

Course Notes Advanced SWAT: Calibrating using SWAT-CUP

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Introduction

This is an introduction into using SWAT CUP written for the "How do I use satellite and global reanalysis data for hydrological simulations in SWAT?" workshop in Montevideo between 7 - 11 August 2017, jointly organised by the University of Sydney, IRI and INIA.

Aims of this part of the course:

- Use SWAT CUP to calibrate a SWAT model for the Santa Lucia catchment
- Understand and interpret the difference between global and local sensitivity analysis
- Independently use SUFI2 in SWAT CUP to run a sensitivity analysis
- Comprehend and manipulate the PSO calibration routines in SWAT-CUP, interpret the outcomes of the calibration
- Comprehend uncertainty bounds indicated by SWAT-CUP in both SUFI2 and PSO
- Include other calibration data, such as MODIS ET in SWAT-CUP for calibration
- Extracting the calibrated model from SWAT-CUP for simulations

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SWAT-CUP

SWAT-CUP is a calibration, validation and sensitivity analysis tool for SWAT and can be freely downloaded. Most of the general information is provided here: <http://www.eawag.ch/forschung/siam/software/swat/index>, while the program can be downloaded here: <http://www.neprashtechology.ca/Default.aspx>).

The SWAT CUP source code is not freely available, and there is also a cost if you want to use the parallel processing routine. However, at the moment SWAT CUP is the standard in the SWAT community for calibration. We will use SWAT-CUP running on a single core, which means our calibration problems need to be small

This document only gives specific instructions to calibrate the SWAT model for the catchment that we want to study (Santa Lucia). Regrettably there are only limited detailed instructions for SWAT-CUP on the web, and also the SWAT CUP help file is not very useful.

System requirements (for this tutorial)

ARCGIS 10, SWAT 2012, SWAT CUP and possibly file access to the C drive of the computer. Access to the build in drives of the computer will make the program run faster.

Files required:

The SWAT directory on shared drive, on which we have stored all the files needed for this project now also includes files needed for SWAT-CUP. Copy these files to your own workspace or to a USB drive.

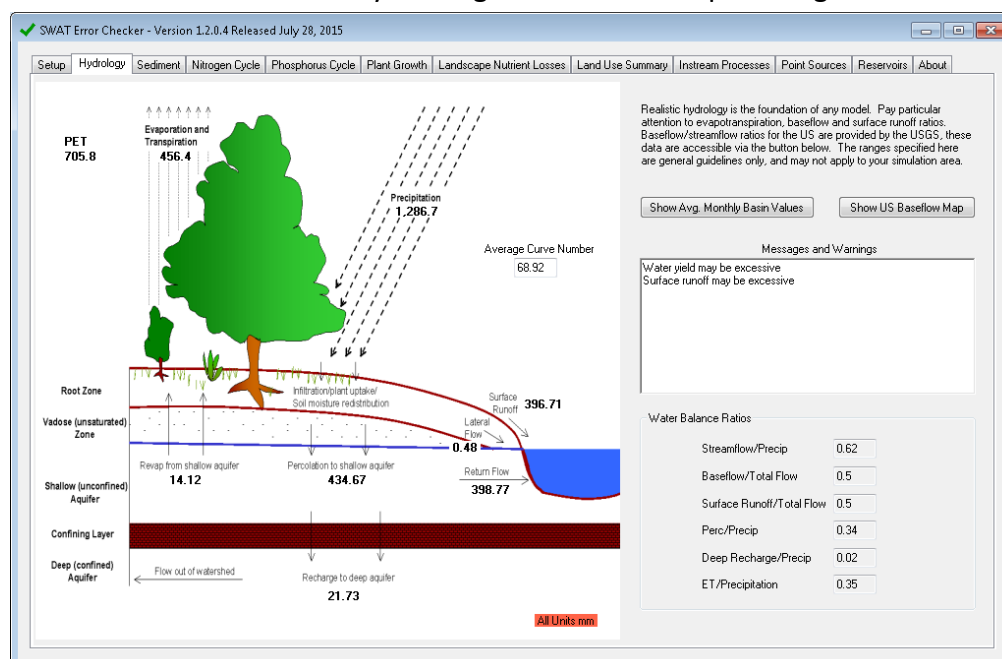
This example is based on the ARCSWAT version of the Santa Lucia catchment model. The QSWAT version would follow a similar set-up but would have many more subbasins.

Preparing observed data for SWAT calibration

Basic Data check

As a first check it is important to understand something about the quality of the data. To do this it can be useful to develop annual or monthly water balances from the observed data. This involves running a script to calculate potential ET/rough actual ET using a crop factor and to do a simple water balance: $P - ET = Q$ and to plot this. This should help get an understanding of the data quality and if there are major issues with the data before we start modelling.

Your initial check of this is by looking at the SWAT output using SWAT check in ARC SWAT.



If you don't have ARCSWAT, there is an R-script in the folder (C1A_AnalyseOutput.R) to run the same analysis on "output.std" in the txtinout folder. This analysis already indicates whether the order of magnitudes in the rainfall is OK. However, we should also check the streamflow data and make a rough estimate of the Evapotranspiration.

I have developed a document that outlines the Rcode how you can do this for the Santa Lucia catchment. You would be able to repeat this for your catchment of choice. This document indicates some simple ways of checking whether the input data for your catchment are reasonable and the water balance not skewed one way or the other.

The document is called C1_WaterbalanceCheckSWATInput.pdf

SWAT CUP specific formatting

SWAT-CUP requires a specific format in all the observed data to allow the calibration, and we want to also limit the flow data to a certain period.

Together with former PhD student Dr Dipangkar Kundu we have written a set of R functions that will do this, which are in the “functions” folder on the shared drive. You can call these functions using

```
source("path/to/file/SWATCUPfunctions.R")
```

Where “path/to/file” is the path to the directory where you have stored the file.

I have also developed a document that demonstrates the use of these functions, which is: “D_CreatingSWATCUPobservedData_Simplified.pdf”

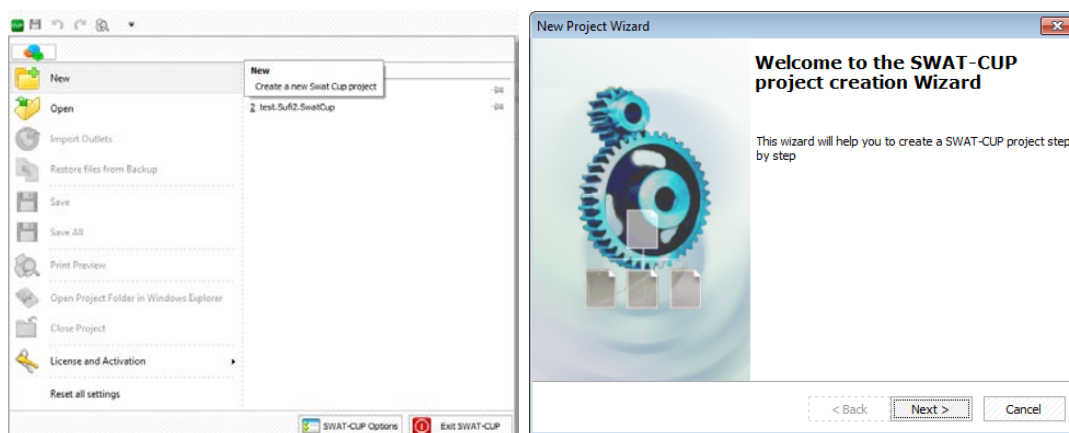
Task

- We will now go through these different functions and prepare the input data

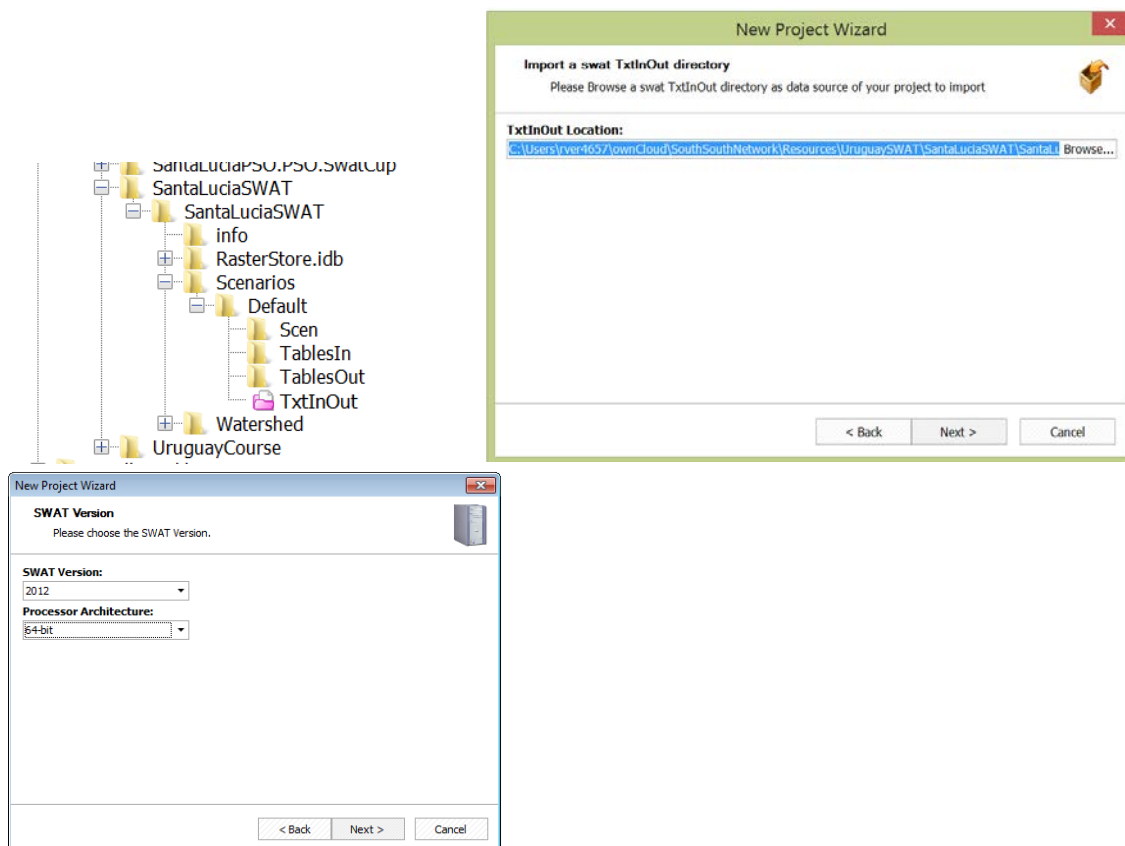
Setting up a SWAT-CUP project

This is fairly straight forward and the program steps you through the different inputs. Start by starting a new project from the toolbar, and the wizard should guide you through the different steps. Make sure you know where to find your working directory, and probably it will be useful to also put this on the C:\drive (and copying it at the end of the day to your own storage).

This first step is the same between the SUFI2 and the PSO project.



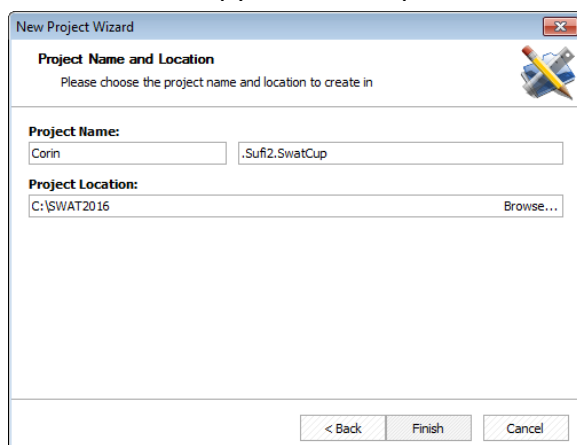
Navigate to the txtinout directory of your developed SWAT model. This is important as this is the data that SWAT-CUP will use to adjust the parameters in the model. In the next screen choose SWAT **version 2012** and **64 bit** architecture.



Using SUFI2 for sensitivity analysis

We are initially using **SUFI2** as a project type while we are concentrating on the sensitivity analysis. Later will also use the **PSO** routine. Note that there are several other ways of calibrating the model including Beven's GLUE, ParaSol, PSO (Particle Swarm Optimisation) and MCMC (Metropolis Monte Carlo).

Finally give your project a name and store it in your folder on the C:\drive or a USB drive (but remember to copy it to a safe place at the end of the course).



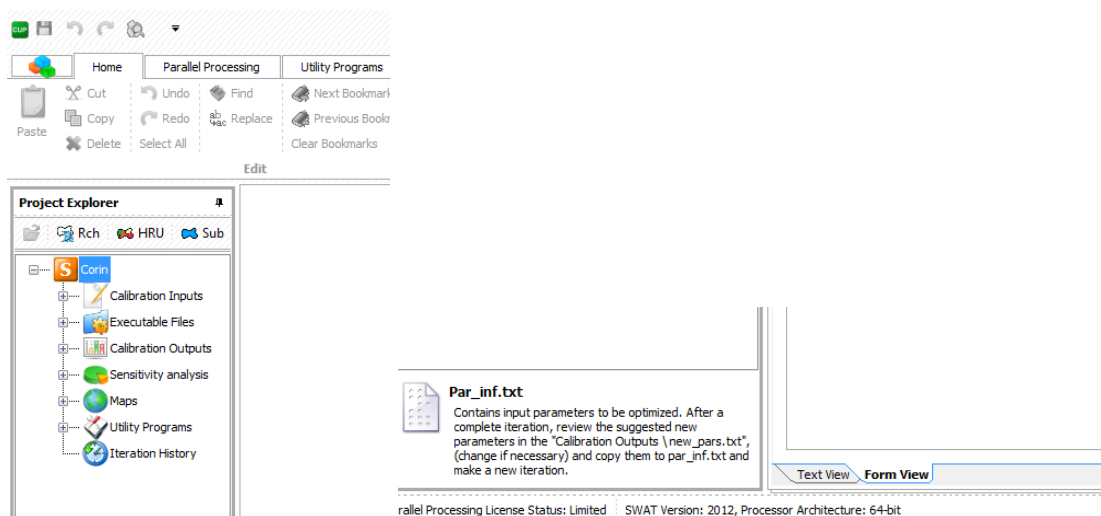
On clicking finish SWAT-CUP will copy all the SWAT txt files to a new folder in your XXX.Sufi2.swatcup folder. This might take some time.

Setting up the sensitivity/calibration run

The key elements of a calibration are (in order):

1. Defining the parameters to be adjusted. SWAT has many parameters as we discussed. In this case we will limit ourselves to a group of parameters related to the hydrological processes at the soil, groundwater, overland flow and routing level.
2. Defining the observed data and time period for which we will run the calibration. We have discussed that this can be difficult.
3. Defining the objective function. Different objective functions can give different calibration results leading to variations in the final calibrated parameters. You might want to test this out later.

Currently, the left hand side of our SWAT-CUP interface looks like this:



Defining the parameters to be adjusted: par_inf.txt

We will start with the file "Par_inf.txt" which is the main parameter file. The text view of Par_inf.txt gives you an overview of the parameters that are going to be calibrated and the number of simulation runs. You can also look at the form view (below) and decide yourself which one you find easiest to use. I will use the text view mainly. Scrolling down you can see examples of other parameters and so we need to decide how this works and what parameters to adjust. If you plan to do very complex subsets of parameters (see below) then the form view might be easier.

```

par_inf.txt x
par_inf.txt
Contains input parameters to be optimized and some PSO related parameters.

2 .....: number of simulations
3 .....: number of iterations
0.1 .....: behavioral threshold where solutions are collected to build model uncertainty
0.1 .....: weight in the velocity calculation. The larger the weight the wider the search space
0 .....: if 1 then a previous solution is used to start the search, if 0 then non is used

4 .....: Number of Parameters (the program only reads the first 4 parameters or any number indicated here)

r_CN2.mgt .....-0.2 .....0.2
v_ALPHA_BF.gw .....0.0 .....1.0
v_GW_DELAY.gw .....30.0 .....450.0
v_GWQMN.gw .....0.0 .....2.0

v_GW_REVAP.gw .....0.0 .....0.2
v_ESCO.hru .....0.8 .....1.0
v_CH_N2.rte .....0.0 .....0.3
v_CH_K2.rte .....5.0 .....130.0
v_ALPHA_BNK.rte .....0.0 .....1.0
r_SOL_AWC(1).sol .....-0.2 .....0.4
r_SOL_K(1).sol .....-0.8 .....0.8
r_SOL_BD(1).sol .....-0.5 .....0.6
v_SFTMP.bsn .....-5.0 .....5.0

```

The text view of par_inf.txt

Par_inf.txt x

par_inf.txt

Contains input parameters to be optimized. After a complete iteration, review the suggested new parameters in the "Calibration Outputs \ new_pars.txt", (change if necessary) and

Number Of Param: 29 [1] [All] Number Of Simulat: 500

Parameters:

Basic Information				Value		Filter Conditions (optional)				Particular Settings				
#	Par Name	File Name	File E...	Method	Min	Max	Hydro...	Soil Te...	Lan...	Subbasins	Slope	Condi...	Layers/C...	Properties
1	CN2	.mgt		r Relative	-0.9	0.5			GRAS	(All)				
2	CN2	.mgt		r Relative	-0.9	0.5			AGRL	(All)				
3	CN2	.mgt		r Relative	-0.9	0.5			BARR	(All)				
4	CN2	.mgt		r Relative	-0.9	0.5			MONT	(All)				
5	CN2	.mgt		r Relative	-0.9	0.5			FRSE	(All)				
6	CN2	.mgt		r Relative	-0.9	0.5			CRIR	(All)				
7	SURLAG	.bsn		r Relative	-0.3	0.01				(All)				
8	ALPHA_BF	.gw		r Relative	-0.2	0.01				20-27				
9	ALPHA_BF	.gw		r Relative	-0.2	0.01				15-19				
10	ALPHA_BF	.gw		r Relative	-0.2	0.01				10-14				
11	ALPHA_BF	.gw		r Relative	-0.2	0.01				5-9				
12	ALPHA_BF	.gw		r Relative	-0.2	0.01				1-4				
13	REVAPMN	.gw		r Relative	-0.15	0.01				(All)				
14	GW_REVAP	.gw		r Relative	-0.01	0.95				(All)				
15	GWQMN	.gw		r Relative	-0.01	0.95				(All)				
16	GW_DELAY	.gw		r Relative	-0.2	0.01				(All)				
17	ESCO	.hru		r Relative	-0.9	0.01				(All)				
18	EPCO	.hru		r Relative	-0.7	0.1			GRAS	(All)				
19	EPCO	.hru		r Relative	-0.7	0.1			AGRL	(All)				
20	EPCO	.hru		r Relative	-0.7	0.1			BARR	(All)				
21	EPCO	.hru		r Relative	-0.7	0.1			MONT	(All)				

Text View Form View

Example of the form view of par_inf.txt

The naming of the parameters is explained in detail on page 40 of the SWAT CUP user manual and further, but can be summarised more briefly as follows:

Prefix	Explanation
v__	“value” this means the existing parameter value will be replaced by the given value

a__	“addition” this means the given value will be added to the existing parameter values
r__	“ratio” this means the existing parameter is multiplied by (1 + given value)

The next bit is the parameter name and the extension of the related file names (as given in SWAT) and this is followed by possible soil hydrological group, soil texture, landuse, subbasin, slope or soil layer. So for example:

r__CN2.mgt_____1 -0.2 0.2

This means, ratio parameter (r__) for the curve number base value CN2, which can be found in the management (mgt) files and only for subbasin 1. This ratio is allowed to be varied by the calibration routine between -0.2 and 0.2

The number of __ after “mgt” or any file extension is crucial, please check the SWAT CUP manual or use the form view to get this right.

Or:

v__CH_K2.rte 5.0 130.0

This means, value parameter (v__) for the global channel hydraulic conductivity (CH_K2) in the routing files (rte) which can vary between 5 and 130

Or:

a__GW_REVAP.gw_____3-6 -0.1 0.0

This means additive parameter for groundwater REVAP in the gw files for subbasins 3 – 6 varying between -0.1 and 0

And finally, because there is more than one soil layer for soil K and soil AWC:

r__SOL_K(1).sol -0.8 0.8

ratio parameters for soil hydraulic conductivity for layer 1 varying between -0.8 and 0.8 and for AWC the ratio parameters for layer 1 varying between -0.3 and 0.1

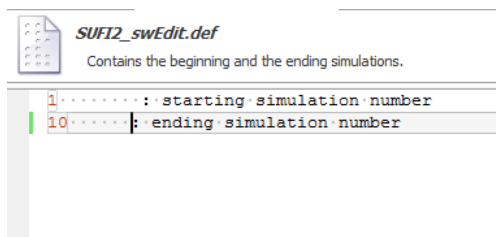
r__SOL_AWC(1).sol -0.3 0.1

When you decide on the ranges of parameters it is important to consider whether the range actually makes sense for the parameter. Some parameters cannot be negative and some cannot be 0.

So how do we decide which parameters are in and which are out? In SWAT-CUP this is not fully automated and you have to make decisions about this. In a way this is good, as you can apply your hydrological understanding to the watershed and use this as a “sanity check”. To kick things off we have decided long range of parameters that are linked to the 4 main groups: Soil, Groundwater, Overland Flow and Routing. I have put this as a textfile “SWATCUPparameterexample.txt” in the shared folders. Note that there are two sets of examples, you only want the top 29 parameters to start. You can add or delete parameters if you like.

SUFI2_swEdit.def

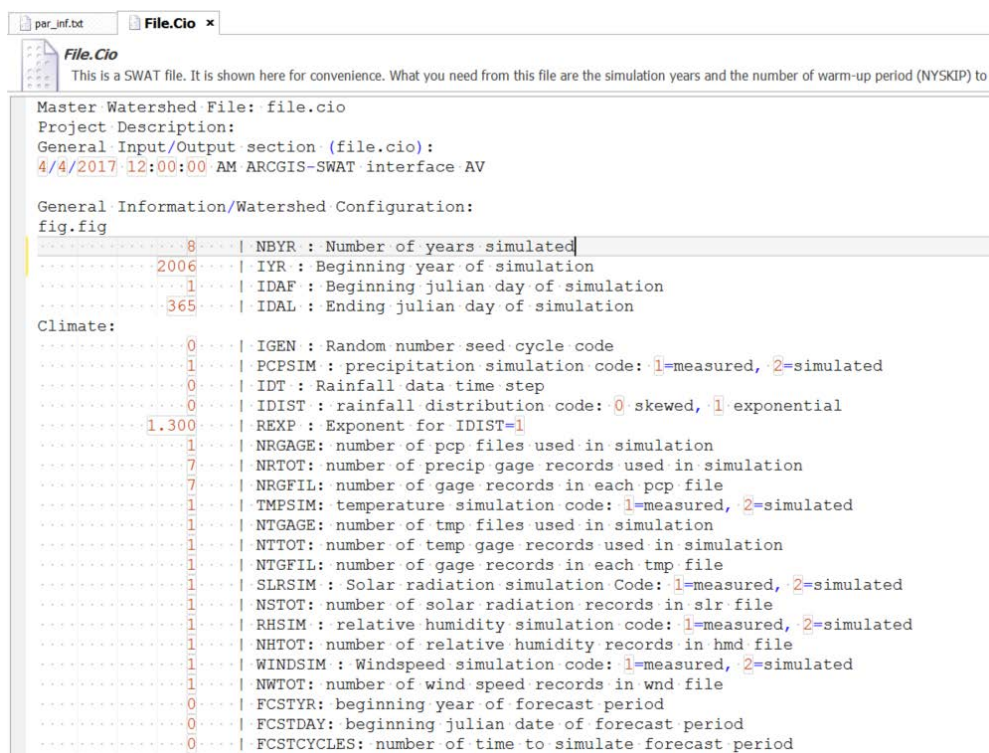
You also need to adjust the next file, which is SUFI2_swEdit.def, which is unique for SUFI2. Here you just have to set the ending simulation number to 10.



File.cio

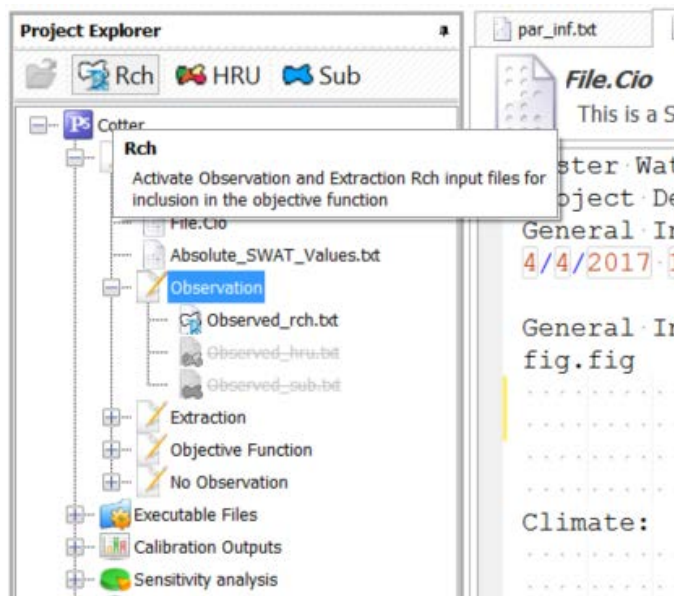
You need to have a look at File.cio. This is the main control file for SWAT and defines the period of the simulation and what output is being produced.

Check File.cio to make sure that you have set up a daily simulation, for 8 years (2006 - 2011) and that NYSKIP is set to 2. This also means that the ending day of the simulation is 365. Check also whether you are set to model daily data and not monthly data (IPRINT = 1).



Defining the observed data

Expanding the Observation item indicates three items that are crossed out. Basically these are observations at three different levels: Reach (Rch), Subbasin (Sub) and HRU that you can use in your calibration. You can activate any of them by clicking on the buttons higher up on the left side. As a first step we only want to activate the Rch component, as we only calibrate on Flow.



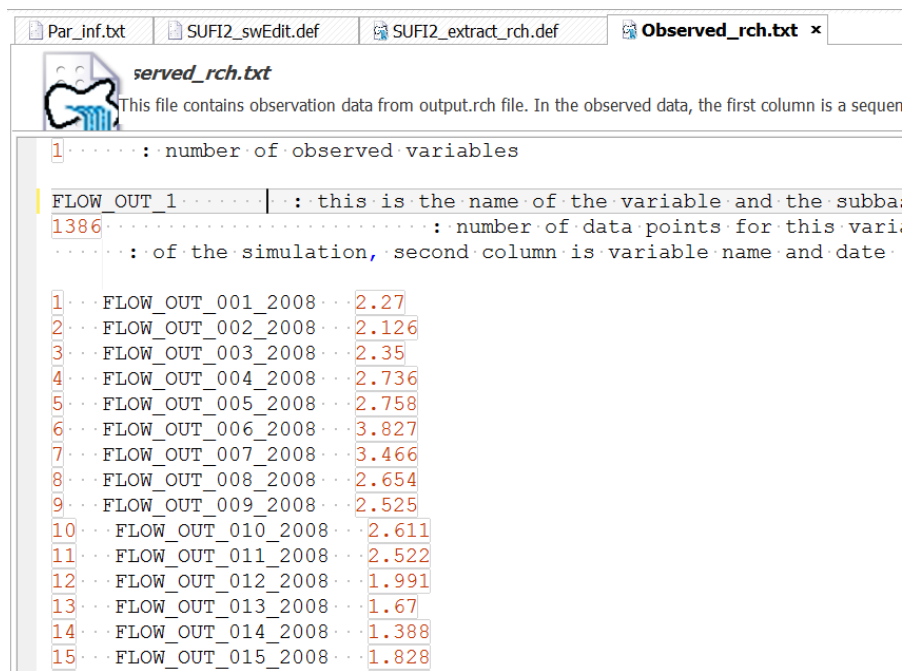
Observed_rch.txt

You can now open the Observed_rch.txt, which defines the data that will be used to calibrate the model. The data that exists in the file are example data. There are two things to work out, which reach number are we using for the calibration and how many days are we using for the calibration. Looking back at File.cio and the model set-up, we know we only run the model for 8 years, of which two years are “warm-up”. A warm-up period is important for all larger hydrological models as this stabilises the initial conditions.

If you think back to our simple model, we made some guesses about the initial storage in the soil bucket and the initial storage in the groundwater. Up to a certain point in time, these choices affect the model outcomes. In the case of our simple model, this was only a few time steps, but in the case of a complex model this could be much longer. Therefore choosing two years as warm-up period puts you on the safe side.

In Observed_rch.txt we will fill in that we have:

- **1** observed variable (the flow at Paso Pache station in the Santa Lucia catchment)
- **FLOW_OUT_1** will be the name of the variable using 28 as the subbasin where the outlet is, you can check this in ARCSWAT or QSWAT, but also in the fig.fig file in the txt files.
- **1386** is the number of data points, or whatever else we decided (this is dependent on the number of years you run the calibration for).

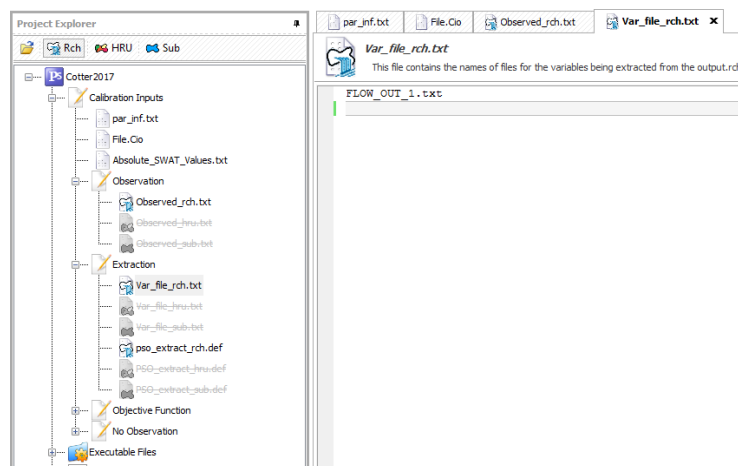


You then need to replace the rest of the file with the data which we have generated with the R script at the start. Clip the data from the file and replace all the info in the file. This is safer than actually replacing the file in the SUFI2 directory

Click Save, or Save all to save your changes

Var_file_rch.txt for SUFI2

Now expand the “Extraction” component and open the Var_file_rch.txt. Basically this now list 4 variables from the example. You need to replace this with the one variable that we want to use: FLOW_OUT_1.txt



SUFI2_extract_rch.def

The next file to adjust is SUFI2_extract_rch.def. Fill in as below: 1 variable, column 7 (see comments in green), 31 reaches in the project, 1 to use and this is number 28.

We are running 2008 – 2011 and on a daily time step.

```

T2_extract_rch.def
This file defines how variables should be extracted from the output.rch file.

output.rch ..... :swat output file name
1..... : number of variables to get
7..... : variable column number(s) in the swat output file (as many as the above number)

31..... : total number of reaches (subbasins) in the project

1..... : number of reaches (subbasins) to get for the first variable
28..... : reach (subbasin) numbers for the first variable

2008..... : beginning year of simulation not including the warm up period
2011..... : end year of simulation

1..... : time step (1=daily, 2=monthly, 3=yearly)

//Remarks

```

Defining the Objective function: Observed.txt

Our last step is to define the **objective function** component. For this expand this section and open the Observed.txt file. First we will clip and paste the data from the file which we generated earlier with the R script in here.

Then we will adjust the top of the file:

```

Par_inf.txt  SUFI2_swEdit.def  SUFI2_extract_rch.def  Observed_rch.txt  Observed.txt x
served.txt
This file contains all the information in observed_rch.txt, observed_hru.txt, observed_sub.txt files, plus some extra info

1..... : number of observed variables
9..... : Objective function type, 1=mult, 2=sum, 3=r2, 4=chi2, 5=NS, 6=br2, 7=ssqr,
1.0..... : when this values of obj fn is reached, process terminates

FLOW_OUT_1..... : this is the name of the variable and the subbasin
1..... : weight of the variable in
-1..... : Dynamic flow separation. Not considered if -1. If 1, then values shc
-1..... : constant flow separation, threshold value. (not considered if -1)
1..... : if separation of signal is considered, this is weight of the smaller
1..... : if separation of signal is considered, this is weight of the larger
10..... : percentage of measurement error
1386..... : number of data points for this variable
..... : of the simulation, second column is variable name and date (format:

1..FLOW_OUT_001_2008...2.27
2..FLOW_OUT_002_2008...2.126
3..FLOW_OUT_003_2008...2.35
4..FLOW_OUT_004_2008...2.736
5..FLOW_OUT_005_2008...2.758
6..FLOW_OUT_006_2008...3.827
7..FLOW_OUT_007_2008...3.466
8..FLOW_OUT_008_2008...2.654
9..FLOW_OUT_009_2008...2.525
10..FLOW_OUT_010_2008...2.611

```

We have:

- 1 observed variable
- We will use the KGE as our objective function (9). The other choices are highlighted in more detail on page 44 in the SWAT-CUP manual, but basically 1 is a multiplicative form of squared errors, while 2 is similar to a regular sum squared of errors, but allows different flow components to be assessed separately. The third option is the classic coefficient of determination (r^2), while 4 is similar but based on the χ^2 distribution.

Option 5 is the standard NSE. Option 6 uses the bias to force the relationship calculated based on r^2 closer to a 1:1 line, while option 7 uses the flood frequency curves. Option 9 is the KGE, which is a bias corrected version of the NSE. We will use this one.

- Set the next entry to 1 to make sure we capture sufficient model simulations.
- We will be using FLOW_OUT_1 as our observed values
- Don't worry about the 6 entries, which give further options to calculate objective functions and uncertainty.
- Finally we will use 1386 observations (or whatever else you generated in the R output)
- Below the top section you need to paste the observations from the Observed.txt that we generated with the R script earlier.

Save and move to the next file.

Var_file_name.txt

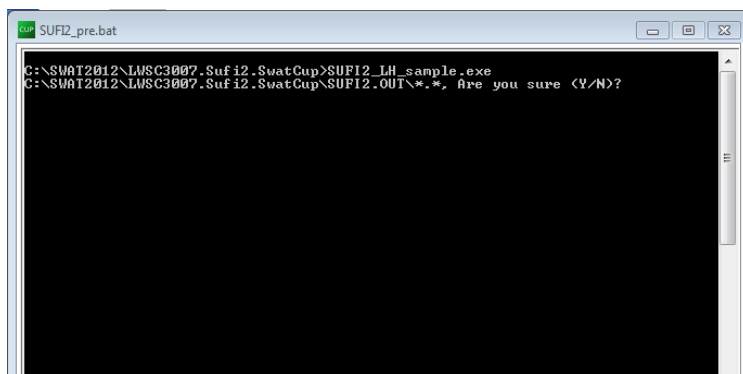
This is essentially the same as you did before. You just need 1 line with FLOW_OUT_1.txt

Again click *Save All*

RUNNING the SUFI2 Sensitivity (or calibration analysis)

We are now able to run SWAT-CUP , but we are only doing a test run with 10 simulations. The analysis is run through 3 “batch” files SUFI2_pre.bat, which sets up the separate result and analysis files and gets everything ready, mostly by running the latin hypercube sampling of the parameters to test, SUFI2_run.bat which runs the actual model runs, and SUFI2_post.bat, which does the file clean-up and makes all the output for you to see and analyse. A more detailed description of the program execution is on page 52 of the SWAT-CUP manual.

In our case we just press Execute all and this brings up a DOS box that runs SUFI2_pre.bat



Press Y and OK to start SUFI2_run.bat. This will run for a little while (remember we only asked for 10 simulations), close the window when asked.

```

Sufi2_Run.Bat
8
Parameter:      CUPMM
File:           gw
Value:          <1620.000000>
Method:         replace
Files Count:    154
Modified Values: 154 in 154 files
-----
9
Parameter:      REVAPMM
File:           gw
Value:          <37.595001>
Method:         relative change
Files Count:    154
Modified Values: 154 in 154 files
-----
10
Parameter:      GW_REVAP
File:           gw
Value:          <0.191000>
Method:         relative change
Files Count:    154
Modified Values: 154 in 154 files
-----
11
Parameter:      ALPHA_BF
File:           bsn
Value:          <0.350000>
Method:         replace
Files Count:    154
Modified Values: 154 in 154 files
-----
12
Parameter:      SURLAG
File:           bsn
Value:          <1.900000>
Method:         replace
Files Count:    1
Modified Values: 1 in 1 files

```

This will start SUFI2_post.bat

```

SUF12_post.bat
FLOW_OUT_29 obs # 323
FLOW_OUT_29 obs # 324
FLOW_OUT_29 obs # 325
FLOW_OUT_29 obs # 326
FLOW_OUT_29 obs # 327
FLOW_OUT_29 obs # 328
FLOW_OUT_29 obs # 329
FLOW_OUT_29 obs # 330
FLOW_OUT_29 obs # 331
FLOW_OUT_29 obs # 332
FLOW_OUT_29 obs # 333
FLOW_OUT_29 obs # 334
FLOW_OUT_29 obs # 335
FLOW_OUT_29 obs # 336
FLOW_OUT_29 obs # 337
FLOW_OUT_29 obs # 338
FLOW_OUT_29 obs # 339
FLOW_OUT_29 obs # 340
FLOW_OUT_29 obs # 341
FLOW_OUT_29 obs # 342
FLOW_OUT_29 obs # 343
FLOW_OUT_29 obs # 344
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FLOW_OUT_29 obs # 351
FLOW_OUT_29 obs # 352
FLOW_OUT_29 obs # 353
FLOW_OUT_29 obs # 354
FLOW_OUT_29 obs # 355
FLOW_OUT_29 obs # 356
FLOW_OUT_29 obs # 357
FLOW_OUT_29 obs # 358
FLOW_OUT_29 obs # 359
FLOW_OUT_29 obs # 360
FLOW_OUT_29 obs # 361
FLOW_OUT_29 obs # 362
FLOW_OUT_29 obs # 363
FLOW_OUT_29 obs # 364
FLOW_OUT_29 obs # 365
FLOW_OUT_29 obs # 366

C:\SWAT2012\IWSG3007.Sufi2.SwatCup>SUF12_95ppu_beh.exe
no_sims = 1
Finished reading observation file
Input file = SUFI2_OUT\beh_FLOW_OUT_29.txt
reading FLOW_OUT_29
FLOW_OUT_29 obs # 1
FLOW_OUT_29 obs # 2
FLOW_OUT_29 obs # 3
FLOW_OUT_29 obs # 4
FLOW_OUT_29 obs # 5
FLOW_OUT_29 obs # 6
FLOW_OUT_29 obs # 7
FLOW_OUT_29 obs # 8
FLOW_OUT_29 obs # 9
FLOW_OUT_29 obs # 10

C:\SWAT2012\IWSG3007.Sufi2.SwatCup>rem 95ppu_M0_Obs.exe

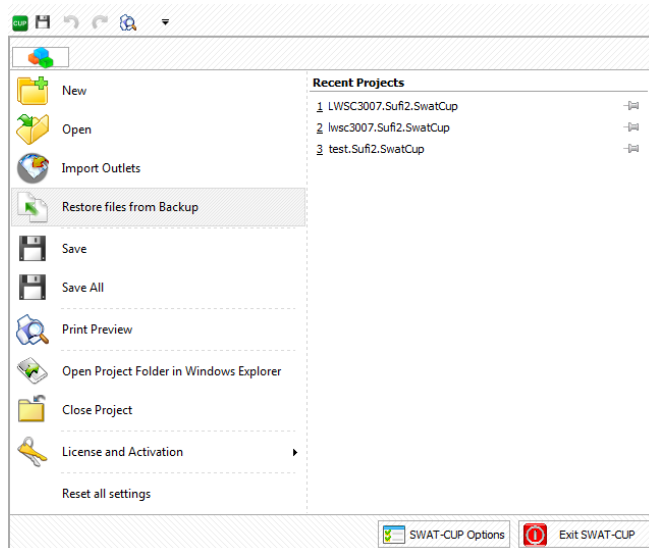
```

This confirms that we can run SUFI2 correctly and we can move on to the real calibration and sensitivity analysis

Running more simulations for a proper sensitivity analysis

There are two things we have to do:

1. Restore the original files from backup, rather than keeping the ones after 10 runs. To do this, go to the top left hand corner button and choose "Restore files from backup". This will ask you to confirm and bring up the standard windows copy interface. Choose: Copy and replace, but remember to tick the box "do this for the next ... conflicts". This should copy all the original files back.

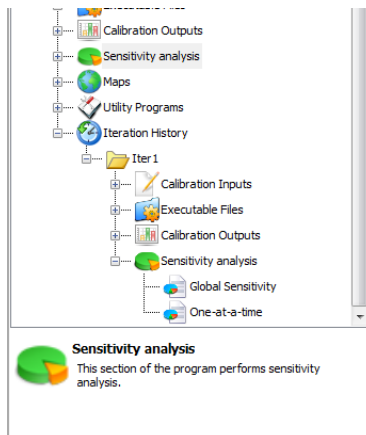


2. Increase the number of simulations to 500 in the files: Par_inf.txt and SUFI2_swEdit.def

Now hit Save All and Calibrate and Execute All and go through the same steps in SUFI2_pre.bat until you can run SUFI2_run.bat. Now go and get a deserved cup of tea. This will take a while before you get to SUFI2_post.bat (500 simulations). Run SUFI2_post.bat and make sure you save the iteration.

Sensitivity analysis

From this point we will be working with the results of the iteration you have saved, so at the bottom of the left hand list.



There are basically two types of sensitivity analysis and page 47 – 49 in the SWAT-CUP manual covers this. The easiest to understand is the “one at a time” sensitivity analysis. This tests how the objective function changes with changes in a single parameter, keeping all other parameters constant. As the manual explains, this is somewhat problematic as we never know what the constant values of the other parameters should be and this might influence the outcomes. However, **don’t click on this option**, as it will take a long time to load

The second approach is the “Global Sensitivity analysis”, which is what we will use. This works slightly different and is similar to the Morris method. This works basically by regressing a multilinear model of the parameters against the changes in the objective function as a result of perturbing the parameters values (Monte Carlo simulation). The statistics of the

parameters (whether they are significant or not) can be expressed in terms of a t-value or a p-value.

TASK 1: Investigate the ranking of the parameters in the global sensitivity analysis. What are the best 4 – 6 parameters?

You can also inspect the Dotty Plots and compare this to the earlier sensitivity analysis. The Dotty Plots indicate also the sensitivity of a few parameters to the objective function and thus identify whether a specific parameter can be defined or whether there is more than one possibility.

Do the Dotty Plot results confirm the sensitivity analysis ranking?

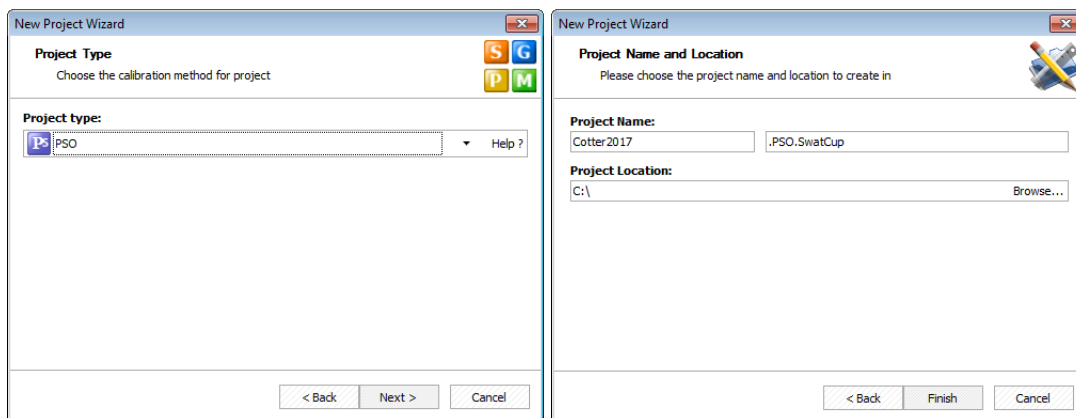
You might want to rerun the sensitivity analysis to test different or less parameters

You can also analyse the SUFI2 results as a calibration, check the manual for more detail.

Using PSO (Particle Swarm Optimisation)

Once we have decided on the final set of parameters, using the sensitivity analysis, we can use the PSO (Particle Swarm Optimisation) to further improve the calibration. Many of the instructions below are very similar to the SUFI2 example, but I have left all the text in, so you can run the two examples independently.

Finally give your project a name and store it in your folder if possible on the C:\drive, this makes it run the fastest (but remember to copy it to a safe place at the end, such as an USB drive). Regrettably, SWAT and SWAT-CUP have issues with running from cloud storage



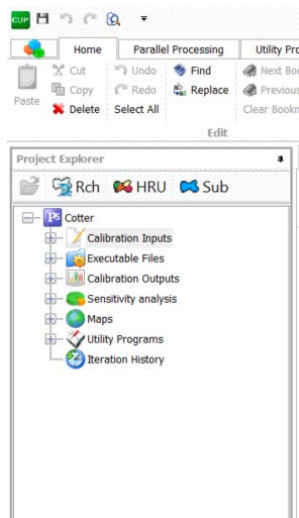
Setting up the calibration run for Flow only

The key elements of a calibration are (in order):

4. Defining the parameters to be adjusted. SWAT has many parameters. In this case we will limit ourselves to a group of parameters related to the hydrological processes at the soil, groundwater, overland flow and routing level. But we can choose other parameters as we go. We will discuss this later in the course.
5. Defining the observed data and time period for which we will run the calibration. We have discussed that this can be difficult. We can use the R script to generate different time periods for calibration. I am suggesting to use 2006 – 2011.

6. Defining the objective function. Different objective functions can give different calibration results leading to variations in the final calibrated parameters. I am suggesting we should use KGE as an objective function.

Currently, the left hand side of our SWAT-CUP interface looks like this:



Expand the “Calibration Inputs” by clicking on the + sign. This gives a list of different files, some of which cover the points mentioned above. Double clicking on the files opens them up in the right hand side.

Copy and paste the second set of parameters into `Par_inf.txt` in `SWAT_CUP` from `SWATCUPparameterExample.txt`, or from your final parameters after sensitivity analysis using `SUF12`, this basically replaces the top parameters in `par_inf.txt`, or you can paste above this.

Of course you now need to adjust the top line as you now have 24 (or however many you decide from the sensitivity analysis) parameters to adjust. In addition we want to run 2 simulations and 10 iterations to test if `SWAT_CUP` works:

```

par_inf.txt
par_inf.txt
Contains input parameters to be optimized and some PSO related parameters.

2 ..... : number of simulations
3 ..... : number of iterations
-1 ..... : behavioral threshold where solutions are collected to build model uncertainty
0.5 ..... : weight in the velocity calculation. The larger the weight the wider the search space
0 ..... : if 1 then a previous solution is used to start the search, if 0 then non is used

24 ..... : Number of Parameters (the program only reads the first 4 parameters or any number indicated here)

r_CN2.mgt ..... -0.90 ..... -0.1
r_SURLAG.bsn ..... -0.3 ..... 0.01
r_ALPHA_BF.gw ..... -0.2 ..... 0.01
r_REVAPMN.gw ..... -0.15 ..... 0.01
r_GW_REVAP.gw ..... -0.01 ..... 0.95
r_GWQMN.gw ..... -0.01 ..... 0.95
r_GW_DELAY.gw ..... -0.2 ..... 0.01
r_ESCO.hru ..... -0.9 ..... 0.01
r_EPCO.hru ..... -0.7 ..... 0.01
r_HRU_SLP.hru ..... -2.0 ..... -0.1
r_OV_N.hru ..... -0.01 ..... 0.2
a_CH_K2.rte ..... 0.01 ..... 2
r_SOL_AWC(1).sol ..... -0.3 ..... 0.01
r_SOL_AWC(2).sol ..... -0.01 ..... 0.2
r_SOL_AWC(3).sol ..... -0.01 ..... 0.2
r_SOL_AWC(4).sol ..... -0.2 ..... 0.01
r_SOL_AWC(5).sol ..... -0.15 ..... 0.01
r_SOL_AWC(6).sol ..... -0.7 ..... 0.01
r_SOL_K(1).sol ..... -0.3 ..... 0.01
r_SOL_K(2).sol ..... -0.1 ..... 0.1
r_SOL_K(3).sol ..... -0.2 ..... 0.01
r_SOL_K(4).sol ..... -0.01 ..... 0.3
r_SOL_K(5).sol ..... -0.01 ..... 0.2
r_SOL_K(6).sol ..... -0.01 ..... 0.2

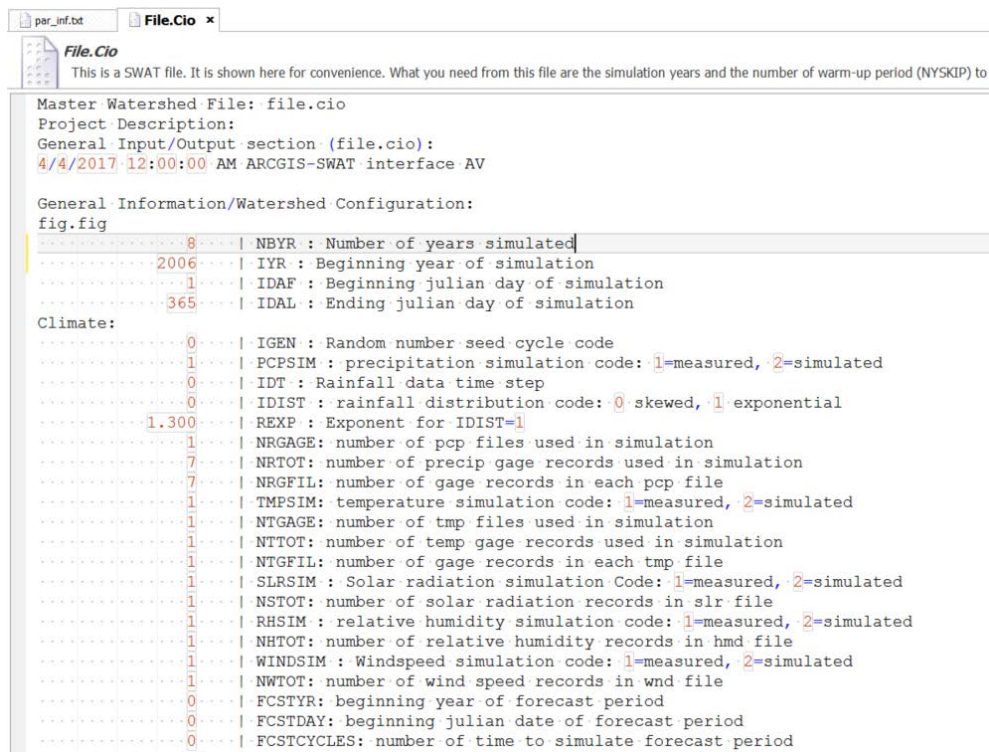
```

The parameters we choose are the curve number value for the whole catchment. We can do this for Cotter as we only have one landuse (FRST). We will go through how this would be different for other catchment. Note that this is a relative parameter. The next parameter is the SURLAG parameter which determines the delay for the local HRU runoff (generated by CN2) to reach the local stream. The ALPHA_BF parameter is basically the inverse of the residence time of the groundwater, so smaller values mean greater residence time. The parameter REVAPMN determines the minimum level of the groundwater for “REVAP” to occur, or water to flow back to the soil from the groundwater. You can look up the rest of the parameters on the slides that I have provided before.

File.cio

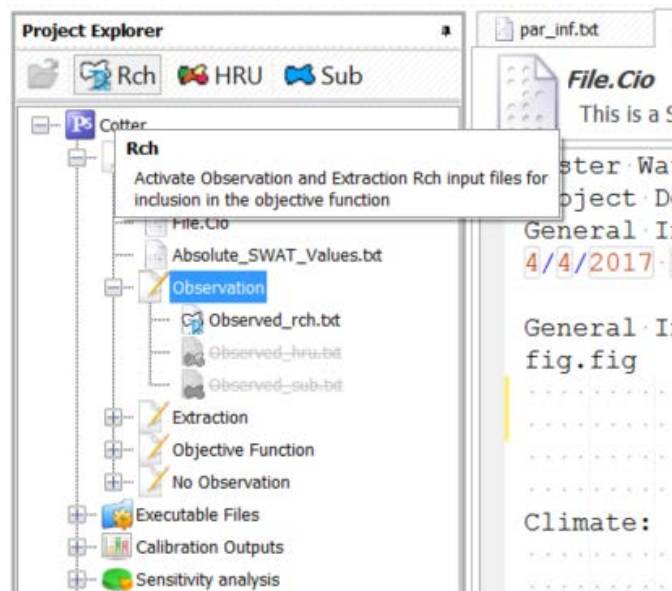
You need to have a look at File.cio. This is the main control file for SWAT and defines the period of the simulation and what output is being produced.

Check File.cio to make sure that you have set up a daily simulation, for 8 years (2006 - 2011) and that NYSKIP is set to 2. This also means that the ending day of the simulation is 365. Check also whether you are set to model daily data and not monthly data (IPRINT = 1).



Defining the observed data in PSO

Expanding the Observation item indicates three items that are crossed out. Basically these are observations at three different levels: Reach (Rch), Subbasin (Sub) and HRU that you can use in your calibration. You can activate any of them by clicking on the buttons higher up on the left side. As a first step we only want to activate the Rch component, as we only calibrate on Flow.



Observed_rch.txt

You can now open the Observed_rch.txt, which defines the data that will be used to calibrate the model. The data that exists in the file are example data. There are two things to work out, which reach number are we using for the calibration and how many days are we using for the

calibration. Looking back at File.cio and the model set-up, we know we only run the model for 8 years, of which two years are “warm-up”. A warm-up period is important for all larger hydrological models as this stabilises the initial conditions.

If you think back to our simple model, we made some guesses about the initial storage in the soil bucket and the initial storage in the groundwater. Up to a certain point in time, these choices affect the model outcomes. In the case of our simple model, this was only a few time steps, but in the case of a complex model this could be much longer. Therefore choosing two years as warm-up period puts you on the safe side.

In Observed_rch.txt we will fill in that we have:

- **1** observed variable (the flow at Paso Pache in Santa Lucia)
- **FLOW_OUT_1** will be the name of the variable but 28 is the subbasin where the outlet is, you can check this in ARCSWAT or QSWAT, but also in the fig.fig file in the txt files.
- **1386** is the number of data points

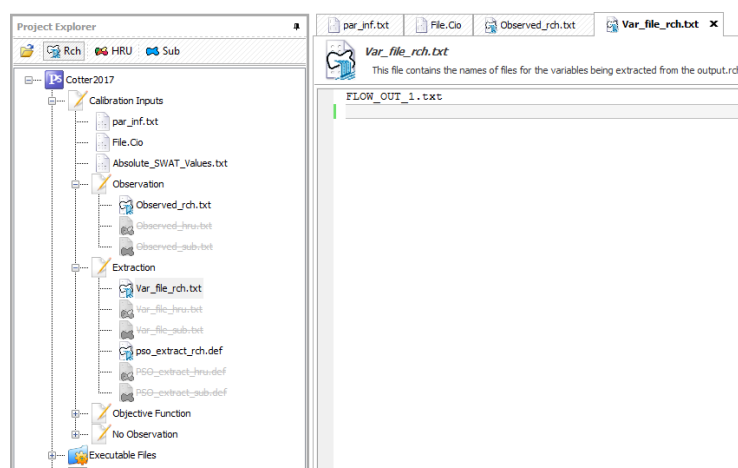
You then need to replace the rest of the file with the data which we have generated with the R script at the start. Clip the data from the file and replace all the info in the file. This is safer than actually replacing the file in the PSO directory

Click Save, or Save all to save your changes

Extraction component

Var_file_rch.txt

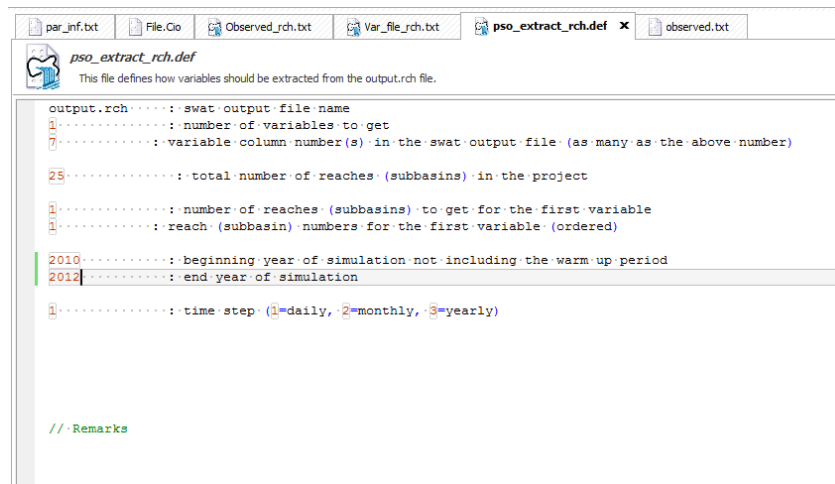
Now expand the “Extraction” component and open the Var_file_rch.txt. Basically this now list 4 variables from the example. You need to replace this with the one variable that we want to use: FLOW_OUT_1.txt



PSO_extract_rch.def

The next file to adjust is PSO_extract_rch.def. Fill in as below: 1 variable, column 7 (see comments in green), 31 reaches in the project, 1 to use and this is number 1.

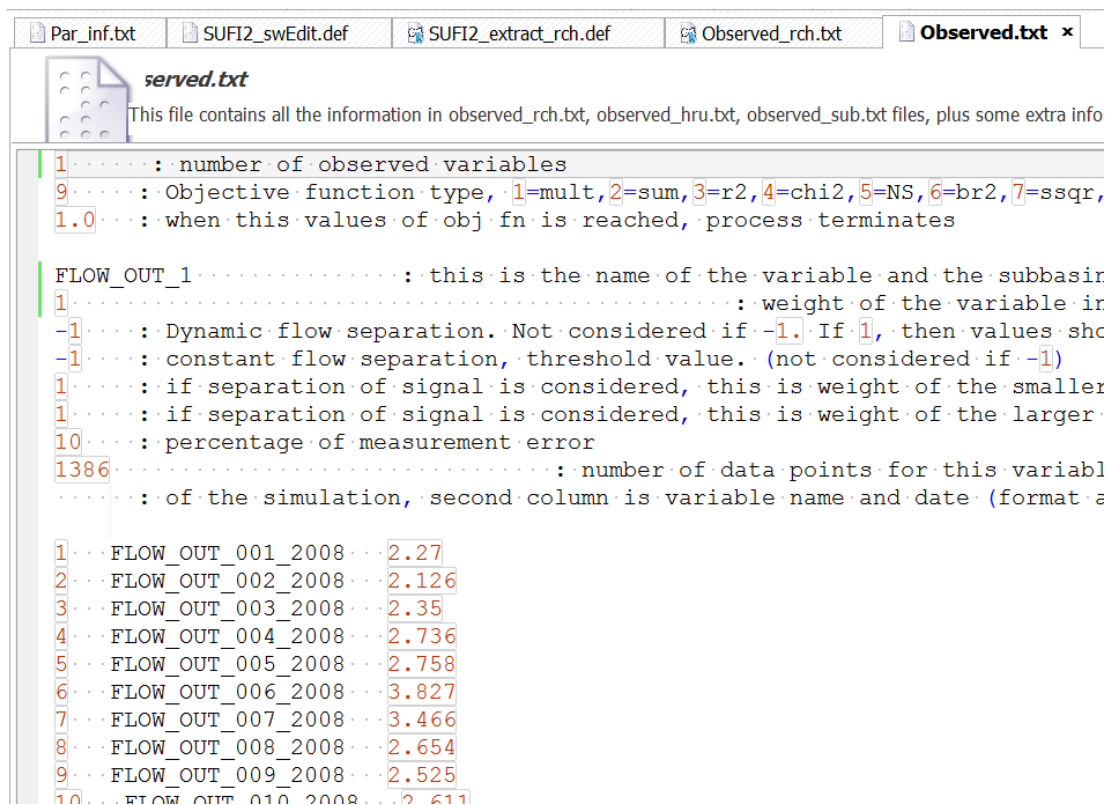
We are running 2008 – 2011 and on a daily time step.



Defining the Objective function: Observed.txt

Our last step is to define the objective function component. For this expand this section and open the Observed.txt file. First we will clip and paste the data from the file which we generated earlier with the R script in here.

Then we will adjust the top of the file:



We have:

- 1 observed variable
- We will use the KGE as our objective function (9). The other choices are highlighted in more detail on page 44 in the SWAT-CUP manual, but basically 1 is a multiplicative form of squared errors, while 2 is similar to a regular sum squared of errors, but allows different flow components to be assessed separately. The third option is the classic

coefficient of determination (r^2), while 4 is similar but based on the χ^2 distribution. Option 5 is the standard NSE. Option 6 uses the bias to force the relationship calculated based on r^2 closer to a 1:1 line, while option 7 uses the flood frequency curves. Option 9 is the KGE, which is a bias corrected version of the NSE. We will use this one.

- Set the next entry to 1 to make sure we capture sufficient model simulations.
- We will be using FLOW_OUT_1 as our observed values
- Don't worry about the 6 entries, which give further options to calculate objective functions and uncertainty.
- Finally we will use 1386 observations (or whatever else you generated in the R output)
- Below the top section you need to paste the observations from the Observed.txt that we generated with the R script earlier.

Save and move to the next file.

Var_file_name.txt

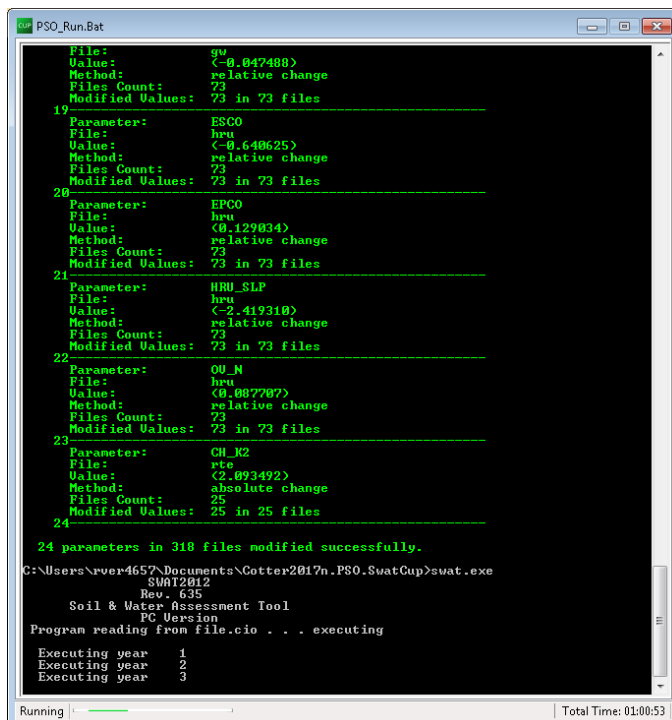
This is essentially the same as you did before. You just need 1 line with FLOW_OUT_1.txt

Again click *Save All*

Running SWAT-CUP Calibration

We are now able to run SWAT-CUP calibration, but we are only doing a test run with 10 simulations. The calibration is run through 2 "batch" files PSO_run.bat which runs the actual calibration, and PSO_post.bat, which does the file clean-up and makes all the output for you to see and analyse. A more detailed description of the program execution is on page 52 of the SWAT-CUP manual.

In our case we just press Execute all and this brings up a DOS box that runs PSO_run.bat. Press Y and OK. This will run for a little while (remember we only asked for 5 simulations), close the window when asked.



```

PSO_Run.Bat
File:          gm
Value:         <-0.047488>
Method:        relative change
Files Count:   73
Modified Values: 73 in 73 files

19
Parameter:     ESC0
File:          hrw
Value:         <-0.640625>
Method:        relative change
Files Count:   73
Modified Values: 73 in 73 files

20
Parameter:     EPC0
File:          hrw
Value:         <0.129034>
Method:        relative change
Files Count:   73
Modified Values: 73 in 73 files

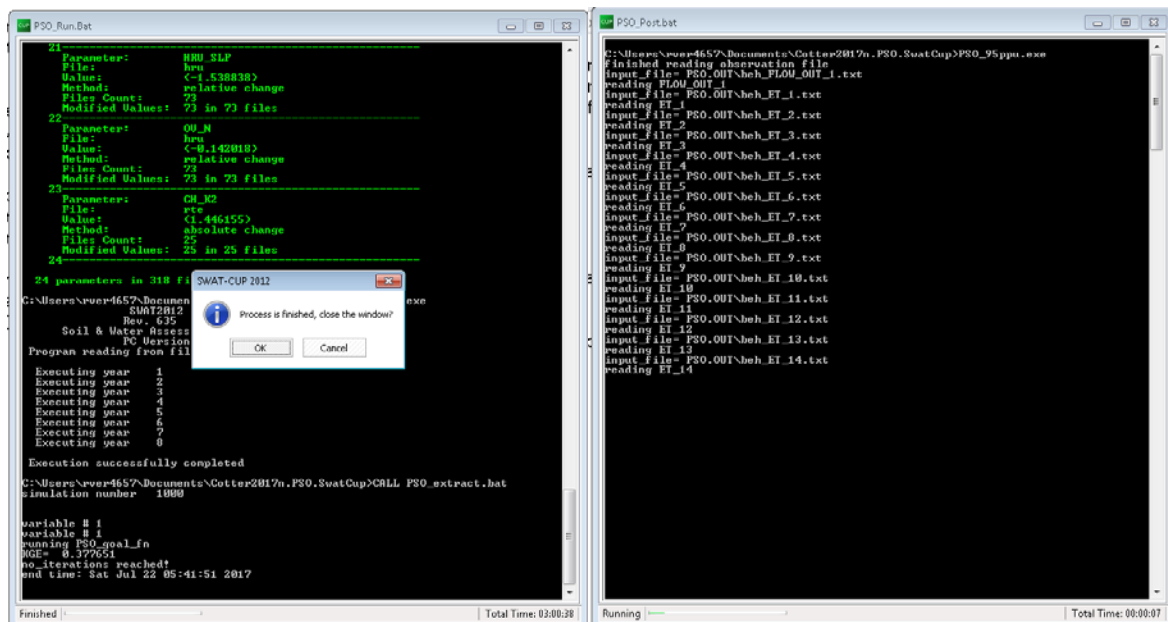
21
Parameter:     HRU_SLP
File:          hrw
Value:         <-2.419310>
Method:        relative change
Files Count:   73
Modified Values: 73 in 73 files

22
Parameter:     OU_N
File:          hrw
Value:         <0.007707>
Method:        relative change
Files Count:   73
Modified Values: 73 in 73 files

23
Parameter:     CH_K2
File:          rto
Value:         <2.093492>
Method:        absolute change
Files Count:   25
Modified Values: 25 in 25 files

24
24 parameters in 318 files modified successfully.
C:\Users\rver4657\Documents\Cotter2017n.PSO.SwatCup\swat.exe
SWAT2012
Rev. 635
Soil & Water Assessment Tool
PC Version
Program reading from file.cio . . . executing
Executing year 1
Executing year 2
Executing year 3

Running | Total Time: 01:00:53
  
```

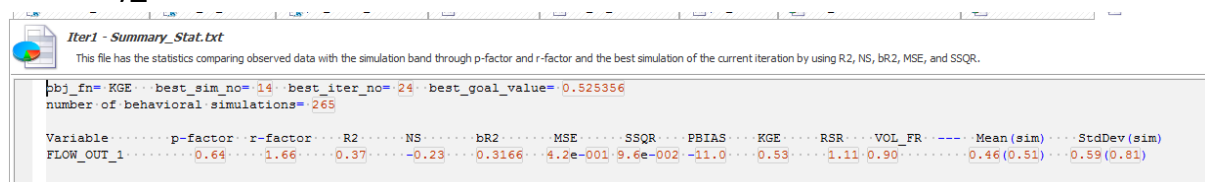
This confirms that we can run PSO correctly and we can move on to the real calibration and sensitivity analysis

Once everything runs, change par_inf.txt to 20 simulations and 30 iterations

Now hit Save All and Calibrate and Execute All. Now go and get a deserved cup of Mate or coffee (on my computer this took 41 minutes). Make sure you save your iteration

Inspecting the Calibration outputs

The next thing to do is to inspect the Calibration outputs. Start with looking at the Summary_Stat.txt file



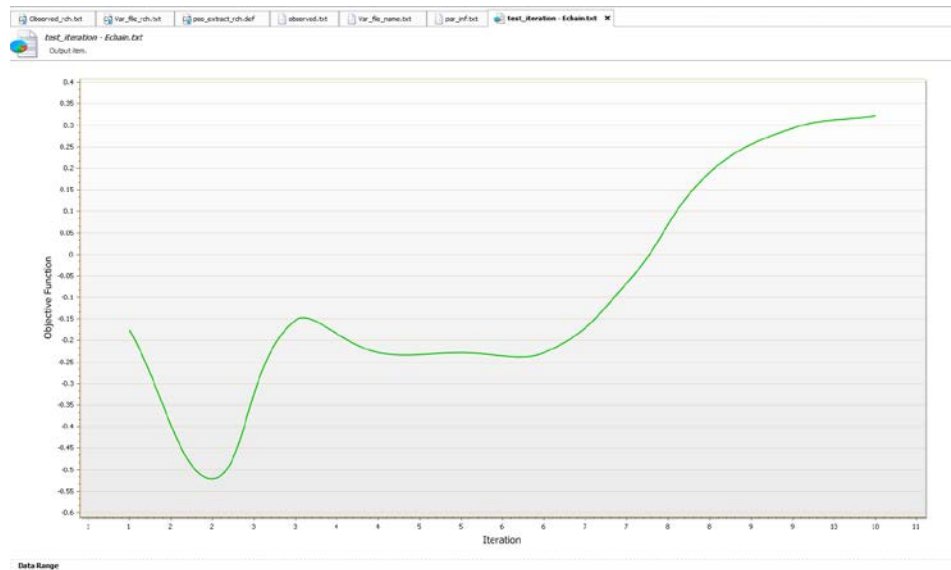
Do you consider this to be a good calibration? What would you base this on? Remember the difference between NSE, r^2 and KGE, see week 5. What objective function did you use again?

VOL_FR indicates the fraction of the overall water balance that is predicted, you want this to be 1. The p-factor relates to the fraction of observed data that is inside the 95% confidence intervals of the predictive uncertainty, while the r-factor is the width of the 95% prediction uncertainty. You want p-factor to be close to 1, and the r-factor to be close to 0.

You can then inspect is the 95ppu plot, which gives you a comparison of the observed and predicted and the 95% prediction uncertainty.

What is your final assessment of the initial calibration?

This is a screen shot of the initial evaluation chain. This indicates calibration is still not stabilized as the objective function is still changing (for only a few iterations)



Evaluation (Validation) of the SWAT model results using PSO in SWAT-CUP

This is fairly straight forward, you might almost say “simple”.

You need to generate the new observation files using the R scripts that we provided.

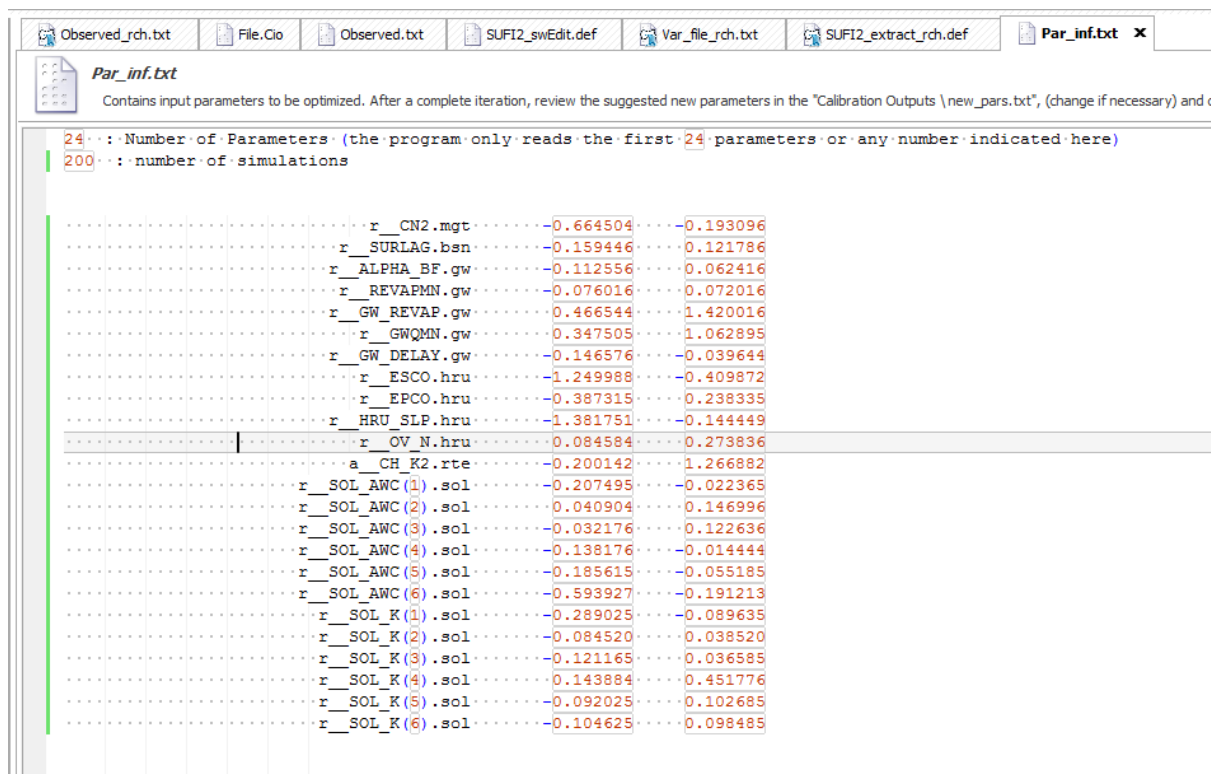
Going back to the top of the tree, we want to edit: “par_inf.txt”, “File.cio”, “observed_rch.txt” and “observed.txt”

First use the R script to generate new input files for SWAT, but now for a different time period, maybe 2008 – 2010.

par_inf.txt

For “par_inf.txt” go back to the file and clip and paste the parameter ranges from your “best parameters” in the calibration into the text view

Set the number of particles and the number of iterations both to 1.



Save all

observed_rch.txt

In observed_rch.txt we will fill in that we have:

- 1 observed variable (the flow at Paso Pache)
- **FLOW_OUT_1** will be the name of the variable, you can check this in ARCSWAT
- **Change the data**

You then need to replace the rest of the file with the data from the file you generated with the R script

Click Save, or Save all to save your changes

Adjusting Observed.txt

Next step is to adjust the Observed.txt file. There are a few things to change, which are obvious after the earlier changes. The example below gives some guidance.

Again we have:

- We will be using FLOW_OUT_1 as our observed values
- Below the top lines you need to replace the file again with the file you generated with the R script.

Adjusting File.cio

An important action is to adjust file.cio. As we said before, this is the main file that runs SWAT. Here we also have to change the years to simulate. Change the NBYR to whatever years you want to simulate, NYSKIP (towards the end) to 1. Change the beginning year of the simulation to your beginning year (using only 1 year “warm-up”)

Then, you can just rerun the “calibration” using the “calibrate all” button and analyse the results as the validation.