0.0222764	0.0108664
cn_sy6	-0.60206	0.211275
cn_sy7	-0.60206	0.211275
cn_sy8	-0.60206	0.211275
cn_vka6	-1	0.5

cn_vka7	-1	0.5
cn_vka8	-1	0.5
drncond_k00	-1	0.5
flow	-0.124939	0.0554622
gr_hk3	-1	0.5
gr_hk4	-1	0.5
gr_hk5	-1	0.5
gr_prsity3	-0.09691	0.0440228
gr_prsity4	-0.09691	0.0440228
gr_prsity5	-0.09691	0.0440228
gr_rech2	-0.0457575	0.0217875
gr_rech3	-0.0457575	0.0217875
...	...	...
gr_strt5	-0.0222764	0.0108664
gr_sy3	-0.60206	0.211275
gr_sy4	-0.60206	0.211275
gr_sy5	-0.60206	0.211275
gr_vka3	-1	0.5
gr_vka4	-1	0.5
gr_vka5	-1	0.5
pp_hk0	-1	0.5
pp_hk1	-1	0.5
pp_hk2	-1	0.5
pp_prsity0	-0.09691	0.0440228
pp_prsity1	-0.09691	0.0440228
pp_prsity2	-0.09691	0.0440228
pp_rech0	-0.0457575	0.0217875
pp_rech1	-0.0457575	0.0217875
pp_ss0	-1	0.5
pp_ss1	-1	0.5
pp_ss2	-1	0.5
pp_strt0	-0.0222764	0.0108664
pp_strt1	-0.0222764	0.0108664
pp_strt2	-0.0222764	0.0108664
pp_sy0	-0.60206	0.211275
pp_sy1	-0.60206	0.211275
pp_sy2	-0.60206	0.211275
pp_vka0	-1	0.5
pp_vka1	-1	0.5
pp_vka2	-1	0.5
strk	-2	1
welflux	-1	0.5
welflux_k02	-1	0.5

[65 rows x 7 columns]

In [27]: pst.write\_obs\_summary\_table(filename="none").head()

Out[27]:

group	value	non-zero weight	zero weight	\
-------	-------	-----------------	-------------	---

flaqx	flaqx	-977.239 to 40.562	84	0
flout	flout	10054 to 226396	84	0
flx_constan	flx_constan	0	2	0
flx_drains	flx_drains	-723.325 to -548.613	2	0
flx_in-out	flx_in-out	0.012695 to 0.467	2	0

	weight	standard deviation	percent error
flaqx	1	1	0.102329 to 833.333
flout	1	1	0.000441704 to 0.00994629
flx_constan	1	1	NA
flx_drains	1	1	0.13825 to 0.182278
flx_in-out	1	1	214.133 to 7877.12

Let's run the process once (noptmax=0) to make sure its all plumbed up. Pro-tip: you can use any of the pestpp-### binaries/executables to run noptmax=0

```
In [28]: pst.control_data.noptmax = 0
         pst.write(os.path.join(pst_helper.new_model_ws, "freyberg.pst"))
         pyemu.os_utils.run("pestpp-ies freyberg.pst", cwd=pst_helper.new_model_ws)
```

```
noptmax:0, npar_adj:14819, nnz_obs:4436
```

Now let's take it up a notch. We need to generate the prior parameter covariance matrix and stochastic realizations. We will use the geostatistical covariance information in the pst\_helper instance for this:

```
In [29]: if pst_helper.pst.npar < 15000:
         cov = pst_helper.build_prior(fmt="coo", filename=os.path.join(pst_helper.new_model_ws, "cov.coo"))
         cov = np.ma.masked_where(cov.x==0, cov.x)
         try:
             fig = plt.figure(figsize=(10,10))
             ax = plt.subplot(111)
             ax.imshow(cov)
             plt.show()
         except:
             pass
```

```
2019-07-17 01:01:40.901302 starting: building prior covariance matrix
```

```
2019-07-17 01:01:41.060434 WARNING: geospatial prior not implemented for SFR pars
```

```
C:\Users\knowling\AppData\Local\Continuum\anaconda3\lib\site-packages\pandas\core\indexing.py:1111:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
```

```
See the caveats in the documentation: http://pandas.pydata.org/pandas-docs/stable/indexing.html
```

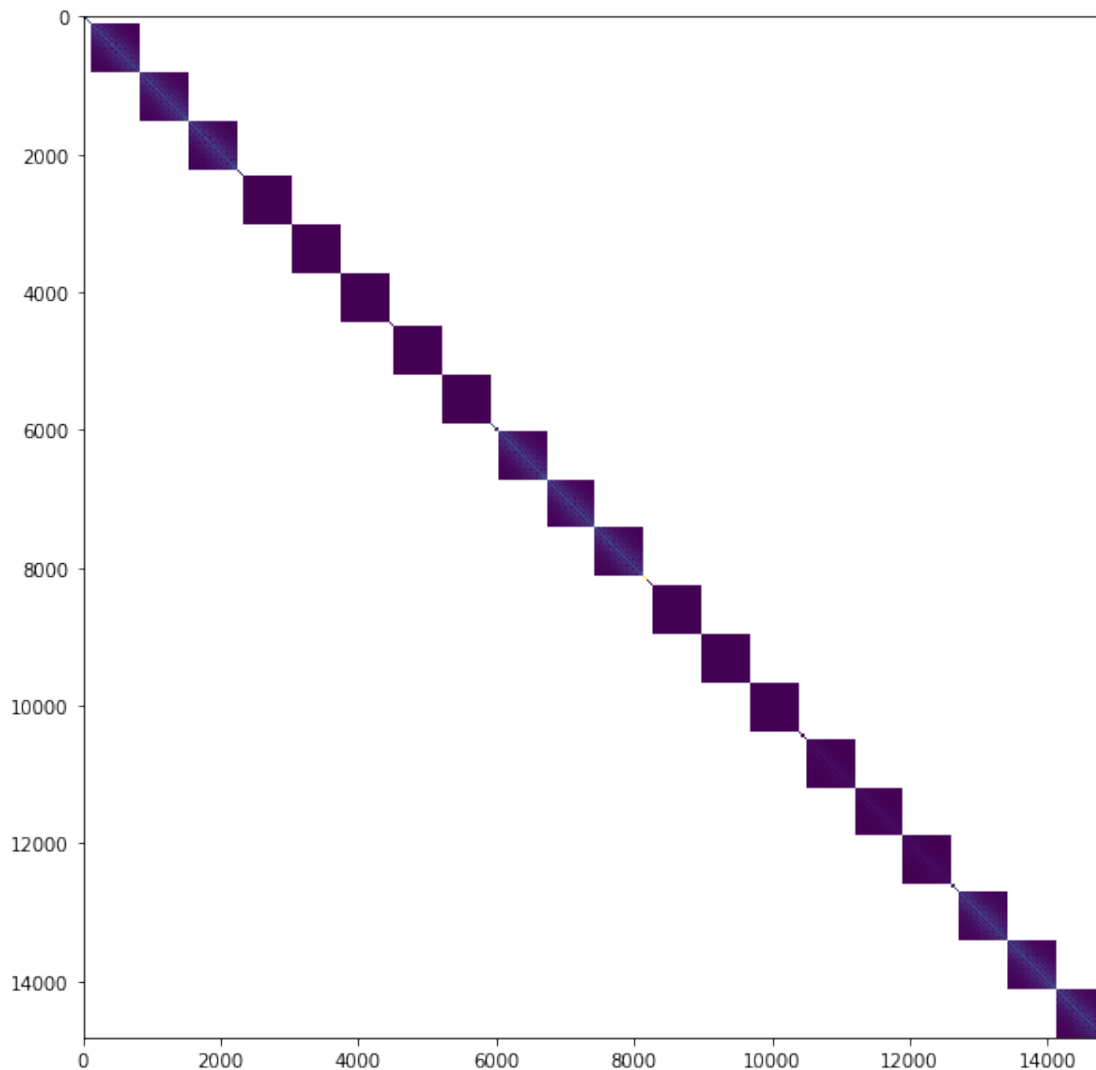
```
self.obj[key] = _infer_fill_value(value)
```

```
C:\Users\knowling\AppData\Local\Continuum\anaconda3\lib\site-packages\pandas\core\indexing.py:1111:
```

A value is trying to be set on a copy of a slice from a DataFrame.  
Try using `.loc[row_indexer,col_indexer] = value` instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html>  
`self.obj[item] = s`

2019-07-17 01:01:51.026781 saving prior covariance matrix to file template\prior\_cov.jcb  
2019-07-17 01:01:57.300902 finished: building prior covariance matrix took: 0:00:16.399600



**1.1.9 now we can make a draw from the prior parameter covariance matrix to form a prior parameter ensemble**

In [30]: `pe = pst_helper.draw(500)`

2019-07-17 01:02:32.431322 starting: drawing realizations  
building diagonal cov  
processing name:grid\_geostruct,nugget:0.0,structures:  
name:var1,contribution:1.0,a:2500.0,anisotropy:1.0,bearing:0.0

working on pargroups ['gr\_hk3']  
build cov matrix  
done  
getting diag var cov 705  
scaling full cov by diag var cov  
making full cov draws with home-grown goodness  
working on pargroups ['gr\_vka3']  
build cov matrix  
done  
getting diag var cov 705  
scaling full cov by diag var cov  
making full cov draws with home-grown goodness  
working on pargroups ['gr\_ss3']  
build cov matrix  
done  
getting diag var cov 705  
scaling full cov by diag var cov  
making full cov draws with home-grown goodness  
working on pargroups ['gr\_sy3']  
build cov matrix  
done  
getting diag var cov 705  
scaling full cov by diag var cov  
making full cov draws with home-grown goodness  
working on pargroups ['gr\_strt3']  
build cov matrix  
done  
getting diag var cov 705  
scaling full cov by diag var cov  
making full cov draws with home-grown goodness  
working on pargroups ['gr\_prsity3']  
build cov matrix  
done  
getting diag var cov 705  
scaling full cov by diag var cov  
making full cov draws with home-grown goodness  
working on pargroups ['gr\_hk4']  
build cov matrix  
done  
getting diag var cov 705  
scaling full cov by diag var cov  
making full cov draws with home-grown goodness  
working on pargroups ['gr\_vka4']

```

build cov matrix
done
getting diag var cov 705
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['gr_ss4']
build cov matrix
done
getting diag var cov 705
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['gr_sy4']
build cov matrix
done
getting diag var cov 705
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['gr_strt4']
build cov matrix
done
getting diag var cov 705
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['gr_prsity4']
build cov matrix
done
getting diag var cov 705
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['gr_hk5']
build cov matrix
done
getting diag var cov 705
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['gr_vka5']
build cov matrix
done
getting diag var cov 705
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['gr_ss5']
build cov matrix
done
getting diag var cov 705
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['gr_sy5']

```

```

build cov matrix
done
getting diag var cov 705
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['gr_strt5']
build cov matrix
done
getting diag var cov 705
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['gr_prsity5']
build cov matrix
done
getting diag var cov 705
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['gr_rech2']
build cov matrix
done
getting diag var cov 705
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['gr_rech3']
build cov matrix
done
getting diag var cov 705
scaling full cov by diag var cov
making full cov draws with home-grown goodness
processing name:pp_geostruct,nugget:0.0,structures:
name:var1,contribution:1.0,a:1000.0,anisotropy:1.0,bearing:0.0

working on pargroups ['pp_hk0']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_prsity0']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_rech0']
build cov matrix
done
getting diag var cov 32

```



```

scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_rech1']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_ss0']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_strt0']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_sy0']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_vka0']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_hk1']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_prsity1']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_ss1']
build cov matrix
done
getting diag var cov 32

```

```

scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_strt1']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_sy1']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_vka1']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_hk2']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_prsity2']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_ss2']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_strt2']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_sy2']
build cov matrix
done
getting diag var cov 32

```

```

scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['pp_vka2']
build cov matrix
done
getting diag var cov 32
scaling full cov by diag var cov
making full cov draws with home-grown goodness
processing name:spatial_list_geostruc,nugget:0.0,structures:
name:var1,contribution:1.0,a:2500.0,anisotropy:1.0,bearing:0.0

```

```

working on pargroups ['welflux_k02']
build cov matrix
done
getting diag var cov 6
scaling full cov by diag var cov
making full cov draws with home-grown goodness
working on pargroups ['drncond_k00']

```

```

C:\Users\knowling\AppData\Local\Continuum\anaconda3\lib\site-packages\pandas\core\indexing.py:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

```

```

See the caveats in the documentation: http://pandas.pydata.org/pandas-docs/stable/indexing.htm
self.obj[key] = _infer_fill_value(value)
C:\Users\knowling\AppData\Local\Continuum\anaconda3\lib\site-packages\pandas\core\indexing.py:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

```

```

See the caveats in the documentation: http://pandas.pydata.org/pandas-docs/stable/indexing.htm
self.obj[item] = s

```

```

build cov matrix
done
getting diag var cov 10
scaling full cov by diag var cov
making full cov draws with home-grown goodness
processing name:temporal_list_geostruc,nugget:0.0,structures:
name:var1,contribution:1.0,a:180.0,anisotropy:1.0,bearing:0.0

```

```

working on pargroups ['welflux']
build cov matrix
done
getting diag var cov 2
scaling full cov by diag var cov
making full cov draws with home-grown goodness

```

adding remaining parameters to diagonal

2019-07-17 01:02:48.420265 finished: drawing realizations took: 0:00:15.988943

You can see that parameters are treated in parameter group (pargp) blocks for this ensemble generation.

Always a good idea to inspect the parameter ensemble for reasonableness! Can do via slicing and dicing...

```
In [31]: pe.iloc[-10:-5,:10]
```

```
Out [31]:
```

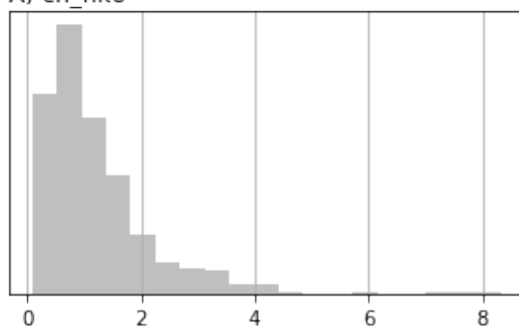
	hk3000000	hk3000001	hk3000002	hk3000003	hk3000004	hk3000005	\
490	1.206221	1.968932	2.698087	2.027151	2.443490	1.734673	
491	1.255867	2.040476	1.549545	1.479577	2.519808	2.998529	
492	0.697824	0.738241	1.508115	1.697770	1.847771	1.757112	
493	0.449850	0.510057	0.475973	0.519650	0.802379	0.735356	
494	1.796640	1.383561	1.716070	1.584088	1.600322	1.803785	
	hk3000006	hk3000007	hk3000008	hk3000009			
490	1.074304	0.615059	0.625267	0.721397			
491	3.821978	2.996158	3.128706	3.265180			
492	1.881248	1.798628	1.465892	1.953400			
493	0.455645	0.274035	0.377106	0.263564			
494	1.196490	1.519277	1.115009	2.334526			

Let's plot one parameter:

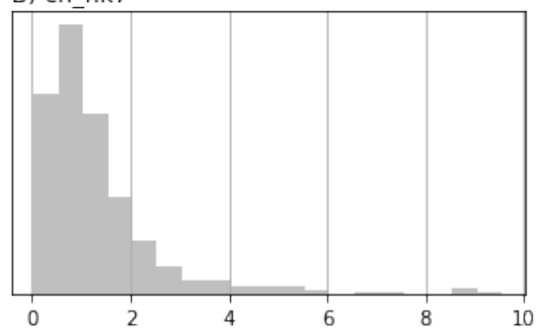
```
In [32]: par = pst_helper.pst.parameter_data
          pyemu.plot_utils.ensemble_helper(pe,plot_cols=par.groupby("pargp").groups,bins=20)
          plt.show()
```

<matplotlib.figure.Figure at 0x280f01da2b0>

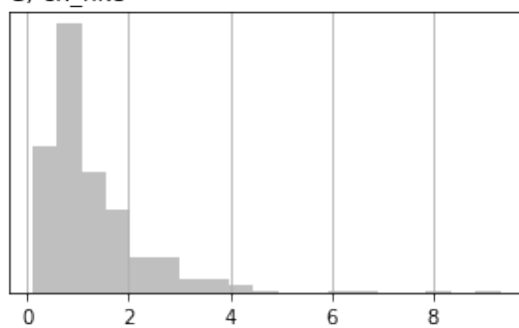
A) cn\_hk6



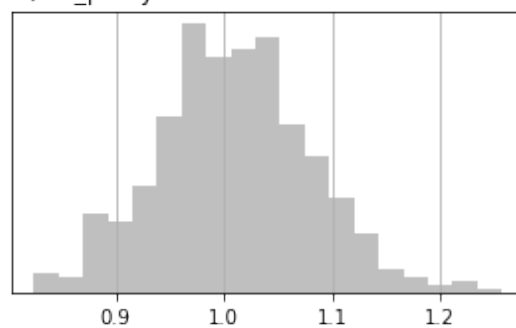
B) cn\_hk7



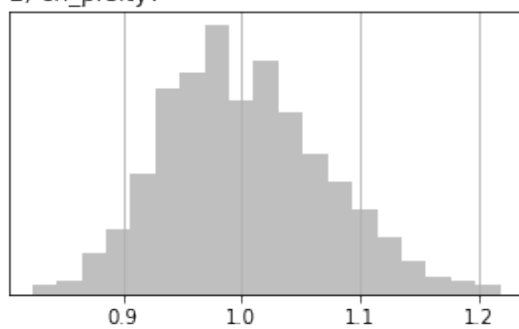
C) cn\_hk8



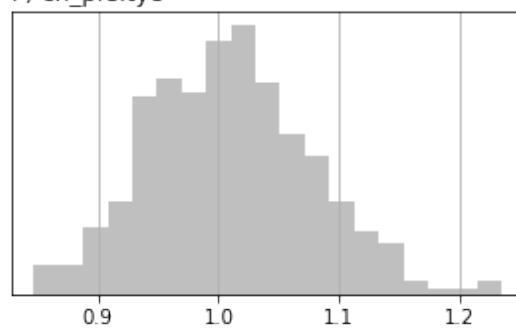
D) cn\_prsity6



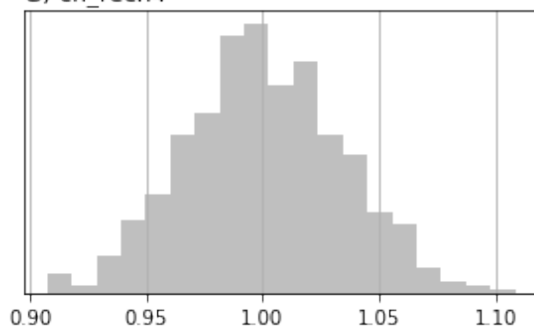
E) cn\_prsity7



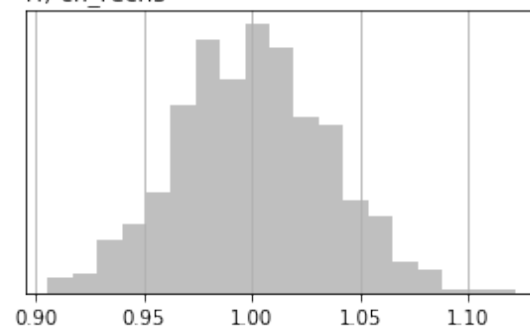
F) cn\_prsity8



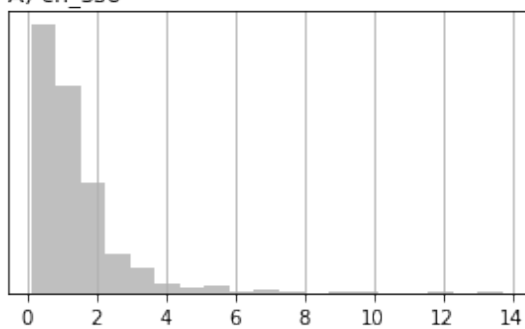
G) cn\_rech4



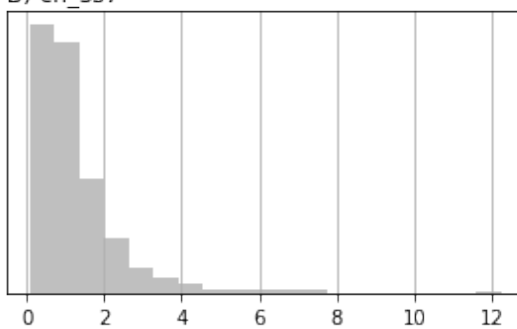
H) cn\_rech5



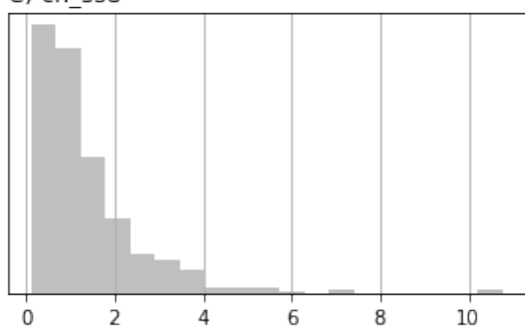
A) cn\_ss6



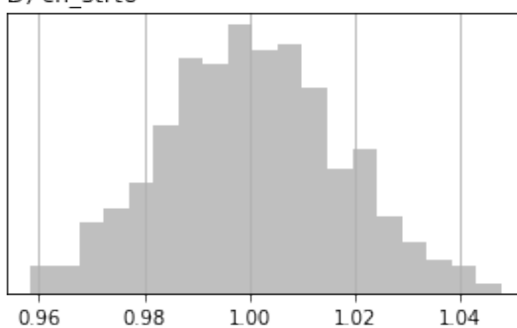
B) cn\_ss7



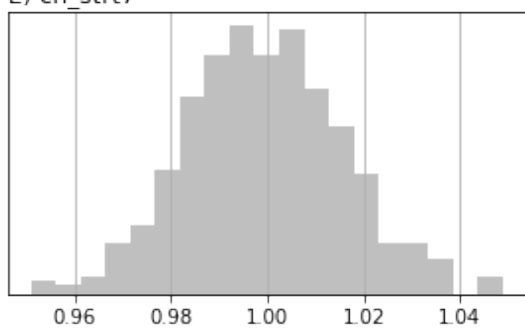
C) cn\_ss8



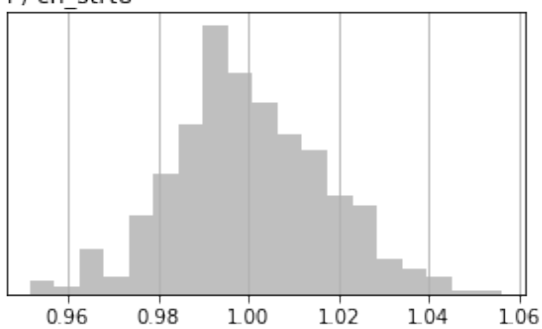
D) cn\_strt6



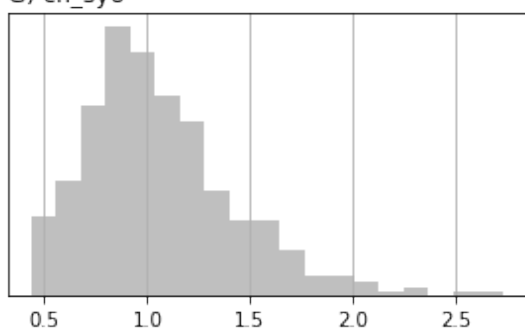
E) cn\_strt7



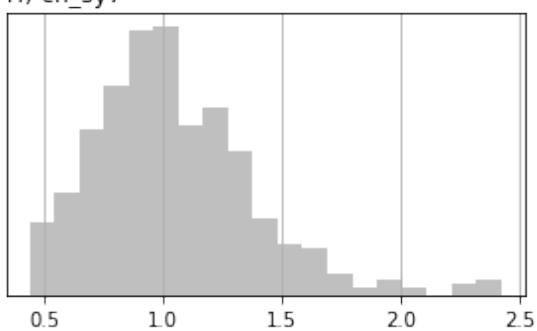
F) cn\_strt8



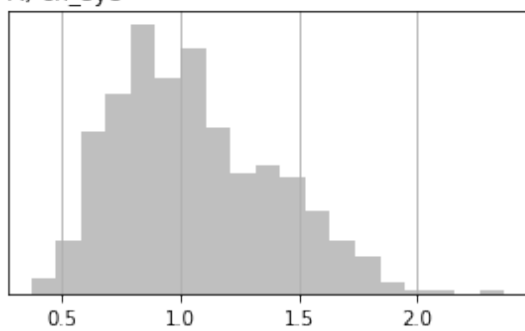
G) cn\_sy6



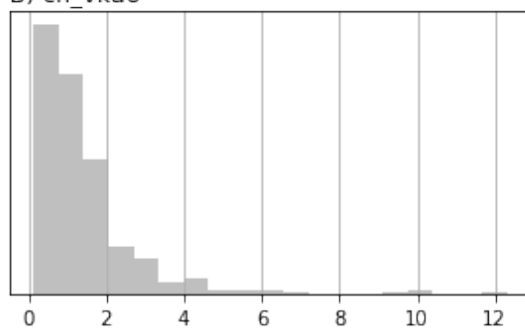
H) cn\_sy7



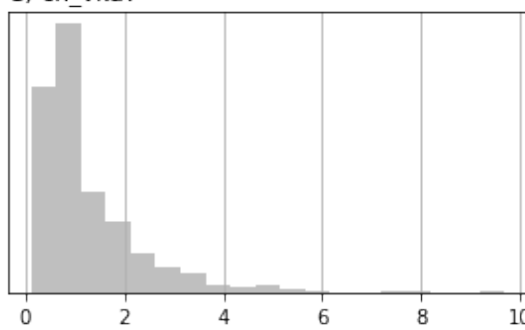
A) cn\_sy8



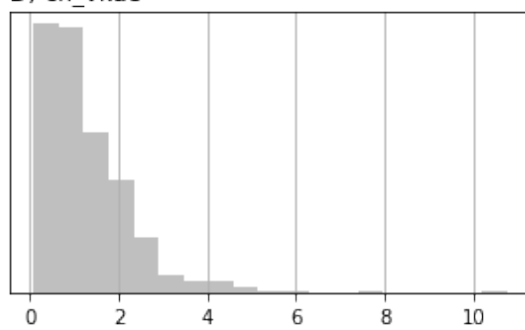
B) cn\_vka6



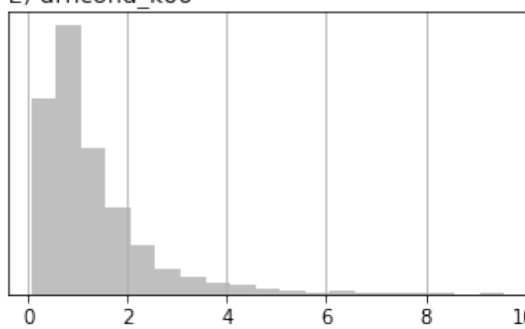
C) cn\_vka7



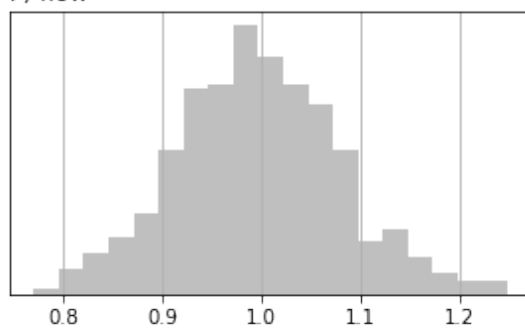
D) cn\_vka8



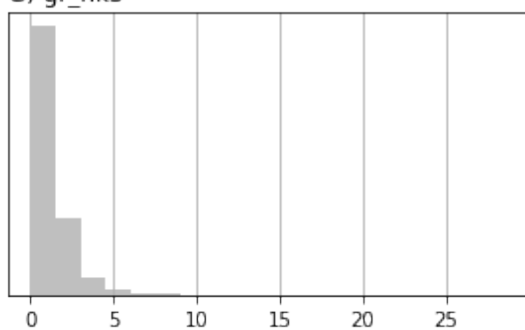
E) drncond\_k00



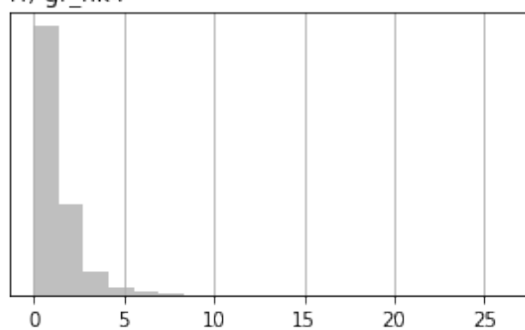
F) flow



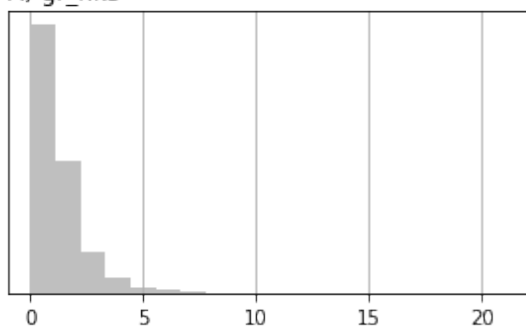
G) gr\_hk3



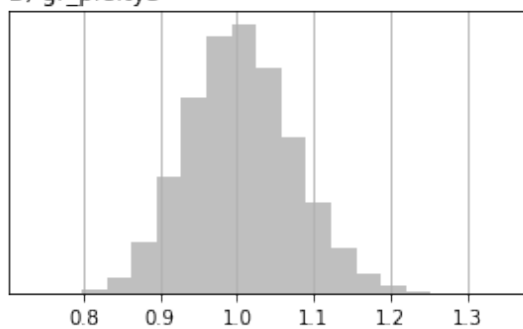
H) gr\_hk4



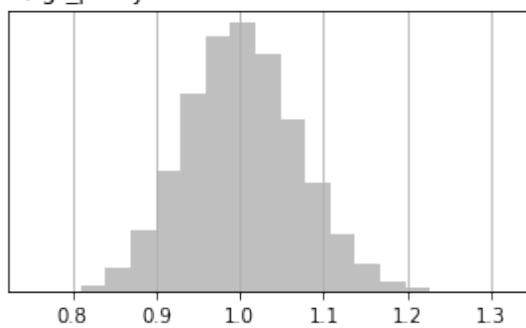
A) gr\_hk5



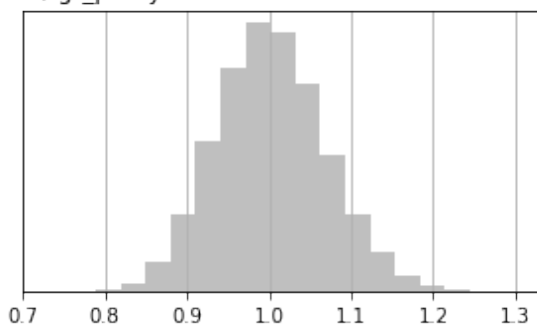
B) gr\_prsity3



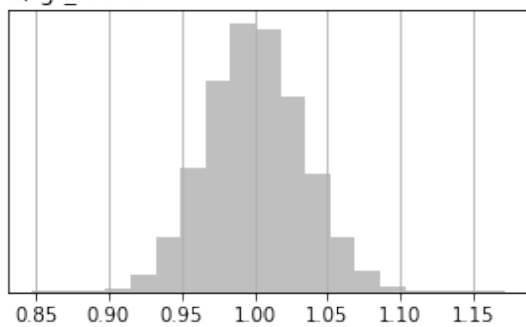
C) gr\_prsity4



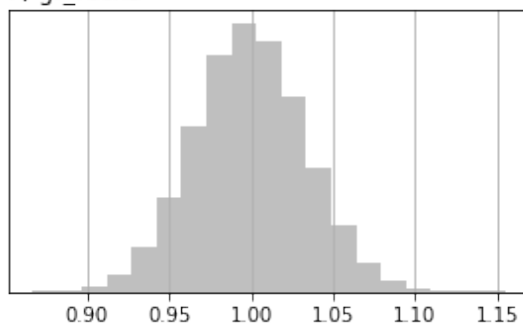
D) gr\_prsity5



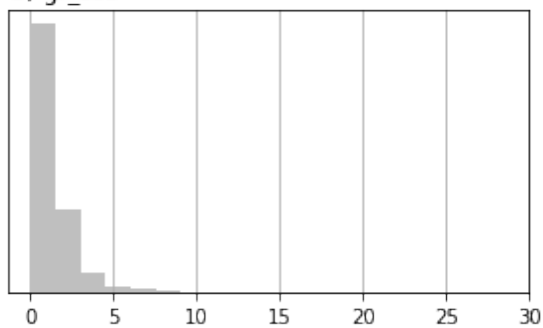
E) gr\_rech2



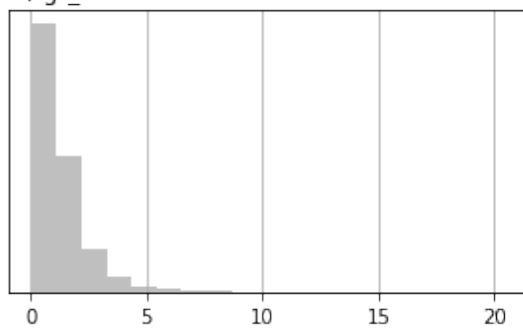
F) gr\_rech3



G) gr\_ss3

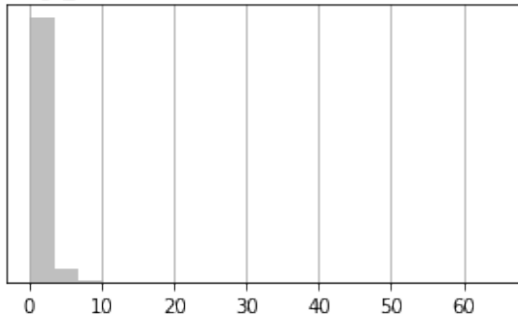


H) gr\_ss4

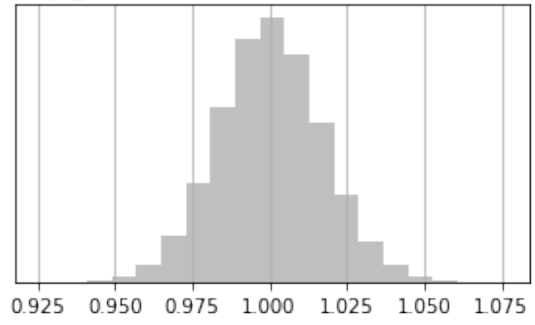




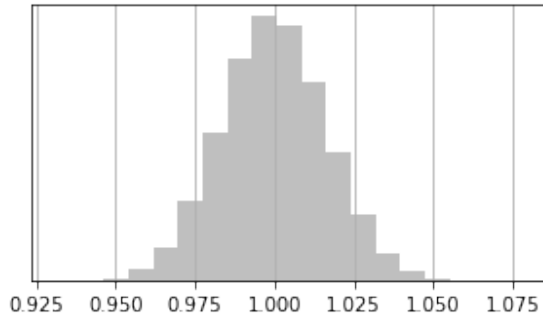
A) gr\_ss5



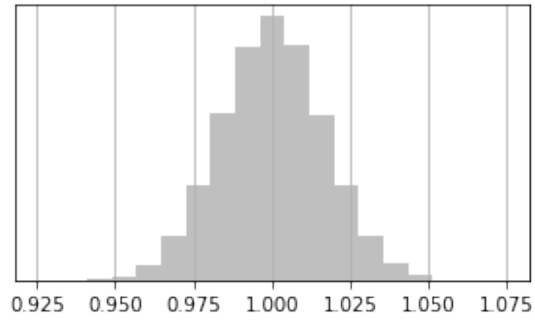
B) gr\_strt3



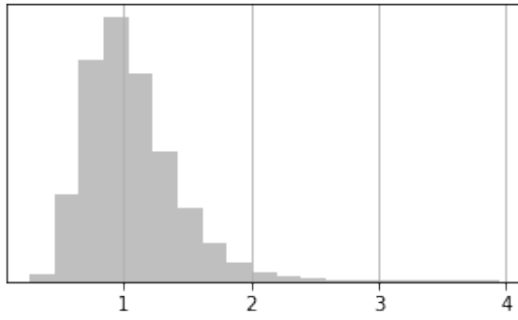
C) gr\_strt4



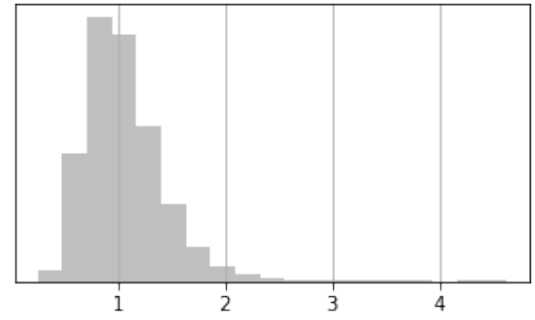
D) gr\_strt5



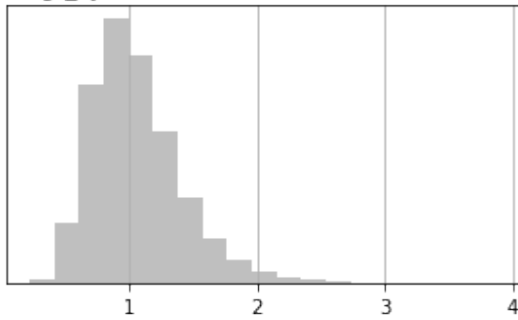
E) gr\_sy3



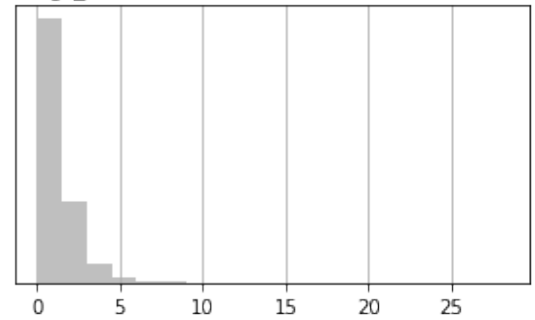
F) gr\_sy4



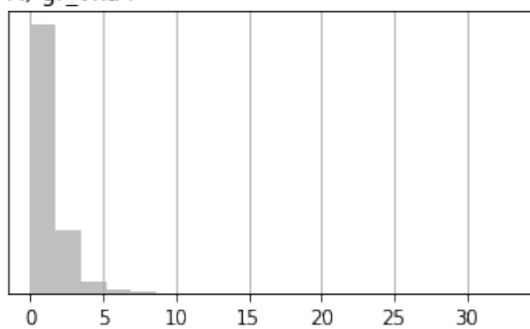
G) gr\_sy5



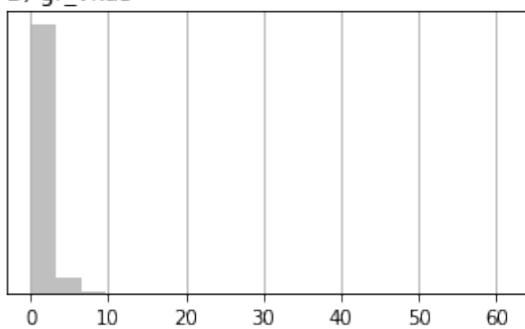
H) gr\_vka3



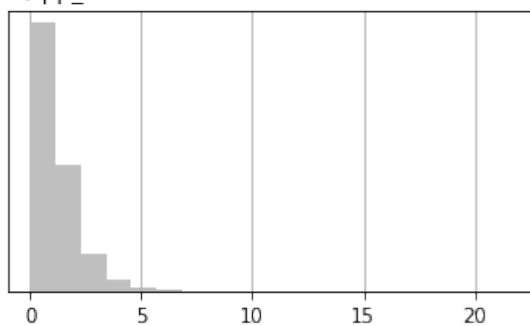
A) gr\_vka4



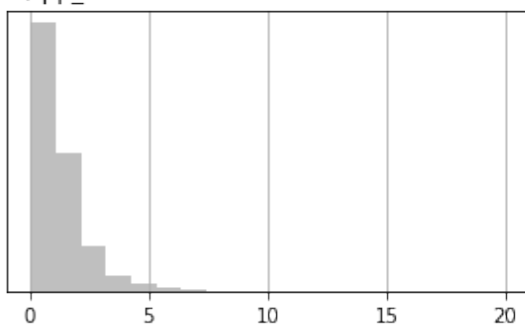
B) gr\_vka5



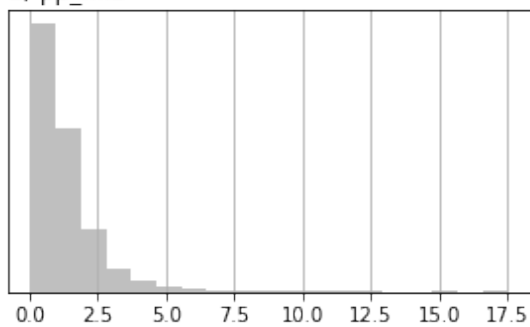
C) pp\_hk0



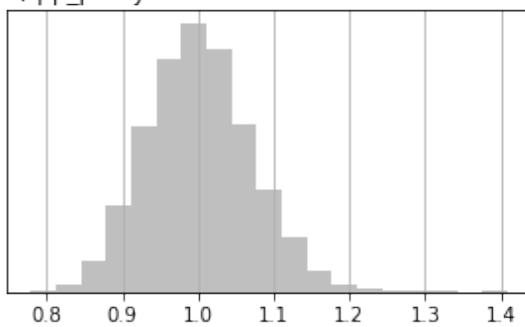
D) pp\_hk1



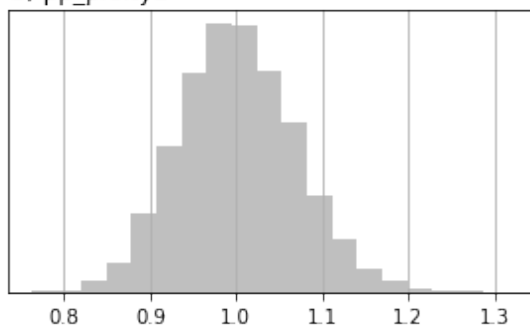
E) pp\_hk2



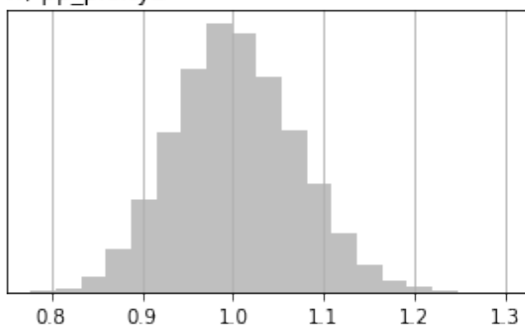
F) pp\_prsity0



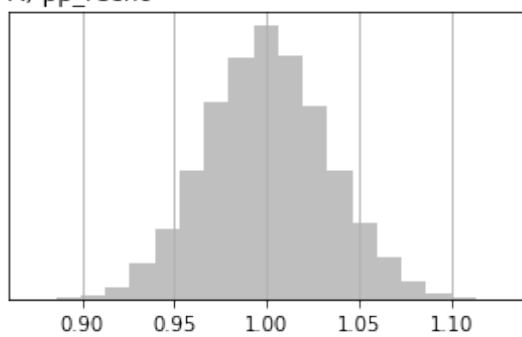
G) pp\_prsity1



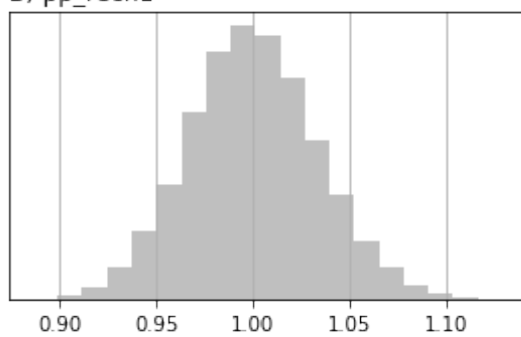
H) pp\_prsity2



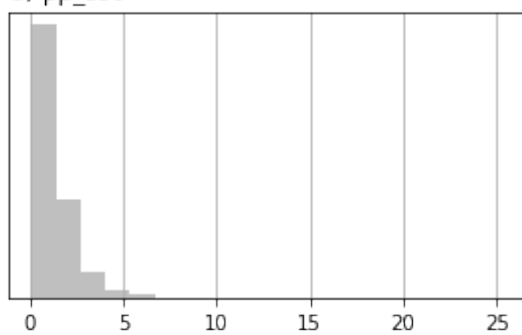
A) pp\_rech0



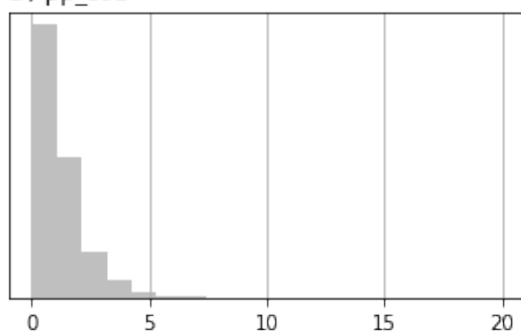
B) pp\_rech1



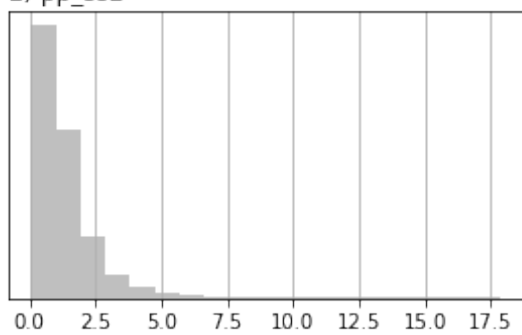
C) pp\_ss0



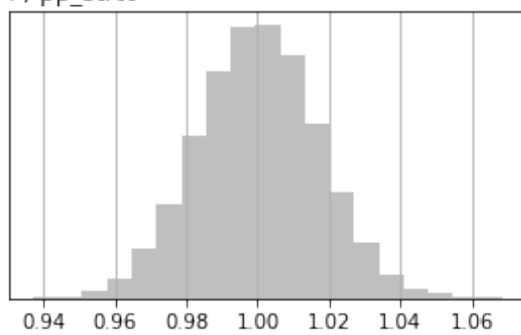
D) pp\_ss1



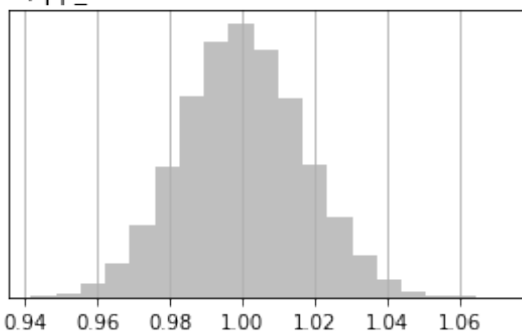
E) pp\_ss2



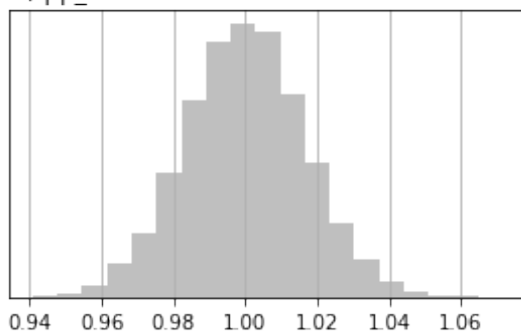
F) pp\_strt0



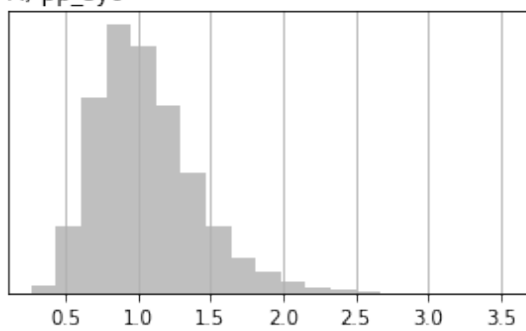
G) pp\_strt1



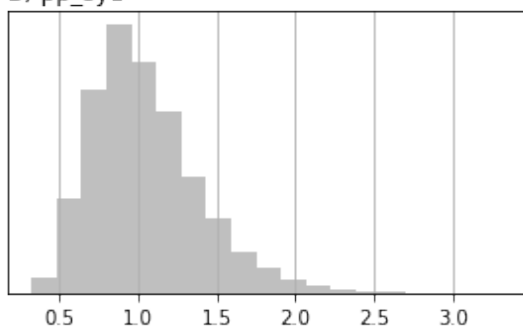
H) pp\_strt2



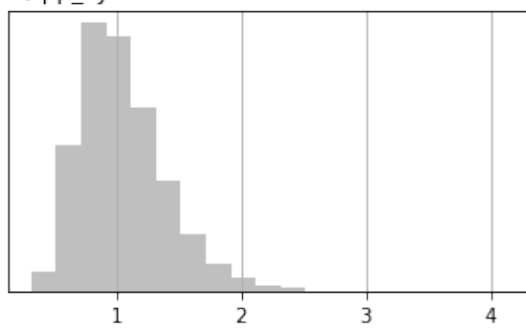
A) pp\_sy0



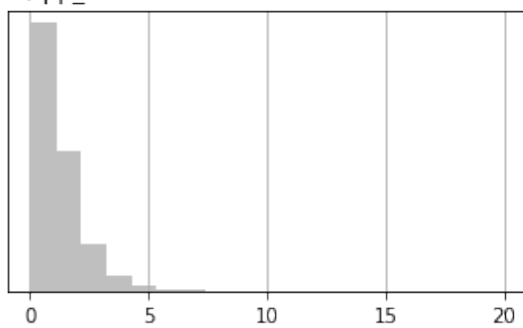
B) pp\_sy1



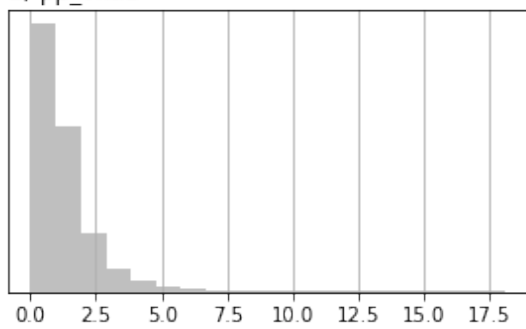
C) pp\_sy2



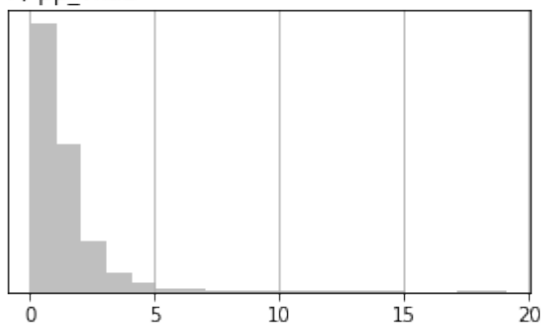
D) pp\_vka0



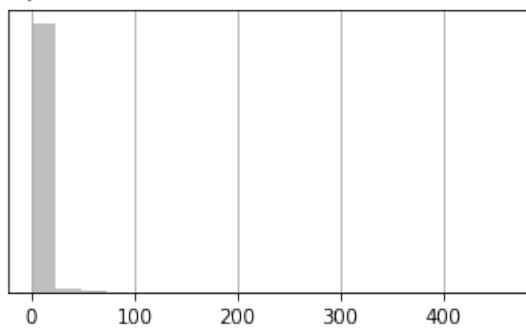
E) pp\_vka1



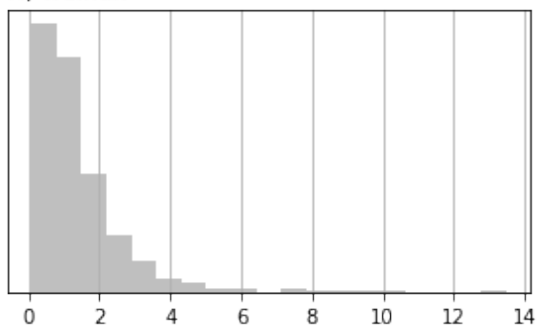
F) pp\_vka2

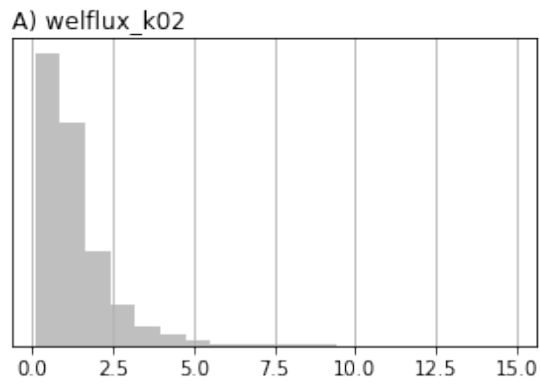


G) strk



H) welflux





Thoughts? Do these look reasonable? We see log-normal distributions for log-transformed parameters, e.g.,  $h_k$ ... looking good!

Now we need to enforce parameter bounds and save this ensemble for later

```
In [33]: pe.enforce() # always a good idea!
```

```
pe.to_binary(os.path.join(pst_helper.new_model_ws, "prior.jcb"))
```

### 1.1.10 set weights for "observations" and identify forecasts

The next major task is to set the weights on the observations. So far, in the `pst_helper` process, we simply identified what outputs from the model we want to "observe". We now use a pre-cooked csv file to set nonzero weights only for GW level observation locations used in the original Freyberg model. We will also use the SFR flow out of the last reach (fo in the last row in 19791230)

```
In [34]: obs_locs = pd.read_csv(os.path.join("../", "base_model_files", "obs_loc.csv"))
         #build obs names that correspond to the obsnme values in the control file
         obs_locs.loc[:, "obsnme"] = obs_locs.apply(lambda x: "hds_00_{0:03d}_{1:03d}_000".format(x["row"], x["col"]), axis=1)
         obs_locs
```

```
Out [34]:
```

	row	col	obsnme
0	3	16	hds_00_002_015_000
1	3	10	hds_00_002_009_000
2	4	9	hds_00_003_008_000
3	10	2	hds_00_009_001_000
4	14	11	hds_00_013_010_000
5	16	17	hds_00_015_016_000
6	22	11	hds_00_021_010_000
7	23	16	hds_00_022_015_000
8	25	5	hds_00_024_004_000
9	27	7	hds_00_026_006_000
10	30	16	hds_00_029_015_000
11	34	8	hds_00_033_007_000
12	35	11	hds_00_034_010_000

Set all weights to zero first, then turn on the weights at only a few locations. These nonzero obs will be given meaningful weights in the prior monte carlo exercise

```
In [35]: obs = pst.observation_data
         obs.loc[:, "weight"] = 0.0
         obs.loc[obs_locs.obsnme, "weight"] = 1.0
         obs.loc[obs_locs.obsnme, "obgnme"] = "calhead"
         fo_obs = "fo_{0}_19791230".format(pst_helper.m.nrow-1)
         obs.loc[fo_obs, "weight"] = 1.0
         obs.loc[fo_obs, "obgnme"] = "calflux"
         pst.nnz_obs_names
```

```
Out [35]: ['fo_39_19791230',
          'hds_00_002_009_000',
          'hds_00_002_015_000',
          'hds_00_003_008_000',
          'hds_00_009_001_000',
          'hds_00_013_010_000',
          'hds_00_015_016_000',
          'hds_00_021_010_000',
```

```
'hds_00_022_015_000',
'hds_00_024_004_000',
'hds_00_026_006_000',
'hds_00_029_015_000',
'hds_00_033_007_000',
'hds_00_034_010_000']
```

Now we will define which model outputs are going to be treated as "forecasts"

```
In [36]: swgw_forecasts = obs.loc[obs.obsnme.apply(lambda x: "fa" in x and ("hw" in x or "tw" :
hds_fore_name = "hds_00_{0:03d}_{1:03d}".format(int(pst_helper.m.nrow/3),int(pst_help
hds_forecasts = obs.loc[obs.obsnme.apply(lambda x: hds_fore_name in x),"obsnme"].tol
forecasts = swgw_forecasts
forecasts.extend(hds_forecasts)
forecasts.append("part_time")
forecasts.append("part_status")
pst_helper.pst.pestpp_options["forecasts"] = forecasts
forecasts
```

```
Out[36]: ['fa_hw_19791230',
'fa_hw_19801229',
'fa_tw_19791230',
'fa_tw_19801229',
'hds_00_013_002_000',
'hds_00_013_002_001',
'part_time',
'part_status']
```

After all these changes to the pst object, we need to re-write the pcf!

```
In [37]: pst.write(os.path.join(pst_helper.new_model_ws,"freyberg.pst"))
```

```
noptmax:0, npar_adj:14819, nnz_obs:14
```

Run one last time. phi should be near zero since we haven't change the parval1 values for historic stress period and only the 13 gw level obs have nonzero weights

```
In [38]: pyemu.os_utils.run("pestpp-ies.exe freyberg.pst", cwd=pst_helper.new_model_ws)
pst = pyemu.Pst(os.path.join(pst_helper.new_model_ws,"freyberg.pst"))
pst.phi
```

```
Out[38]: 9.456182577320024e-19
```

```
In [39]: lst = flopy.utils.MfListBudget(os.path.join("template","freyberg.list"))
df = lst.get_dataframes(diff=True)[0]
df.plot(kind="bar",figsize=(10,10), grid=True)
plt.show()
```

