



# BPL\_TEST2\_Batch\_calibration script with PyFMI ver 2.9.8

The key library PyFMI ver 2.9.8 is installed.

After the installation a small application BPL\_TEST2\_Batch\_calibration is loaded and run. You can continue with this example if you like.

```
In [ ]: !lsb_release -a # Actual VM Ubuntu version used by Google
```

```
No LSB modules are available.  
Distributor ID: Ubuntu  
Description:    Ubuntu 20.04.5 LTS  
Release:        20.04  
Codename:       focal
```

```
In [ ]: %env PYTHONPATH=
```

```
env: PYTHONPATH=
```

```
In [ ]: !wget https://repo.anaconda.com/miniconda/Miniconda3-py38_22.11.1-1-Linux  
!chmod +x Miniconda3-py38_22.11.1-1-Linux-x86_64.sh  
!bash ./Miniconda3-py38_22.11.1-1-Linux-x86_64.sh -b -f -p /usr/local  
import sys  
sys.path.append('/usr/local/lib/python3.8/site-packages/')
```

```
--2023-03-13 11:15:16-- https://repo.anaconda.com/miniconda/Miniconda3-
py38_22.11.1-1-Linux-x86_64.sh
Resolving repo.anaconda.com (repo.anaconda.com)... 104.16.130.3, 104.16.
131.3, 2606:4700::6810:8203, ...
Connecting to repo.anaconda.com (repo.anaconda.com)|104.16.130.3|:443...
connected.
HTTP request sent, awaiting response... 200 OK
Length: 64630241 (62M) [application/x-sh]
Saving to: 'Miniconda3-py38_22.11.1-1-Linux-x86_64.sh'
```

```
Miniconda3-py38_22. 100%[=====>] 61.64M 34.7MB/s in
1.8s
```

```
2023-03-13 11:15:18 (34.7 MB/s) - 'Miniconda3-py38_22.11.1-1-Linux-x86_6
4.sh' saved [64630241/64630241]
```

```
PREFIX=/usr/local
Unpacking payload ...
```

```
Installing base environment...
```

```
Downloading and Extracting Packages
```

```
Downloading and Extracting Packages
```

```
Preparing transaction: - \ | / done
Executing transaction: \ | / - \ | / - \ | / - \
| / - \ | / - \ | / - \ | /
- \ | / - \ | done
installation finished.
```

```
In [ ]: !conda update -n base -c defaults conda --yes
```

```
Collecting package metadata (current_repodata.json): - \ | / -
\ | / - \ | / - \ | / - \ |
/ - \ | done
Solving environment: - \ | / - \ | / - \ done
```

### ## Package Plan ##

environment location: /usr/local

added / updated specs:

- conda

The following packages will be downloaded:

package	build	
ca-certificates-2023.01.10	h06a4308_0	120 KB
conda-23.1.0	py38h06a4308_0	942 KB
conda-package-handling-2.0.2	py38h06a4308_0	267 KB
conda-package-streaming-0.7.0	py38h06a4308_0	26 KB
cryptography-39.0.1	py38h9ce1e76_0	1.4 MB
ncurses-6.4	h6a678d5_0	914 KB
openssl-1.1.1t	h7f8727e_0	3.7 MB
pyopenssl-23.0.0	py38h06a4308_0	96 KB
sqlite-3.40.1	h5082296_0	1.2 MB
urllib3-1.26.14	py38h06a4308_0	196 KB
xz-5.2.10	h5eee18b_1	429 KB
zstandard-0.19.0	py38h5eee18b_0	474 KB
Total:		9.7 MB

The following NEW packages will be INSTALLED:

```
conda-package-str~ pkgs/main/linux-64::conda-package-streaming-0.7.0-p
y38h06a4308_0
zstandard          pkgs/main/linux-64::zstandard-0.19.0-py38h5eee18b_0
```

The following packages will be UPDATED:

```
ca-certificates      2022.10.11-h06a4308_0 --> 2023.01.
10-h06a4308_0
conda                22.11.1-py38h06a4308_4 --> 23.1.0-p
y38h06a4308_0
conda-package-han~   1.9.0-py38h5eee18b_1 --> 2.0.2-py
38h06a4308_0
cryptography         38.0.1-py38h9ce1e76_0 --> 39.0.1-p
y38h9ce1e76_0
ncurses              6.3-h5eee18b_3 --> 6.4-h6a6
78d5_0
openssl              1.1.1s-h7f8727e_0 --> 1.1.1t-h
7f8727e_0
pyopenssl            pkgs/main/noarch::pyopenssl-22.0.0-py~ --> pkgs/mai
n/linux-64::pyopenssl-23.0.0-py38h06a4308_0
sqlite               3.40.0-h5082296_0 --> 3.40.1-h
5082296_0
urllib3              1.26.13-py38h06a4308_0 --> 1.26.14-
py38h06a4308_0
xz                   5.2.8-h5eee18b_0 --> 5.2.10-h
5eee18b_1
```

Downloading and Extracting Packages

ca-certificates-2023	120 KB	:	0% 0/1 [00:00<?, ?it/s]
pyopenssl-23.0.0	96 KB	:	0% 0/1 [00:00<?, ?it/s]
openssl-1.1.1t	3.7 MB	:	0% 0/1 [00:00<?, ?it/s]
conda-package-stream	26 KB	:	0% 0/1 [00:00<?, ?it/s]
xz-5.2.10	429 KB	:	0% 0/1 [00:00<?, ?it/s]
urllib3-1.26.14	196 KB	:	0% 0/1 [00:00<?, ?it/s]
ncurses-6.4	914 KB	:	0% 0/1 [00:00<?, ?it/s]
conda-23.1.0	942 KB	:	0% 0/1 [00:00<?, ?it/s]
cryptography-39.0.1	1.4 MB	:	0% 0/1 [00:00<?, ?it/s]
conda-package-handli	267 KB	:	0% 0/1 [00:00<?, ?it/s]
zstandard-0.19.0	474 KB	:	0% 0/1 [00:00<?, ?it/s]

sqlite-3.40.1	1.2 MB	: 0% 0/1 [00:00<?, ?it/s]
pyopenssl-23.0.0	96 KB	: 100% 0.997473440686737/1 [00:00<00:00, 9.95it/s]
openssl-1.1.1t	3.7 MB	: 2% 0.01671962984960089/1 [00:00<00:05, 6.05s/it]
xz-5.2.10	429 KB	: 19% 0.18633724038004426/1 [00:00<00:00, 1.79it/s]
ncurses-6.4	914 KB	: 2% 0.01750655534161504/1 [00:00<00:06, 6.16s/it]
conda-23.1.0	942 KB	: 2% 0.016977341093890375/1 [00:00<00:06, 6.89s/it]
urllib3-1.26.14	196 KB	: 8% 0.0816656116198043/1 [00:00<00:01, 1.46s/it]
conda-package-stream	26 KB	: 100% 1.0/1 [00:00<00:00, 5.93it/s]
conda-package-stream	26 KB	: 100% 1.0/1 [00:00<00:00, 5.93it/s]
cryptography-39.0.1	1.4 MB	: 1% 0.011057830211282578/1 [00:00<00:15, 15.54s/it]

conda-package-handli	267 KB	:	6%	0.05994701947985423/1	[00:00<00:02, 3.09s/it]
openssl-1.1.1t	3.7 MB	:	28%	0.27587389251841465/1	[00:00<00:00, 1.58it/s]
zstandard-0.19.0	474 KB	:	3%	0.033766335474643305/1	[00:00<00:06, 6.85s/it]
ca-certificates-2023	120 KB	:	100%	1.0/1	[00:00<00:00, 3.91it/s]
openssl-1.1.1t	3.7 MB	:	90%	0.8986801044160477/1	[00:00<00:00, 3.69it/s]
pyopenssl-23.0.0	96 KB	:	100%	1.0/1	[00:00<00:00, 9.95it/s]
xz-5.2.10	429 KB	:	100%	1.0/1	[00:00<00:00, 2.96it/s]
xz-5.2.10	429 KB	:	100%	1.0/1	[00:00<00:00, 2.96it/s]
urllib3-1.26.14	196 KB	:	100%	1.0/1	[00:00<00:00, 2.79it/s]
urllib3-1.26.14	196 KB	:	100%	1.0/1	[00:00<00:00, 2.79it/s]

conda-23.1.0	942 KB	: 100% 1.0/1 [00:00<00:00, 2.32it/s]
conda-23.1.0	942 KB	: 100% 1.0/1 [00:00<00:00, 2.32it/s]
ncurses-6.4	914 KB	: 100% 1.0/1 [00:00<00:00, 1.49it/s]
ncurses-6.4	914 KB	: 100% 1.0/1 [00:00<00:00, 1.49it/s]
conda-package-handli	267 KB	: 100% 1.0/1 [00:00<00:00, 1.45it/s]
conda-package-handli	267 KB	: 100% 1.0/1 [00:00<00:00, 1.45it/s]
cryptography-39.0.1	1.4 MB	: 100% 1.0/1 [00:00<00:00, 1.31it/s]
cryptography-39.0.1	1.4 MB	: 100% 1.0/1 [00:00<00:00, 1.31it/s]

zstandard-0.19.0 | 474 KB | : 100% 1.0/1 [00:00<00:00, 1.27it/s]

zstandard-0.19.0 | 474 KB | : 100% 1.0/1 [00:00<00:00, 1.27it/s]

sqlite-3.40.1 | 1.2 MB | : 100% 1.0/1 [00:00<00:00, 1.20it/s]

sqlite-3.40.1 | 1.2 MB | : 100% 1.0/1 [00:00<00:00, 1.20it/s]



```
Preparing transaction: / - \ done
Verifying transaction: / - \ | / - \ | done
Executing transaction: - \ | / - \ | done
```

```
In [ ]: !conda --version
        !python --version
```

```
conda 23.1.0
Python 3.8.15
```

```
In [ ]: !conda install -c conda-forge pyfmi=2.9.8 --yes # Install the key package
```

Solving environment: - failed with initial frozen solve. Retrying with flexible solve.

[illegible]

[illegible]



_libgcc_mutex-0.1 forge		conda_forge	3 KB	conda-
_openmp_mutex-4.5 forge		2_kmp_llvm	6 KB	conda-
assimulo-3.4 forge		py38ha96dddf_0	1.9 MB	conda-
ca-certificates-2022.12.7 forge		ha878542_0	143 KB	conda-
certifi-2022.12.7 forge		pyhd8ed1ab_0	147 KB	conda-
conda-23.1.0 forge		py38h578d9bd_0	907 KB	conda-
fmilib-2.4.1 forge		h27087fc_0	545 KB	conda-
gmp-6.2.1 forge		h58526e2_0	806 KB	conda-
icu-68.2 forge		h9c3ff4c_0	13.1 MB	conda-
libblas-3.9.0 a-forge		16_linux64_openblas	13 KB	cond
libcbblas-3.9.0 a-forge		16_linux64_openblas	13 KB	cond
libgcc-ng-12.2.0 forge		h65d4601_19	931 KB	conda-
libgfortran-ng-12.2.0 forge		h69a702a_19	22 KB	conda-
libgfortran5-12.2.0 forge		h337968e_19	1.8 MB	conda-
libiconv-1.17 forge		h166bdaf_0	1.4 MB	conda-
liblapack-3.9.0 a-forge		16_linux64_openblas	13 KB	cond
libopenblas-0.3.21 a-forge		pthread_h78a6416_3	10.1 MB	cond
libstdcxx-ng-12.2.0 forge		h46fd767_19	4.3 MB	conda-
libxml2-2.9.12 forge		h72842e0_0	772 KB	conda-
libxslt-1.1.33 forge		h15afd5d_2	522 KB	conda-
llvm-openmp-12.0.1 forge		h4bd325d_1	2.8 MB	conda-
lxml-4.8.0 forge		py38h0a891b7_2	1.4 MB	conda-
metis-5.1.0 forge		h58526e2_1006	4.1 MB	conda-
mpfr-4.2.0 forge		hb012696_0	616 KB	conda-
numpy-1.24.2 forge		py38h10c12cc_0	6.3 MB	conda-
openssl-1.1.1t forge		h0b41bf4_0	1.9 MB	conda-
packaging-23.0 forge		pyhd8ed1ab_0	40 KB	conda-
platformdirs-3.1.1 forge		pyhd8ed1ab_0	17 KB	conda-
pooch-1.7.0 forge		pyhd8ed1ab_0	49 KB	conda-
pyfmi-2.9.8 forge		py38h26c90d9_1	12.7 MB	conda-

python_abi-3.8		2_cp38	4 KB	conda-
forge				
scipy-1.10.1		py38h10c12cc_0	23.6 MB	conda-
forge				
suitesparse-5.10.1		h9e50725_1	2.4 MB	conda-
forge				
sundials-6.5.0		h6250759_0	823 KB	conda-
forge				
tbb-2021.7.0		h924138e_0	2.0 MB	conda-
forge				
typing-extensions-4.5.0		hd8ed1ab_0	9 KB	conda-
forge				
typing_extensions-4.5.0		pyha770c72_0	31 KB	conda-
forge				
-----				
Total:			96.0 MB	

The following NEW packages will be INSTALLED:

assimulo	conda-forge/linux-64::assimulo-3.4-py38ha96dddf_0
fmilib	conda-forge/linux-64::fmilib-2.4.1-h27087fc_0
gmp	conda-forge/linux-64::gmp-6.2.1-h58526e2_0
icu	conda-forge/linux-64::icu-68.2-h9c3ff4c_0
libblas	conda-forge/linux-64::libblas-3.9.0-16_linux64_open
blas	
libcbblas	conda-forge/linux-64::libcbblas-3.9.0-16_linux64_ope
nblas	
libgfortran-ng	conda-forge/linux-64::libgfortran-ng-12.2.0-h69a702
a_19	
libgfortran5	conda-forge/linux-64::libgfortran5-12.2.0-h337968e_
19	
libiconv	conda-forge/linux-64::libiconv-1.17-h166bdaf_0
liblapack	conda-forge/linux-64::liblapack-3.9.0-16_linux64_op
enblas	
libopenblas	conda-forge/linux-64::libopenblas-0.3.21-pthreads_h
78a6416_3	
libxml2	conda-forge/linux-64::libxml2-2.9.12-h72842e0_0
libxslt	conda-forge/linux-64::libxslt-1.1.33-h15afd5d_2
llvm-openmp	conda-forge/linux-64::llvm-openmp-12.0.1-h4bd325d_1
lxml	conda-forge/linux-64::lxml-4.8.0-py38h0a891b7_2
metis	conda-forge/linux-64::metis-5.1.0-h58526e2_1006
mpfr	conda-forge/linux-64::mpfr-4.2.0-hb012696_0
numpy	conda-forge/linux-64::numpy-1.24.2-py38h10c12cc_0
packaging	conda-forge/noarch::packaging-23.0-pyhd8ed1ab_0
platformdirs	conda-forge/noarch::platformdirs-3.1.1-pyhd8ed1ab_0
pooch	conda-forge/noarch::pooch-1.7.0-pyhd8ed1ab_0
pyfmi	conda-forge/linux-64::pyfmi-2.9.8-py38h26c90d9_1
python_abi	conda-forge/linux-64::python_abi-3.8-2_cp38
scipy	conda-forge/linux-64::scipy-1.10.1-py38h10c12cc_0
suitesparse	conda-forge/linux-64::suitesparse-5.10.1-h9e50725_1
sundials	conda-forge/linux-64::sundials-6.5.0-h6250759_0
tbb	conda-forge/linux-64::tbb-2021.7.0-h924138e_0
typing-extensions	conda-forge/noarch::typing-extensions-4.5.0-hd8ed1a
b_0	
typing_extensions	conda-forge/noarch::typing_extensions-4.5.0-pyha770
c72_0	

The following packages will be REMOVED:

libgomp-11.2.0-h1234567\_1

The following packages will be UPDATED:

```
libgcc-ng          pkgs/main::libgcc-ng-11.2.0-h1234567_1 --> conda-forge::libgcc-ng-12.2.0-h65d4601_19
libstdcxx-ng       pkgs/main::libstdcxx-ng-11.2.0-h12345~ --> conda-forge::libstdcxx-ng-12.2.0-h46fd767_19
```

The following packages will be SUPERSEDED by a higher-priority channel:

```
_libgcc_mutex      pkgs/main::_libgcc_mutex-0.1-main --> conda-forge::_libgcc_mutex-0.1-conda_forge
_openmp_mutex       pkgs/main::_openmp_mutex-5.1-1_gnu --> conda-forge::_openmp_mutex-4.5-2_kmp_llvm
ca-certificates     pkgs/main::ca-certificates-2023.01.10~ --> conda-forge::ca-certificates-2022.12.7-ha878542_0
certifi             pkgs/main/linux-64::certifi-2022.12.7~ --> conda-forge/noarch::certifi-2022.12.7-pyhd8ed1ab_0
conda               pkgs/main::conda-23.1.0-py38h06a4308_0 --> conda-forge::conda-23.1.0-py38h578d9bd_0
openssl            pkgs/main::openssl-1.1.1t-h7f8727e_0 --> conda-forge::openssl-1.1.1t-h0b41bf4_0
```

#### Downloading and Extracting Packages

```
openssl-1.1.1t      | 1.9 MB      | :    0% 0/1 [00:00<?, ?it/s]
tbb-2021.7.0        | 2.0 MB      | :    0% 0/1 [00:00<?, ?it/s]
```

```
_libgcc_mutex-0.1  | 3 KB        | :    0% 0/1 [00:00<?, ?it/s]
```

```
liblapack-3.9.0     | 13 KB       | :    0% 0/1 [00:00<?, ?it/s]
```

```
libgcc-ng-12.2.0    | 931 KB      | :    0% 0/1 [00:00<?, ?it/s]
```

```
icu-68.2            | 13.1 MB     | :    0% 0/1 [00:00<?, ?it/s]
```

```
libstdcxx-ng-12.2.0 | 4.3 MB      | :    0% 0/1 [00:00<?, ?it/s]
```

```
libopenblas-0.3.21  | 10.1 MB     | :    0% 0/1 [00:00<?, ?it/s]
```

mpfr-4.2.0	616 KB	:	0% 0/1 [00:00<?, ?it/s]
certifi-2022.12.7	147 KB	:	0% 0/1 [00:00<?, ?it/s]
ca-certificates-2022	143 KB	:	0% 0/1 [00:00<?, ?it/s]
sundials-6.5.0	823 KB	:	0% 0/1 [00:00<?, ?it/s]
_openmp_mutex-4.5	6 KB	:	0% 0/1 [00:00<?, ?it/s]
typing_extensions-4.	31 KB	:	0% 0/1 [00:00<?, ?it/s]



libcbblas-3.9.0 | 13 KB | : 0% 0/1 [00:00<?, ?it/s]

suitesparse-5.10.1 | 2.4 MB | : 0% 0/1 [00:00<?, ?it/s]

numpy-1.24.2 | 6.3 MB | : 0% 0/1 [00:00<?, ?it/s]

libgfortran-ng-12.2. | 22 KB | : 0% 0/1 [00:00<?, ?it/s]

gmp-6.2.1 | 806 KB | : 0% 0/1 [00:00<?, ?it/s]

... (more hidden) ...  
tbb-2021.7.0 | 2.0 MB | : 1% 0.007970693689705332/1 [00:00<00:14, 14.57s/it]  
\_libgcc\_mutex-0.1 | 3 KB | : 100% 1.0/1 [00:00<00:00, 8.66it/s]  
  
openssl-1.1.1t | 1.9 MB | : 1% 0.00837250278759782/1 [00:00<00:15, 15.66s/it]  
  
liblapack-3.9.0 | 13 KB | : 100% 1.0/1 [00:00<00:00, 7.83it/s]  
  
icu-68.2 | 13.1 MB | : 0% 0.0011897319682882405/1 [00:00<02:10, 130.57s/it]  
\_libgcc\_mutex-0.1 | 3 KB | : 100% 1.0/1 [00:00<00:00, 8.66it/s]

libstdcxx-ng-12.2.0	4.3 MB	:	0% 0.003642462432659798/1	[00:00<00:45, 45.20s/it]
openssl-1.1.1t	1.9 MB	:	65% 0.6530552174326301/1	[00:00<00:00, 3.39it/s]
libopenblas-0.3.21	10.1 MB	:	0% 0.0015489208557598652/1	[00:00<00:37, 157.70s/it]
icu-68.2	13.1 MB	:	8% 0.07614284597044739/1	[00:00<00:02, 2.82s/it]
liblapack-3.9.0	13 KB	:	100% 1.0/1	[00:00<00:00, 7.83it/s]
libstdcxx-ng-12.2.0	4.3 MB	:	25% 0.25132990785352605/1	[00:00<00:00, 1.15it/s]
mpfr-4.2.0	616 KB	:	3% 0.02596525815495161/1	[00:00<00:10, 10.95s/it]
certifi-2022.12.7	147 KB	:	11% 0.10862920603348251/1	[00:00<00:02, 2.91s/it]
libopenblas-0.3.21	10.1 MB	:	16% 0.15798992728750624/1	[00:00<00:01, 1.73s/it]

ca-certificates-2022 | 143 KB | : 11% 0.11222532741520083/1 [00:00<0  
0:02, 3.16s/it]

sundials-6.5.0 | 823 KB | : 2% 0.019441876691700773/1 [00:00<  
00:18, 18.41s/it]

icu-68.2 | 13.1 MB | : 17% 0.16656247556035367/1 [00:00<0  
0:01, 1.75s/it]

libstdcxx-ng-12.2.0 | 4.3 MB | : 55% 0.5500118273316295/1 [00:00<0  
0:00, 1.86it/s]

\_openmp\_mutex-4.5 | 6 KB | : 100% 1.0/1 [00:00<00:00, 2.54it/s]

libcblas-3.9.0 | 13 KB | : 100% 1.0/1 [00:00<00:00, 2.36it/s]

typing\_extensions-4. | 31 KB | : 52% 0.5229993296517381/1 [00:00<0  
0:00, 1.22it/s]

libopenblas-0.3.21 | 10.1 MB | : 29% 0.286550358315575/1 [00:00<00:  
00, 1.22s/it]

suitesparse-5.10.1 | 2.4 MB | : 1% 0.006510694523092818/1 [00:00<  
01:10, 70.48s/it]

icu-68.2 | 13.1 MB | : 29% 0.2879151363257542/1 [00:00<0  
0:00, 1.25s/it]

numpy-1.24.2 | 6.3 MB | : 0% 0.00246386425166665/1 [00:00<0  
3:08, 188.88s/it]

```
libstdc++-ng-12.2.0 | 4.3 MB | : 94% 0.9361128451935681/1 [00:00<0  
0:00, 2.58it/s]
```

```
libgfortran-ng-12.2. | 22 KB | : 72% 0.7159587484705471/1 [00:00<0  
0:00, 1.35it/s]
```

```
libopenblas-0.3.21 | 10.1 MB | : 40% 0.3965237390745255/1 [00:00<0  
0:00, 1.10s/it]
```

```
suitesparse-5.10.1 | 2.4 MB | : 57% 0.5664304235090752/1 [00:00<0  
0:00, 1.34it/s]
```

```
icu-68.2 | 13.1 MB | : 41% 0.40926779709115474/1 [00:00<0  
0:00, 1.07s/it]
```

gmp-6.2.1 | 806 KB | : 2% 0.019840539414665338/1 [00:00<00:27, 28.26s/it]

numpy-1.24.2 | 6.3 MB | : 30% 0.30305530295499794/1 [00:00<00:00, 1.41s/it]

libopenblas-0.3.21 | 10.1 MB | : 56% 0.5576115080735514/1 [00:00<00:00, 1.13it/s]

... (more hidden) ...

icu-68.2 | 13.1 MB | : 55% 0.5544150972223201/1 [00:00<0  
0:00, 1.09it/s]

numpy-1.24.2 | 6.3 MB | : 49% 0.49277285033332996/1 [00:00<0  
0:00, 1.01s/it]

libopenblas-0.3.21 | 10.1 MB | : 68% 0.6846230182458604/1 [00:00<0  
0:00, 1.15it/s]

numpy-1.24.2 | 6.3 MB | : 72% 0.7219122257383284/1 [00:00<0  
0:00, 1.30it/s]

icu-68.2 | 13.1 MB | : 67% 0.6674396342097029/1 [00:00<0  
0:00, 1.03it/s]

libopenblas-0.3.21 | 10.1 MB | : 86% 0.8565532332352054/1 [00:00<0  
0:00, 1.32it/s]



icu-68.2 | 13.1 MB | : 80% 0.7983101507214093/1 [00:00<0  
0:00, 1.10it/s]

numpy-1.24.2 | 6.3 MB | : 96% 0.9584431938983268/1 [00:00<0  
0:00, 1.55it/s]

openssl-1.1.1t | 1.9 MB | : 100% 1.0/1 [00:01<00:00, 3.39it/s]

libgcc-ng-12.2.0 | 931 KB | : 100% 1.0/1 [00:01<00:00, 1.14s/it]

libgcc-ng-12.2.0 | 931 KB | : 100% 1.0/1 [00:01<00:00, 1.14s/it]

mpfr-4.2.0 | 616 KB | : 100% 1.0/1 [00:01<00:00, 1.31s/it]

mpfr-4.2.0 | 616 KB | : 100% 1.0/1 [00:01<00:00, 1.31s/it]

certifi-2022.12.7 | 147 KB | : 100% 1.0/1 [00:01<00:00, 1.39s/it]

certifi-2022.12.7 | 147 KB | : 100% 1.0/1 [00:01<00:00, 1.39s/it]

ca-certificates-2022 | 143 KB | : 100% 1.0/1 [00:01<00:00, 1.51s/it]

ca-certificates-2022 | 143 KB | : 100% 1.0/1 [00:01<00:00, 1.51s/it]

sundials-6.5.0 | 823 KB | : 100% 1.0/1 [00:01<00:00, 1.74s/it]

sundials-6.5.0 | 823 KB | : 100% 1.0/1 [00:01<00:00, 1.74s/it]

\_openmp\_mutex-4.5 | 6 KB | : 100% 1.0/1 [00:01<00:00, 2.54it/s]

libcblas-3.9.0 | 13 KB | : 100% 1.0/1 [00:01<00:00, 2.36it/s]

typing\_extensions-4. | 31 KB | : 100% 1.0/1 [00:01<00:00, 2.16s/it]

typing\_extensions-4. | 31 KB | : 100% 1.0/1 [00:01<00:00, 2.16s/it]  
tbb-2021.7.0 | 2.0 MB | : 100% 1.0/1 [00:02<00:00, 2.59s/it]  
tbb-2021.7.0 | 2.0 MB | : 100% 1.0/1 [00:02<00:00, 2.59s/it]

libgfortran-ng-12.2. | 22 KB | : 100% 1.0/1 [00:02<00:00, 2.62s/it]

libgfortran-ng-12.2. | 22 KB | : 100% 1.0/1 [00:02<00:00, 2.62s/it]

gmp-6.2.1 | 806 KB | : 100% 1.0/1 [00:02<00:00, 2.38s/it]

gmp-6.2.1 | 806 KB | : 100% 1.0/1 [00:02<00:00, 2.38s/it]

libstdcxx-ng-12.2.0 | 4.3 MB | : 100% 1.0/1 [00:03<00:00, 2.58it/s]

... (more hidden) ...

... (more hidden) ...

suitesparse-5.10.1 | 2.4 MB | : 100% 1.0/1 [00:03<00:00, 4.28s/it]

suitesparse-5.10.1 | 2.4 MB | : 100% 1.0/1 [00:03<00:00, 4.28s/it]

numpy-1.24.2 | 6.3 MB | : 100% 1.0/1 [00:06<00:00, 1.55it/s]

libopenblas-0.3.21 | 10.1 MB | : 100% 1.0/1 [00:13<00:00, 28.16s/it]

libopenblas-0.3.21 | 10.1 MB | : 100% 1.0/1 [00:13<00:00, 28.16s/it]

icu-68.2 | 13.1 MB | : 100% 1.0/1 [00:15<00:00, 1.22it/s]













```

Preparing transaction: - \ | done
Verifying transaction: - \ | / - \ | / done
Executing transaction: \ | / - \ | / - \ | / - \
| / - \ | / - \ | / - done

```

Now specific installation and the run simulations. Start with connecting to Github. Then upload the four files:

- FMU - BPL\_TEST2\_Batch\_linux\_om\_me.fmu
- Setup-file - BPL\_TEST2\_Batch\_explore.py

```
In [ ]: %%bash
git clone https://github.com/janpeter19/BPL_TEST2_Batch_calibration
```

```
Cloning into 'BPL_TEST2_Batch_calibration'...
```

```
In [ ]: %cd BPL_TEST2_Batch_calibration
/content/BPL_TEST2_Batch_calibration
```

## BPL\_TEST2\_Batch\_calibration - demo

Author: Jan Peter Axelsson

This notebook shows the possibilities for calibration of the model BPL\_TEST2\_Batch using `scipy.optimize.minimize()` routine. There are several different methods to choose between. In this notebook we work with simulated data.

The text-book model of batch cultivation we simulate is the following where  $S$  is substrate,  $X$  is cell concentration, and  $V$  is volume of the broth

$$\frac{d(VS)}{dt} = -q_S(S) \cdot VX$$

$$\frac{d(VX)}{dt} = \mu(S) \cdot VX$$

and where specific cell growth rate  $\mu$  and substrate uptake rate  $q_S$  are

$$\mu(S) = Y \cdot q_S(S)$$

$$q_S(S) = q_S^{max} \frac{S}{K_s + S}$$

where  $Y$  is the yield,  $q_S^{max}$  is the maximal specific substrate uptake rate and  $K_s$  is the corresponding saturation constant.

The parameter estimation is done with optimization methods that only require evaluation of the mismatch between simulation with given parameters and data. At start the allowed range for each parameter is given. The method used for optimization is Nelder-Mead but can easily be changed [1].

In the near future the FMU may provide first derivative gradient information, that will make it possible to choose corresponding method of `minimize()` for improved performance. This possibility is related to the upgrade to the FMI-standard ver 3.0 for the Modelica compiler.

The Python package PyFMI [2] that is the base for FMU-explore has a simplified built-in functionality for parameter estimation that also use `scipy.optimize.minimize()`. However, there is estimation functionality but the purpose seems to only address smaller examples. There is for instance no support to handle models that takes sub-models from libraries and necessary changes of default parameters not to be estimated. Therefore we here define a Python function `evaluate()` that facilitate the formulation of the parameter estimation and also bring flexibility to choice of optimization method, default Nelder-Mead.

```
In [1]: run -i BPL_TEST2_Batch_explore.py
```

Linux - run FMU pre-compiled OpenModelica 1.21.0

Model for bioreactor has been setup. Key commands:

- par() - change of parameters and initial values
- init() - change initial values only
- simu() - simulate and plot
- newplot() - make a new plot
- show() - show plot from previous simulation
- disp() - display parameters and initial values from the last simulation
- describe() - describe culture, broth, parameters, variables with values/units

Note that both disp() and describe() takes values from the last simulation

Brief information about a command by help(), eg help(simu)

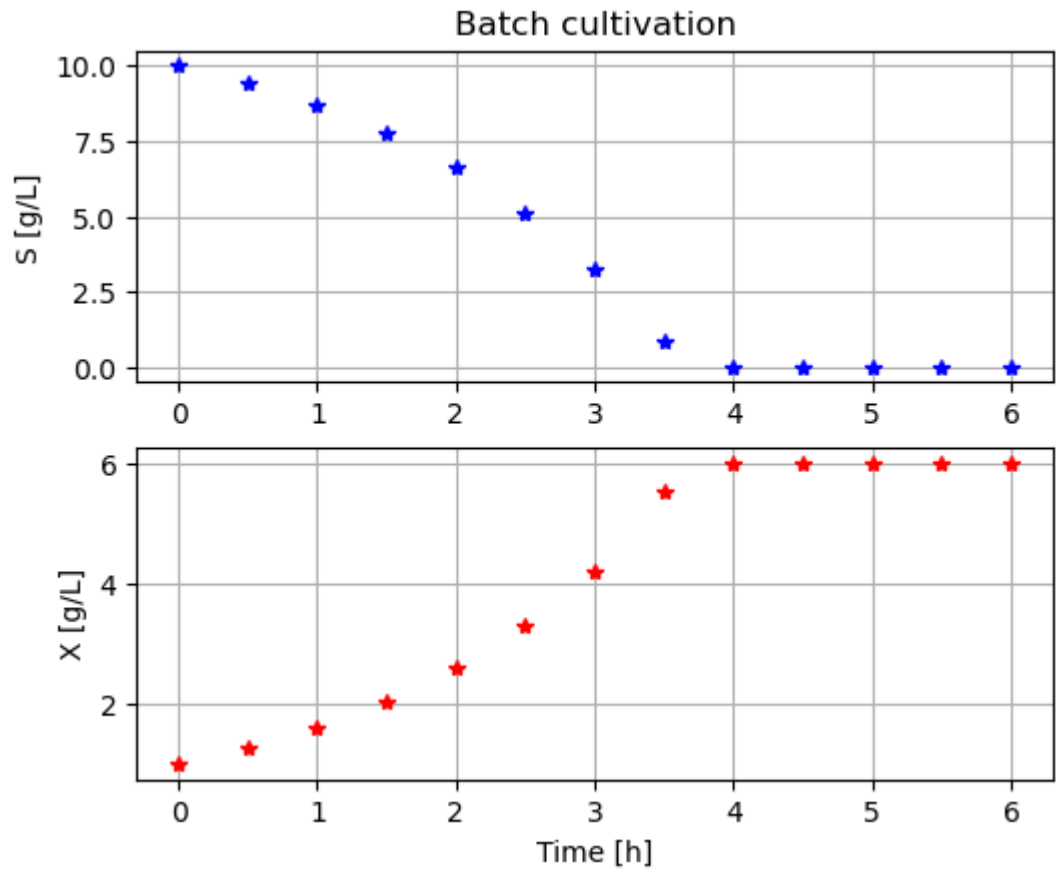
Key system information is listed with the command system\_info()

```
In [2]: # Adjust the size of diagrams
plt.rcParams['figure.figsize'] = [15/2.54, 12/2.54]
```

## 1 Generate data later used for parameter estimation

```
In [3]: import pandas as pd
```

```
In [4]: # Data generated
simulationTime = 6.0
par(Y=0.50, qSmax=1.00, Ks=0.1)
init(V_0=1.0, VS_0=10, VX_0=1.0)
newplot(plotType='Demo_2')
simu(simulationTime, options=opts_data)
```



```
In [5]: # Store data in a DataFrame for later use
data = pd.DataFrame(data={'time':sim_res['time'], 'X':sim_res['bioreactor'], 'S':sim_res['substrate']})
```

Out[5]:

	time	X	S
0	0.0	1.000000	1.000000e+01
1	0.5	1.269848	9.438455e+00
2	1.0	1.615795	8.719839e+00
3	1.5	2.050445	7.800734e+00
4	2.0	2.601038	6.626389e+00
5	2.5	3.297304	5.128962e+00
6	3.0	4.195962	3.229259e+00
7	3.5	5.524388	8.813998e-01
8	4.0	6.000000	-2.037810e-08
9	4.5	6.000000	2.960320e-10
10	5.0	6.000000	1.200938e-10
11	5.5	6.000000	2.363337e-10
12	6.0	6.000000	-1.553435e-10

## 2 Simulation with initial guess of parameters compared with data

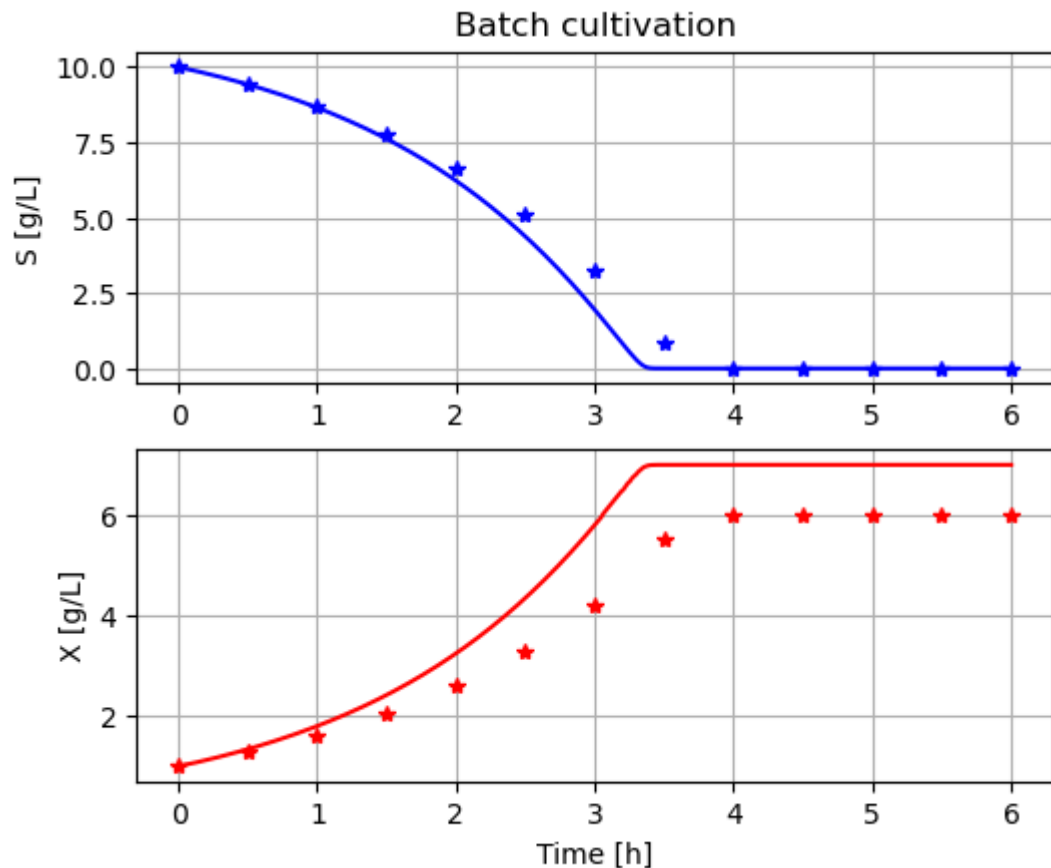
Here we define the parameters that should be estimated and specify allowed ranges. Nominal parameters are chosen as the mid-point of the allowed parameter range.

Simulation with these nominal parameter set and compare with data give an idea of how well the model fit data.

```
In [6]: # Parameters to be estimated using parDict names and their bounds
parEstim = ['Y', 'qSmax', 'Ks']
parBounds = [(0.4, 0.8), (0.7, 1.3), (0.05, 0.20)]
parEstim_0 = [np.mean(parBounds[k]) for k in range(len(parBounds))]
```

```
In [7]: # Simulation with nominal parameters
newplot(plotType='Demo_1')
par(Y=parEstim_0[0], qSmax=parEstim_0[1], Ks=parEstim_0[2])
simu(simulationTime)

# Show data
ax1.plot(data['time'], data['S'],'b*')
ax2.plot(data['time'], data['X'],'r*')
plt.show()
```

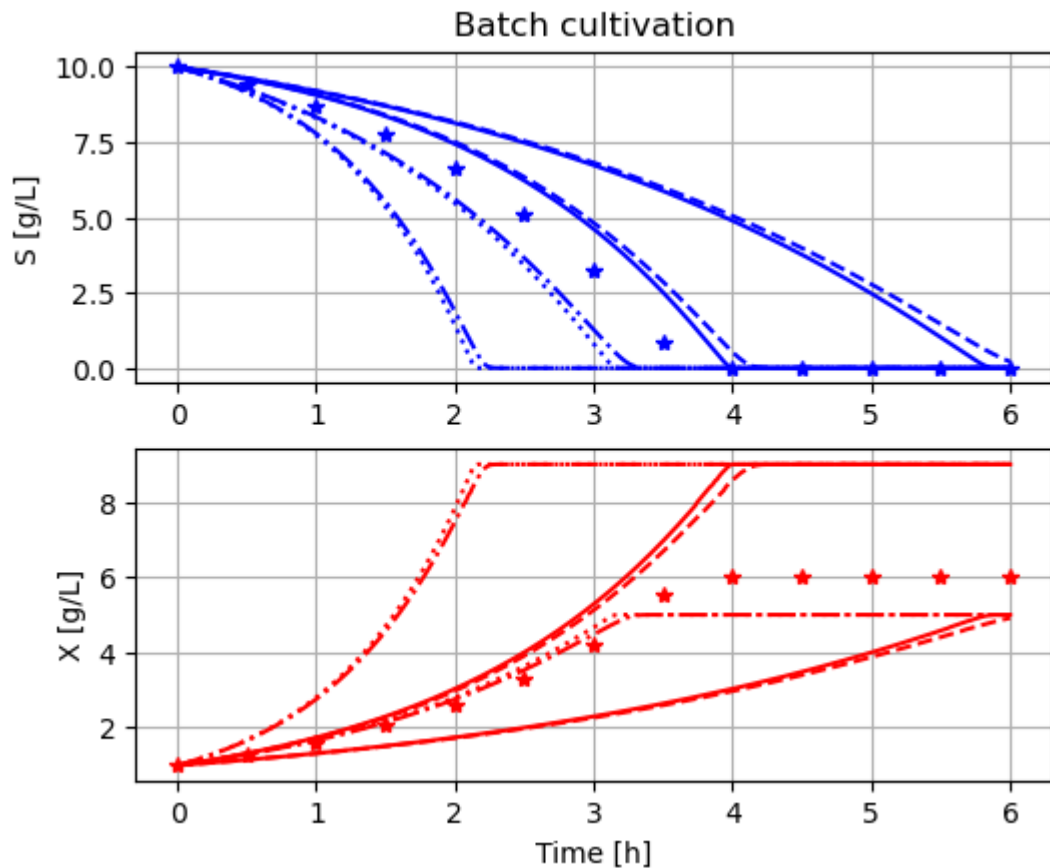


```
In [8]: # Simulation over the parameter ranges given
newplot(plotType='Demo_1')
for Y_value in parBounds [0]:
    for qSmax_value in parBounds[1]:
        for Ks_value in parBounds[2]:
            par(Y=Y_value, qSmax=qSmax_value, Ks=Ks_value)
            simu(simulationTime)

# Show data
ax1.plot(data['time'], data['S'],'b*')
```



```
ax2.plot(data['time'], data['X'], 'r*')
plt.show()
```



Simulation over the different parameter combinations of the parameter bounds shows that data is "covered" and we have good hope to find a parameter combination that fits data well.

### 3 Parameter estimation

Here we use the `scipy.optimize.minimize()` procedure which contains a family of different methods [1]. The default method is Nelder-Mead and is robust for fitting a model to data. Further we have chosen to work with bounds for the parameters to be estimated and the initial guess is chosen as the middle point in parameter space.

```
In [9]: # Optimization routine import
import scipy.optimize
```

```
In [10]: # Parameters to be estimated using parDict names and their bounds
extra_args = (parEstim, data, fmu_model, simulationTime)
```

```
In [11]: # Modified evaluation function tailored for Python optimization algorithm
def objective(x, parEstim, data=data, fmu_model=fmu_model, simulationTime=simulationTime):
    """The parameter list is tailored for scipy optimization algorithms in which
    where the first parameter x is an array with parameters that are to be
    and evaluated and parEstim is a list of the names of these parameters.
    The code can be made 20-30% faster, but longer, using pyfmi-command

    # Update parameters and simulate
    for i, p in enumerate(parEstim): par[**{p:x[i]}]
```

```

simu(simulationTime, options=opts_fast)

# Calculate loss function V
V={}
V['X'] = np.linalg.norm(data['X'] - np.interp(data['time'], sim_res['time'], sim_res['X']))
V['S'] = np.linalg.norm(data['S'] - np.interp(data['time'], sim_res['time'], sim_res['S']))

return V['X'] + V['S']

```

In [12]: `import time`

In [13]: `# Run minimize()`  
`start_time = time.time()`  
`result = scipy.optimize.minimize(objective, x0=parEstim_0, args=extra_arg,`  
 `method='Nelder-Mead', bounds=parBounds,`  
`print('CPU-time =', time.time()-start_time)`

Optimization terminated successfully.  
 Current function value: 0.148311  
 Iterations: 66  
 Function evaluations: 122  
 CPU-time = 2.5193231105804443

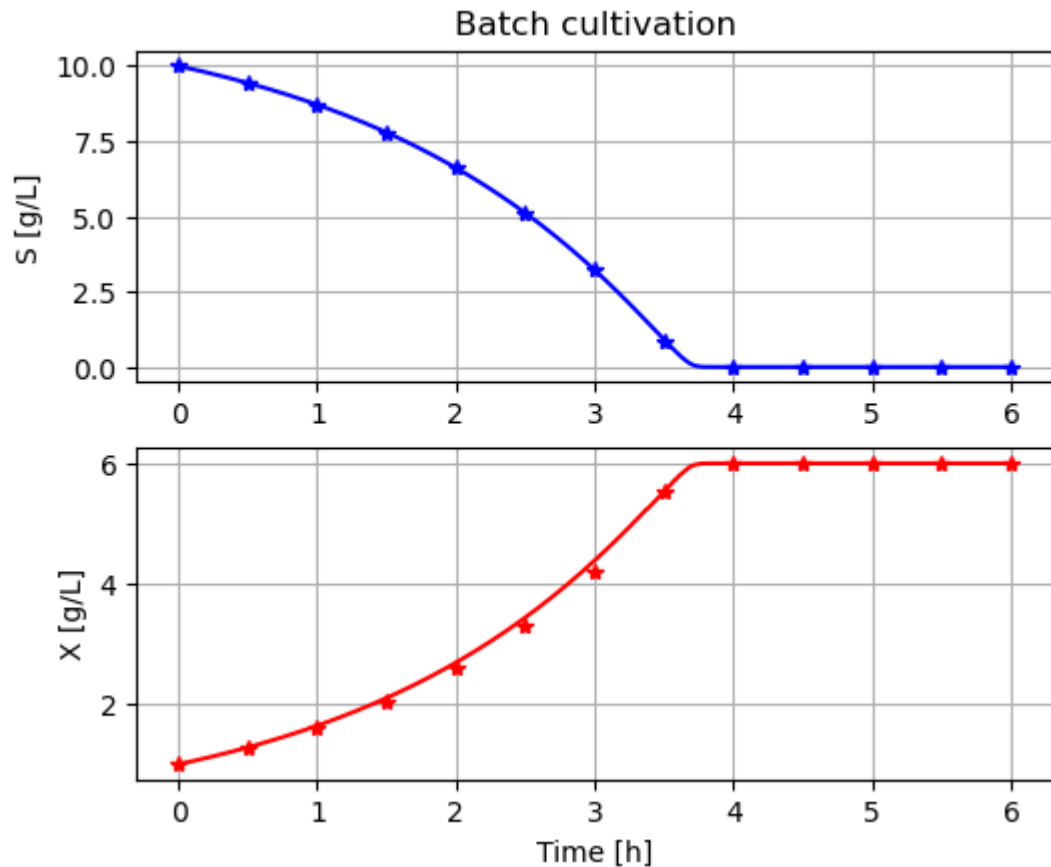
In [14]: `result.x`

Out[14]: `array([0.49997276, 1.00731527, 0.14380564])`

The estimated parameters result.x are very close to the original values and no surprise.

## 4 Simulation with estimated parameters compared with data

In [15]: `newplot(plotType='Demo_1')`  
`par(Y=result.x[0], qSmax=result.x[1], Ks=result.x[2])`  
`simu(simulationTime)`  
  
`# Show data`  
`ax1.plot(data['time'], data['S'], 'b*')`  
`ax2.plot(data['time'], data['X'], 'r*')`  
`plt.show()`



```
In [16]: # The estimated parameters are
for i in range(len(parEstim)): print(parEstim[i],':', result.x[i])
```

```
Y : 0.4999727558733863
qSmax : 1.0073152667279195
Ks : 0.14380564144282715
```

## 5 Analysis of the loss function

The problem is small and analysis of the loss function brings some insight. From the diagram above showing parameter sweep over combinations min- and max-parameters we see that the parameter  $K_s$  has little influence. Let us set that a fixed value and then plot the loss function in the parameters  $Y$  and  $qSmax$ . We do this by going through all the parameter combinations and evaluate each of them.

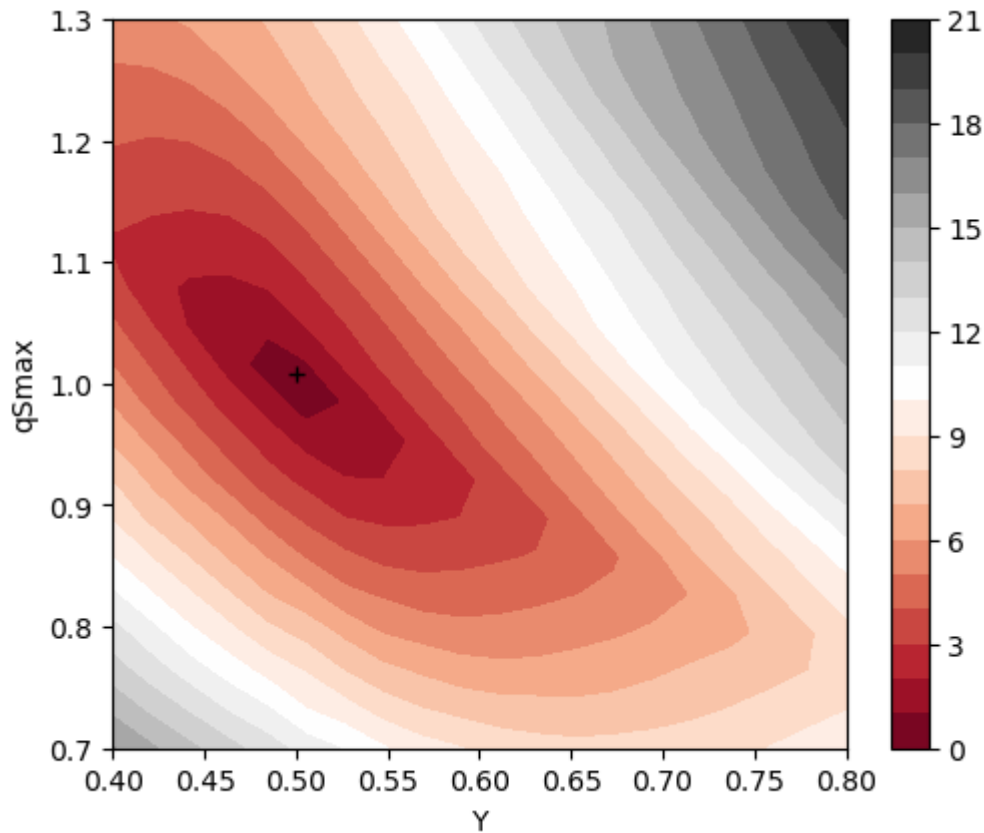
```
In [17]: # Sweep through Y and qSmax variation and store the value of the loss-fun
nY = 20
nqSmax = 20
V = np.zeros((nY, nqSmax))

Y = np.linspace(parBounds[0][0], parBounds[0][1], nY)
qSmax = np.linspace(parBounds[1][0], parBounds[1][1], nqSmax)

for j in range(nY):
    for k in range(nqSmax):
        V[k,j] = objective([Y[j], qSmax[k], 0.1], parEstim)

# Contour plot
plt.figure()
plt.clf
```

```
plt.subplot(1,1,1)
plt.contourf(Y, qSmax, V, 20, cmap='RdGy')
plt.plot(result.x[0], result.x[1], 'k+')
plt.colorbar()
plt.ylabel('qSmax')
plt.xlabel('Y')
plt.show()
```



We see the following in the contour diagram of the loss function simplified:

- The minima is unique in the range of parameters we study. This is good news.
- The contour plot is ellipsoid and rather narrow. The more narrow the ellipsoid the more difficult and more time it takes to converge to the minima.
- The direction of the ellipsoid axis indicate the correlation you may get between the two parameters during the minimization process.

Note that the form of the contour plot change with the parameters (and initial values) of the actual process. You can see the impact by changing the parameters in "cell # 4" where data is generated and then just choose to run that cell and the cells below. No need to restart the notebook.

## 6 Summary

A choice was made to work with allowed ranges of parameters to be estimated and a start value was defined as the center point in this parameter space. There are only three methods available in `optimize.minimize()` that can handle bounds on parameters.

An `evaluate()` function was created that define how the difference between simulation and data is measured. The function is rather transparent and easy to modify and you may want to change weight on the loss in S and X, for instance. Here they have so far equal weight.

The FMU-explore workspace dictionaries `partDict[]` and `parLocation[]` are useful also here and simplify the code for the `evaluation()` function. But we also use the detailed PyFMI-functions to administrate and set parameters of the actual simulation.

The call `optimize.minimize()` has several parameters and can easily be modified, for instance change of method. For fitting a model to data Nelder-Mead is a robust and good choice, but can be somewhat slow.

The estimated parameters were close to perfect!

The contour plot of the simplified loss function shows that the minima is unique and should not be difficult too difficult to obtain. More narrow elliptical contour plots would indicate difficulties. Multiple local minima would also be a problem.

## 7 References

[1] Scipy Reference guide on `optimize.minimize()` [here](#)

[2] Andersson, C., Åkesson, J., Fuhrer C. : "PyFMI: A Python package for simulation of coupled dynamic models with the functional mock-up interface", Centre for Mathematical Sciences, Lund University, Report LUTFNA-5008-2016, 2016.

## Appendix

```
In [18]: describe('parts')
['bioreactor', 'bioreactor.culture']
```

```
In [19]: describe('MSL')
MSL: 3.2.3 - used components: none
```

```
In [20]: system_info()

System information
-OS: Linux
-Python: 3.8.16
-Scipy: 1.10.0
-PyFMI: 2.9.8
-FMU by: OpenModelica Compiler OpenModelica 1.21.0~dev-185-g9d983b8
-FMI: 2.0
-Type: FMUModelME2
-Name: BPL_TEST2.Batch
-Generated: 2023-01-19T09:34:26Z
-MSL: 3.2.3
-Description: Bioprocess Library version 2.1.1-beta
-Interaction: FMU-explore version 0.9.6
```

In [ ]: