pestpp-opt

May 2, 2019

1 Run PESTPP-OPT

cn_strt7

cn_strt8

In this notebook we will setup and solve a mgmt optimization problem around how much groundwater can be pumped while maintaining sw-gw exchange

```
In [1]: import os
    import shutil
    import numpy as np
    import pandas as pd
    import matplotlib.pyplot as plt
    import flopy
    import pyemu
```

flopy is installed in /Users/jeremyw/Dev/gw1876/activities_2day_mfm/notebooks/flopy

```
In [2]: t_d = "template"
        m_d = "master_opt"
In [3]: pst = pyemu.Pst(os.path.join(t_d, "freyberg.pst"))
        pst.write_par_summary_table(filename="none").sort_index()
Out [3]:
                             type transform count
                                                         initial value
        cn hk6
                           cn hk6
                                                  1
                                                                      0
                                        log
                                                                      0
        cn_hk7
                           cn_hk7
                                        log
                                                  1
                                                  1
                                                                      0
        cn_hk8
                           cn_hk8
                                        log
        cn_prsity6
                      cn_prsity6
                                                                      0
                                        log
        cn_prsity7
                      cn_prsity7
                                        log
                                                  1
                                                                      0
                                                                      0
        cn_prsity8
                       cn_prsity8
                                        log
                                                  1
                                                                      0
        cn_rech4
                        cn_rech4
                                        log
                                                  1
                                                              -0.39794
        cn_rech5
                        cn_rech5
                                        log
                                                  1
                                                                      0
                                        log
                                                  1
        cn_ss6
                           cn_ss6
                                                  1
                                                                      0
        cn_ss7
                           cn_ss7
                                        log
                          cn_ss8
                                        log
                                                  1
                                                                      0
        cn_ss8
                                                                      0
        cn strt6
                        cn_strt6
                                        log
                                                  1
```

cn_strt7

cn_strt8

log

log

1

1

0

0

cn_sy6	cn_sy6	log	1	0
cn_sy7	cn_sy7	log	1	0
cn_sy8	cn_sy8	log	1	0
cn_vka6	cn_vka6	log	1	0
cn_vka7	cn_vka7	log	1	0
cn_vka8	cn_vka8	log	1	0
drncond_k00	drncond_k00	log	10	0
flow	flow	log	1	0
gr_hk3	gr_hk3	log	705	0
gr_hk4	gr_hk4	log	705	0
gr_hk5	gr_hk5	log	705	0
gr_prsity3	gr_prsity3	log	705	0
gr_prsity4	gr_prsity4	log	705	0
gr_prsity5	gr_prsity5	log	705	0
gr_rech2	gr_rech2	log	705	0
gr_rech3	gr_rech3	log	705	0
				• • •
gr_strt5	gr_strt5	log	705	0
gr_sy3	gr_sy3	log	705	0
gr_sy4	gr_sy4	log	705	0
gr_sy5	gr_sy5	log	705	0
gr_vka3	gr_vka3	log	705	0
gr_vka4	gr_vka4	log	705	0
gr_vka5	gr_vka5	log	705	0
pp_hk0	pp_hk0	log	32	0
pp_hk1	pp_hk1	log	32	0
pp_hk2	pp_hk2	log	32	0
pp_prsity0	pp_prsity0	log	32	0
pp_prsity1	pp_prsity1	log	32	0
pp_prsity2	pp_prsity2	log	32	0
pp_rech0	pp_rech0	log	32	0
pp_rech1	pp_rech1	log	32	0
pp_ss0	pp_ss0	log	32	0
pp_ss1	pp_ss1	log	32	0
pp_ss2	pp_ss2	log	32	0
pp_strt0	pp_strt0	log	32	0
pp_strt1	pp_strt1	log	32	0
pp_strt2	pp_strt2	log	32	0
pp_sy0	pp_sy0	log	32	0
pp_sy1	pp_sy1	log	32	0
pp_sy2	pp_sy2	log	32	0
pp_vka0	pp_vka0	log	32	0
pp_vka1	pp_vka1	log	32	0
pp_vka2	pp_vka2	log	32	0
strk	strk	log	40	0
welflux	welflux	log	2	0 to 0.176091
welflux_k02	welflux_k02	log	6	0
		6	J	v

	upper bound	lower bound	standard deviation
cn_hk6	1	-1	0.5
cn_hk7	1	-1	0.5
cn_hk8	1	-1	0.5
cn_prsity6	0	-1	0.25
cn_prsity7	0	-1	0.25
cn_prsity8	0	-1	0.25
cn_rech4	0.0791812	-0.09691	0.0440228
cn_rech5	-0.09691	-1	0.225772
cn_ss6	1	-1	0.5
cn_ss7	1	-1	0.5
cn_ss8	1	-1	0.5
cn_strt6	0.0211893	-0.0222764	0.0108664
cn_strt7	0.0211893	-0.0222764	0.0108664
cn_strt8	0.0211893	-0.0222764	0.0108664
cn_sy6	0.243038	-0.60206	0.211275
cn_sy7	0.243038	-0.60206	0.211275
cn_sy8	0.243038	-0.60206	0.211275
cn_vka6	1	-1	0.5
cn_vka7	1	-1	0.5
cn_vka8	1	-1	0.5
drncond_k00	1	-1	0.5
flow	0.09691	-0.124939	0.0554622
gr_hk3	1	-1	0.5
gr_hk4	1	-1	0.5
gr_hk5	1	-1	0.5
gr_prsity3	0	-1	0.25
gr_prsity4	0	-1	0.25
gr_prsity5	0 0413007	-1	0.25
gr_rech2	0.0413927	-0.0457575	0.0217875
gr_rech3	0.0413927	-0.0457575	0.0217875
or atrt	0.0211893	-0.0222764	0.0108664
gr_strt5	0.243038	-0.60206	0.211275
gr_sy3	0.243038	-0.60206	0.211275
gr_sy4 gr_sy5	0.243038	-0.60206	0.211275
gr_vka3	0.243030	-1	0.211273
gr_vka4	1	-1	0.5
gr_vka5	1	-1	0.5
pp_hk0	1	-1	0.5
pp_hk1	1	-1	0.5
pp_hk2	1	-1	0.5
pp_prsity0	0	-1	0.25
pp_prsity1	0	-1	0.25
pp_prsity2	0	-1	0.25
pp_rech0	0.0413927	-0.0457575	0.0217875
pp_rech1	0.0413927	-0.0457575	0.0217875
pp_ss0	1	-1	0.5
11-	_	_	

```
0.5
                                 1
                                                    -1
pp_ss1
                                                                          0.5
pp_ss2
                                 1
                                                    -1
                        0.0211893
                                           -0.0222764
                                                                    0.0108664
pp_strt0
                        0.0211893
                                           -0.0222764
                                                                    0.0108664
pp_strt1
                                                                    0.0108664
pp_strt2
                        0.0211893
                                           -0.0222764
                         0.243038
                                             -0.60206
                                                                     0.211275
pp_sy0
                         0.243038
                                             -0.60206
                                                                     0.211275
pp_sy1
pp_sy2
                         0.243038
                                             -0.60206
                                                                     0.211275
                                                                          0.5
pp_vka0
                                 1
                                                    -1
pp_vka1
                                 1
                                                    -1
                                                                          0.5
                                                    -1
                                                                          0.5
pp_vka2
                                 1
                                 2
                                                    -2
strk
                                                                            1
             0.176091 to 0.30103
welflux
                                   -0.30103 to
                                                     0 0.0752575 to 0.11928
welflux_k02
                                 1
                                                    -1
                                                                          0.5
```

[65 rows x 7 columns]

define our decision varible group and also set some ++args

```
In [4]: pst.pestpp_options = {}
    #dvg = ["welflux_k02", "welflux"]
    dvg = ["welflux_k02"]
    pst.pestpp_options["opt_dec_var_groups"] = dvg
    pst.pestpp_options["opt_direction"] = "max"
```

For the first run, we wont use chance constraints, so just fix all non-decision-variable parameter. We also need to set some realistic bounds on the welflux multiplier decision variables. Finally, we need to specify a larger derivative increment for the decision variable group

```
In [5]: par = pst.parameter_data
        par.loc[:,"partrans"] = "fixed"
        #turn off pumping in the scenario
        par.loc["welflux_001","parlbnd"] = 0.0
        par.loc["welflux_001","parval1"] = 0.0
        dvg_pars = par.loc[par.pargp.apply(lambda x: x in dvg), "parnme"]
        par.loc[dvg pars,"partrans"] = "none"
        par.loc[dvg_pars,"parlbnd"] = 0.0
        par.loc[dvg_pars,"parubnd"] = 2.0
        par.loc[dvg_pars,"parval1"] = 1.0
       pst.rectify_pgroups()
       pst.parameter_groups.loc[dvg,"inctyp"] = "absolute"
        pst.parameter groups.loc[dvg,"inctyp"] = "absolute"
        pst.parameter_groups.loc[dvg,"derinc"] = 0.25
        pst.parameter_groups.loc[dvg,:]
Out [5]:
                                    inctyp derinc derinclb forcen derincmul \
                        pargpnme
       pargpnme
```

```
welflux_k02 welflux_k02 absolute 0.25 0.0 switch 2.0

dermthd splitthresh splitteldiff splitaction extra
pargpnme
welflux_k02 parabolic 0.00001 0.5 smaller NaN
```

1.0.1 define constraints

model-based constraints are identified in pestpp-opt by an obs group that starts with "less_than" or "greater_than" and a weight greater than zero. So first, we turn off all of the weights and get names for the sw-gw exchange observations

```
In [6]: obs = pst.observation_data
        obs.loc[:,"weight"] = 0.0
        swgw_hist = obs.loc[obs.obsnme.apply(lambda x: "fa" in x and( "hw" in x or "tw" in x))
        obs.loc[swgw_hist,:]
Out [6]:
                                            obsval weight obgnme extra
                                obsnme
        obsnme
        fa_hw_19791230 fa_hw_19791230 -1187.49350
                                                      0.0 flagx
                                                                     NaN
        fa_hw_19801229 fa_hw_19801229 -528.93750
                                                       0.0 flaqx
                                                                     NaN
                       fa_tw_19791230
                                                       0.0 flagx
        fa_tw_19791230
                                         203.42273
                                                                     NaN
        fa_tw_19801229
                       fa_tw_19801229
                                         721.34085
                                                       0.0 flagx
                                                                     NaN
```

We need to change the obs group (obgnme) so that pestpp-opt will recognize these two model outputs as constraints. The obsval becomes the RHS of the constraint. We also need to set a lower bound constraint on the total abstraction rate (good thing we included all those list file budget components as observations!)

```
In [7]: obs.loc[swgw_hist,"obgnme"] = "less_than"
        obs.loc[swgw_hist,"weight"] = 1.0
        obs.loc[swgw_hist,"obsval"] = -300
        tot_abs_rate = ["flx_wells_19791230"]#, "flx_wells_19801229"]
        obs.loc[tot_abs_rate, "obgnme"] = "less_than"
        obs.loc[tot_abs_rate, "weight"] = 1.0
        obs.loc[tot_abs_rate,"obsval"] = -600.0
        pst.less_than_obs_constraints
Out[7]: obsnme
        fa_hw_19791230
                                   fa_hw_19791230
        fa_hw_19801229
                                   fa_hw_19801229
        fa_tw_19791230
                                  fa tw 19791230
        fa_tw_19801229
                                  fa_tw_19801229
        flx wells 19791230
                              flx wells 19791230
        Name: obsnme, dtype: object
In [8]: pst.control_data.noptmax = 1
        pst.write(os.path.join(t_d, "freyberg_opt.pst"))
```

```
In [9]: pyemu.os_utils.start_slaves(t_d, "pestpp-opt", "freyberg_opt.pst", num_slaves=10, master_d
   Let's load and inspect the response matrix
In [10]: jco = pyemu.Jco.from_binary(os.path.join(m_d, "freyberg_opt.1.jcb")).to_dataframe().lo
Out[10]:
                              wf0200090016
                                            wf0200110013 wf0200200014 wf0200260010
         fa_hw_19791230
                                 137.57200
                                                126.32400
                                                               46.30000
                                                                              21.90800
         fa_hw_19801229
                                  22.58400
                                                 28.65600
                                                               12.03600
                                                                              12.29200
         fa_tw_19791230
                                                                              92.42320
                                   6.50728
                                                 14.53516
                                                               93.28136
```

7.60104

-150.00000

15.29948

-150.00000

30.88604

-150.00000

	wf0200290006	wf0200340012
fa_hw_19791230	18.12000	4.8320
fa_hw_19801229	13.12800	3.3560
fa_tw_19791230	71.84608	82.9612
fa_tw_19801229	34.79872	17.5232
flx_wells_19791230	-150.00000	-150.0000

4.10836

-150.00000

Let's also load the optimal decision variable values:

fa_tw_19801229

flx_wells_19791230

8.1332977617072

```
Out[11]:
                            parnme
                                     parval1 scale offset
        parnme
        wf0200090016 wf0200090016 2.000000
                                                1.0
                                                        0.0
        wf0200110013 wf0200110013 2.000000
                                                1.0
                                                        0.0
        wf0200200014 wf0200200014 2.000000
                                                1.0
                                                        0.0
        wf0200260010 wf0200260010 0.133298
                                                1.0
                                                        0.0
        wf0200290006 wf0200290006 0.000000
                                                1.0
                                                        0.0
        wf0200340012 wf0200340012
                                    2.000000
                                                1.0
                                                        0.0
```

The sum of these values is the optimal objective function value. However, since these are just mulitpliers on the pumping rate, this number isnt too meaningful. Instead, lets look at the residuals file

```
fa_hw_19801229
                        fa_hw_19801229 less_than
                                                     -300.0
                                                             -714.4580
                        fa_tw_19791230 less_than
fa_tw_19791230
                                                     -300.0
                                                             -407.7249
                                        less_than
fa_tw_19801229
                        fa_tw_19801229
                                                     -300.0 -299.7868
flx_wells_19791230
                    flx_wells_19791230
                                        less_than
                                                     -600.0 -1219.9948
                    residual weight
name
fa_hw_19791230
                    399.3735
                                 1.0
fa_hw_19801229
                                 1.0
                    414.4580
fa_tw_19791230
                    107.7249
                                 1.0
fa_tw_19801229
                                 1.0
                     -0.2132
flx_wells_19791230
                                 1.0
                    619.9948
```

Sweet as! lots of room in the optimization problem. The bounding constraint is the one closest to its RHS

1.0.2 Opt under uncertainty part 1: FOSM chance constraints

To activate the chance constraint process, we need to specific a risk != 0.5

```
In [13]: pst.pestpp_options["opt_risk"] = 0.4
```

For the FOSM-based chance constraints, we also need to have at least one adjustable non-decvar parameter so that we can propogate parameter uncertainty to model-based constraints (this can also be posterior FOSM is non-constraint, non-zero-weight observations are specified). For this simple demo, lets just use the constant multiplier parameters in the prior uncertainty stance:

```
In [14]: cn_pars = par.loc[par.pargp.apply(lambda x: "cn" in x),"parnme"]
         cn_pars
Out[14]: parnme
         hk6 cn
                            hk6_cn
         hk7_cn
                            hk7_cn
         hk8_cn
                            hk8_cn
         prsity6_cn
                        prsity6_cn
                       prsity7_cn
         prsity7_cn
                        prsity8_cn
         prsity8_cn
         rech4_cn
                          rech4_cn
                          rech5_cn
         rech5_cn
         ss6_cn
                            ss6_cn
                            ss7_cn
         ss7_cn
         ss8_cn
                            ss8_cn
         strt6_cn
                          strt6_cn
         strt7_cn
                          strt7_cn
         strt8_cn
                          strt8_cn
         sy6_cn
                            sy6_cn
         sy7_cn
                            sy7_cn
                            sy8_cn
         sy8_cn
                           vka6_cn
         vka6_cn
```

```
vka7_cn
                          vka7_cn
         vka8_cn
                          vka8_cn
         Name: parnme, dtype: object
In [15]: par = pst.parameter_data
         par.loc[cn_pars,"partrans"] = "log"
         pst.control_data.noptmax = 1
         pst.write(os.path.join(t_d, "freyberg_opt_uu1.pst"))
         pst.npar_adj
Out[15]: 26
In [16]: pyemu.os_utils.start_slaves(t_d, "pestpp-opt", "freyberg_opt_uu1.pst", num_slaves=20, mas:
In [17]: pst = pyemu.Pst(os.path.join(m_d, "freyberg_opt_uu1.pst"), resfile=os.path.join(m_d, "freyberg_opt_uu1.pst")
         pst.res.loc[pst.nnz_obs_names,:]
Out [17]:
                                                                          modelled \
                                                             measured
                                            name
                                                      group
         name
                                  fa_hw_19791230 less_than
                                                               -300.0 -666.13442
         fa_hw_19791230
                                  fa_hw_19801229 less_than
         fa_hw_19801229
                                                               -300.0
                                                                       -682.60800
         fa_tw_19791230
                                  fa_tw_19791230 less_than
                                                               -300.0
                                                                       -223.47050
         fa_tw_19801229
                                  fa_tw_19801229 less_than
                                                               -300.0 -208.37540
         flx_wells_19791230 flx_wells_19791230 less_than
                                                               -600.0 -1586.33800
                              residual weight
         name
         fa_hw_19791230
                             366.13442
                                            1.0
         fa_hw_19801229
                                            1.0
                             382.60800
         fa_tw_19791230
                             -76.52950
                                            1.0
         fa_tw_19801229
                             -91.62460
                                            1.0
         flx_wells_19791230 986.33800
                                            1.0
In [18]: par_df = pyemu.pst_utils.read_parfile(os.path.join(m_d, "freyberg_opt_uu1.1.par"))
         print(par_df.loc[dvg_pars,"parval1"].sum())
         par_df.loc[dvg_pars,:]
10.575587155980312
                                       parval1 scale offset
Out [18]:
                             parnme
         parnme
                                      2.000000
                                                          0.0
         wf0200090016 wf0200090016
                                                  1.0
         wf0200110013 wf0200110013
                                      2.000000
                                                  1.0
                                                          0.0
         wf0200200014 wf0200200014 1.481006
                                                  1.0
                                                          0.0
                                                  1.0
                                                          0.0
         wf0200260010 wf0200260010 1.094581
         wf0200290006 wf0200290006
                                      2.000000
                                                  1.0
                                                          0.0
```

1.0

0.0

wf0200340012 wf0200340012 2.000000

1.0.3 Opt under uncertainty part 2: ensemble-based chance constraints

PESTPP-OPT can also skip the FOSM calculations if users specify model-based constraint weights as standard deviations. These can be derived from existing ensembles (oh snap!)

Wait! Something is wrong here: The cumulative well flux constraint is not uncertain - it is just a summation of the specified flux. So lets give it a crazy small weight, implying it has a tiny uncertainty

```
In [21]: std["flx_wells_19791230"] = 1.0e-10
         std
Out[21]: fa_hw_19791230
                               3.992044e+02
         fa_hw_19801229
                               5.640293e+02
         fa_tw_19791230
                               5.247565e+02
         fa_tw_19801229
                               6.083798e+02
         flx_wells_19791230
                               1.000000e-10
         dtype: float64
In [22]: pst.observation_data.loc[pst.nnz_obs_names, "weight"] = std.loc[pst.nnz_obs_names]
         pst.pestpp_options["opt_std_weights"] = True
         pst.write(os.path.join(t_d,"freyberg_opt_uu2.pst"))
In [23]: pyemu.os_utils.start_slaves(t_d,"pestpp-opt","freyberg_opt_uu2.pst",num_slaves=10,mas
In [24]: par_df = pyemu.pst_utils.read_parfile(os.path.join(m_d, "freyberg_opt_uu2.1.par"))
         print(par_df.loc[dvg_pars,"parval1"].sum())
         par_df.loc[dvg_pars,:]
11.189845992374467
Out [24]:
                                      parval1 scale offset
                             parnme
```

```
parnme
wf0200090016 wf0200090016 2.000000
                                       1.0
                                               0.0
                                       1.0
                                               0.0
wf0200110013 wf0200110013 2.000000
wf0200200014 wf0200200014 1.189846
                                       1.0
                                               0.0
wf0200260010 wf0200260010 2.000000
                                       1.0
                                               0.0
wf0200290006 wf0200290006 2.000000
                                       1.0
                                               0.0
wf0200340012 wf0200340012 2.000000
                                       1.0
                                               0.0
```

1.0.4 Super secret mode

turns out, if the opt problem is truely linear, we can reuse results of a previous PESTPP-OPT run to modify lots of the pieces of the optimization problem and resolve without running the model even once! WAT!?

```
In [25]: shutil.copy2(os.path.join(m_d, "freyberg_opt_uu2.1.jcb"), os.path.join(m_d, "restart.jcb")
         shutil.copy2(os.path.join(m_d, "freyberg_opt_uu2.jcb.1.rei"),os.path.join(m_d, "restart
         pst.pestpp_options["base_jacobian"] = "restart.jcb"
         pst.pestpp_options["hotstart_resfile"] = "restart.rei"
         pst.pestpp_options["opt_skip_final"] = True
         pst.write(os.path.join(m_d,"freyberg_opt_restart.pst"))
In [26]: pyemu.os_utils.run("pestpp-opt freyberg_opt_restart.pst",cwd=m_d)
In [27]: par_df = pyemu.pst_utils.read_parfile(os.path.join(m_d, "freyberg_opt_restart.1.par"))
         print(par_df.loc[dvg_pars,"parval1"].sum())
         par_df.loc[dvg_pars,:]
11.189845992374467
Out [27]:
                             parnme
                                      parvall scale offset
         parnme
         wf0200090016 wf0200090016 2.000000
                                                  1.0
                                                          0.0
         wf0200110013 wf0200110013 2.000000
                                                  1.0
                                                          0.0
         wf0200200014 wf0200200014 1.189846
                                                  1.0
                                                          0.0
         wf0200260010 wf0200260010 2.000000
                                                  1.0
                                                          0.0
         wf0200290006 wf0200290006 2.000000
                                                  1.0
                                                          0.0
         wf0200340012 wf0200340012 2.000000
                                                  1.0
                                                          0.0
  Oh snap! that means we can do all sort of kewl optimization testing really really fast....
In [28]: pst.pestpp_options["opt_risk"] = 0.54
         pst.write(os.path.join(m_d,"freyberg_opt_restart.pst"))
         pyemu.os_utils.run("pestpp-opt freyberg_opt_restart.pst",cwd=m_d)
         par_df = pyemu.pst_utils.read_parfile(os.path.join(m_d, "freyberg_opt_restart.1.par"))
         print(par_df.loc[dvg_pars,"parval1"].sum())
         par_df.loc[dvg_pars,:]
4.566052122715744
Out [28]:
                                      parval1 scale offset
                             parnme
         parnme
         wf0200090016 wf0200090016 2.000000
                                                  1.0
                                                          0.0
         wf0200110013 wf0200110013 2.000000
                                                  1.0
                                                          0.0
         wf0200200014 wf0200200014 0.566052
                                                 1.0
                                                          0.0
```

1.0

1.0

1.0

0.0

0.0

0.0

wf0200260010 wf0200260010 0.000000

wf0200290006 wf0200290006 0.000000

wf0200340012 wf0200340012 0.000000

Lets use the functionality to evaluate how our OUU problem changes if we use posterior standard deviations:

```
In [29]: obs_df = pd.read_csv(os.path.join("master_ies","freyberg_ies.3.obs.csv"),index_col=0)
         std = obs_df.std().loc[pst.nnz_obs_names]
         std["flx_wells_19791230"] = 1.0e-10
         std
Out [29]: fa_hw_19791230
                               2.196769e+02
         fa_hw_19801229
                               2.510506e+02
         fa_tw_19791230
                               2.295353e+02
         fa_tw_19801229
                               3.245744e+02
         flx_wells_19791230
                               1.000000e-10
         dtype: float64
In [30]: pst.observation_data.loc[pst.nnz_obs_names, "weight"] = std.loc[pst.nnz_obs_names]
         pst.observation_data.loc[pst.nnz_obs_names,"weight"]
Out[30]: obsnme
         fa_hw_19791230
                               2.196769e+02
         fa_hw_19801229
                               2.510506e+02
         fa_tw_19791230
                               2.295353e+02
         fa_tw_19801229
                               3.245744e+02
         flx_wells_19791230
                               1.000000e-10
         Name: weight, dtype: float64
In [31]: pst.write(os.path.join(m_d, "freyberg_opt_restart.pst"))
         pyemu.os_utils.run("pestpp-opt freyberg_opt_restart.pst",cwd=m_d)
         par_df = pyemu.pst_utils.read_parfile(os.path.join(m_d, "freyberg_opt_restart.1.par"))
         print(par_df.loc[dvg_pars,"parval1"].sum())
         par_df.loc[dvg_pars,:]
6.374651321133607
Out [31]:
                             parnme
                                      parval1 scale offset
         parnme
         wf0200090016 wf0200090016 2.000000
                                                  1.0
                                                          0.0
         wf0200110013 wf0200110013 2.000000
                                                 1.0
                                                          0.0
         wf0200200014 wf0200200014 2.000000
                                                 1.0
                                                          0.0
         wf0200260010 wf0200260010 0.000000
                                                 1.0
                                                          0.0
         wf0200290006 wf0200290006 0.000000
                                                 1.0
                                                          0.0
         wf0200340012 wf0200340012 0.374651
                                                 1.0
                                                          0.0
In [32]: res_df = pyemu.pst_utils.read_resfile(os.path.join(m_d, "freyberg_opt_restart.jcb.1.re
         res_df
Out [32]:
                                                      group measured
                                           name
                                                                        modelled \
         name
```

fa_hw_19791230	fa_hw_19791230	less_than	-300.0 -977.23900
fa_hw_19801229	fa_hw_19801229	less_than	-300.0 -757.44600
fa_tw_19791230	fa_tw_19791230	less_than	-300.0 -453.03310
fa_tw_19801229	fa_tw_19801229	less_than	-300.0 -282.96436
flx_wells_19791230	flx_wells_19791230	less_than	-600.0 -900.00000
	residual we	ight	
name			
fa_hw_19791230	677.23900 2.196769	e+02	
4 1 40004000	455 44000 0 540500		

	residuai	weight
name		
fa_hw_19791230	677.23900	2.196769e+02
fa_hw_19801229	457.44600	2.510506e+02
fa_tw_19791230	153.03310	2.295353e+02
fa_tw_19801229	-17.03564	3.245744e+02
flx wells 19791230	300.00000	1.000000e-10