

Goodness-of-fit Measures to Compare Observed and Simulated Values with hydroGOF

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1 Installation

Installing hydroGOF:

```
install.packages("hydroGOF")
```

2 Setting up the environment

- Loading the *hydroGOF* library, which contains data and functions used in this analysis.

```
library(hydroGOF)
```

- Loading observed streamflows of the Ega River (Spain), with daily data from 1961-Jan-01 up to 1970-Dec-31

```
require(zoo)
data(EgaEnEstellaQts)
obs <- EgaEnEstellaQts
```

- Generating a simulated daily time series, initially equal to the observed values (simulated values are usually read from the output files of the hydrological model)

```
sim <- obs
```

- Computing the numeric goodness-of-fit measures for the “best” (unattainable) case

```
gof(sim=sim, obs=obs)
```

```
##           [,1]
## ME           0
## MAE          0
## MSE          0
## RMSE         0
## NRMSE %      0
## PBIAS %      0
## RSR          0
## rSD          1
## NSE          1
## mNSE         1
```

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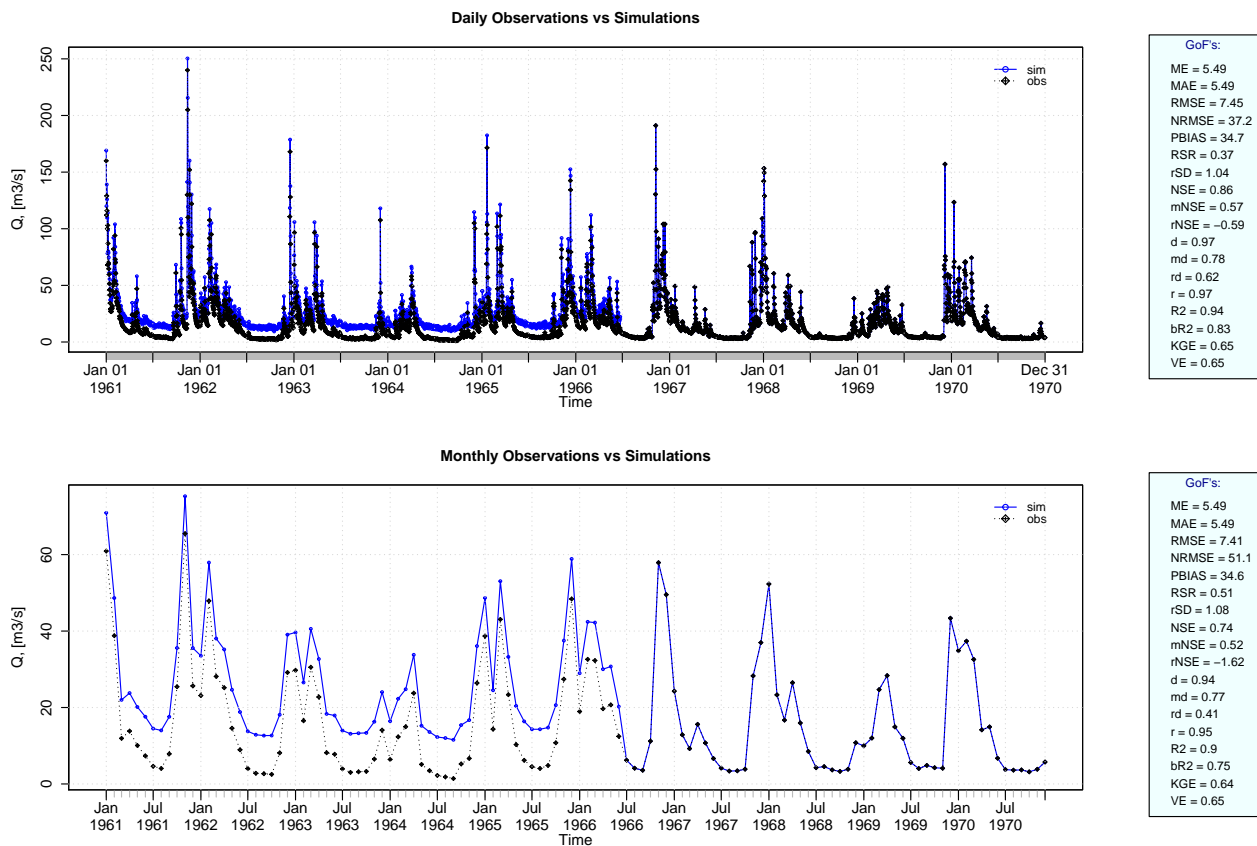
```
## rNSE      1
## d         1
## md        1
## rd        1
## cp        1
## r         1
## R2        1
## bR2       1
## KGE       1
## VE        1
```

- Randomly changing the first 2000 elements of 'sim', by using a normal distribution with mean 10 and standard deviation equal to 1 (default of 'rnorm').

```
sim[1:2000] <- obs[1:2000] + rnorm(2000, mean=10)
```

- Plotting the graphical comparison of 'obs' against 'sim', along with the numeric goodness-of-fit measures for the daily and monthly time series

```
ggof(sim=sim, obs=obs, ftype="dm", FUN=mean)
```

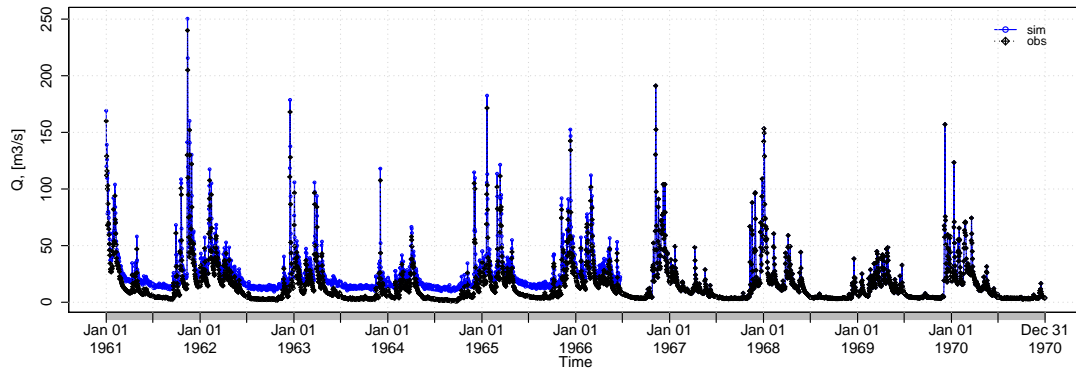


2.1 Removing warm-up period

- Using the first two years (1961-1962) as warm-up period, and removing the corresponding observed and simulated values from the computation of the goodness-of-fit measures:

```
ggof(sim=sim, obs=obs, ftype="dm", FUN=mean, cal.ini="1963-01-01")
```

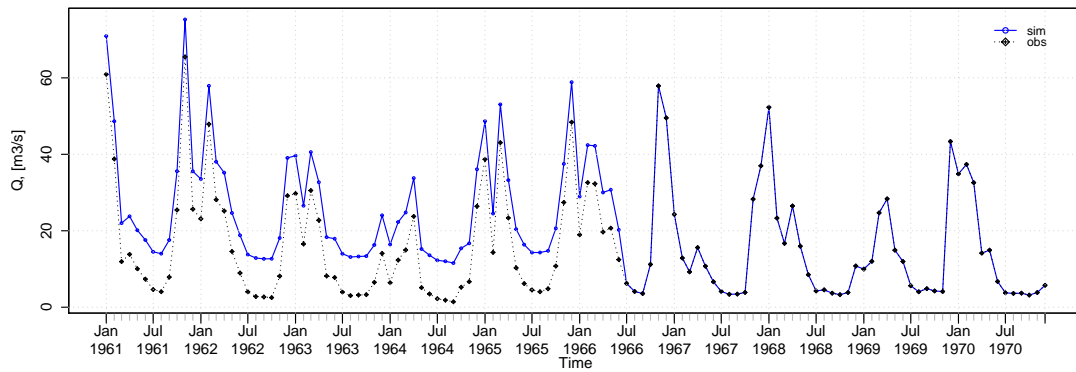
Daily Observations vs Simulations



GoFs:

ME	= 4.36
MAE	= 4.36
RMSE	= 6.65
NRMSE	= 36.5
PBIAS	= 29.3
RSR	= 0.36
rSD	= 1.04
NSE	= 0.87
mNSE	= 0.63
rNSE	= -0.52
d	= 0.97
md	= 0.81
rd	= 0.64
r	= 0.96
R2	= 0.93
bR2	= 0.83
KGE	= 0.7
VE	= 0.71

Monthly Observations vs Simulations



GoFs:

ME	= 4.37
MAE	= 4.37
RMSE	= 6.61
NRMSE	= 49.4
PBIAS	= 29.3
RSR	= 0.49
rSD	= 1.07
NSE	= 0.75
mNSE	= 0.59
rNSE	= -1.49
d	= 0.94
md	= 0.8
rd	= 0.42
r	= 0.94
R2	= 0.88
bR2	= 0.75
KGE	= 0.69
VE	= 0.71

- Verification of the goodness-of-fit measures for the daily values after removing the warm-up period:

```
sim <- window(sim, start=as.Date("1963-01-01"))
obs <- window(obs, start=as.Date("1963-01-01"))

gof(sim, obs)
```

```
##      [,1]
## ME    4.36
## MAE   4.36
## MSE  44.20
## RMSE   6.65
## NRMSE % 36.50
## PBIAS % 29.30
## RSR    0.36
## rSD    1.04
## NSE    0.87
## mNSE   0.63
## rNSE  -0.52
## d      0.97
## md     0.81
## rd     0.64
## cp     0.44
## r      0.96
## R2     0.93
## bR2    0.83
## KGE    0.70
## VE    0.71
```

2.2 Analysis of the residuals

- Computing the daily residuals (even if this is a dummy example, it is enough for illustrating the capability)

```
r <- sim-obs
```

- Summarizing and plotting the residuals (it requires the hydroTSM package):

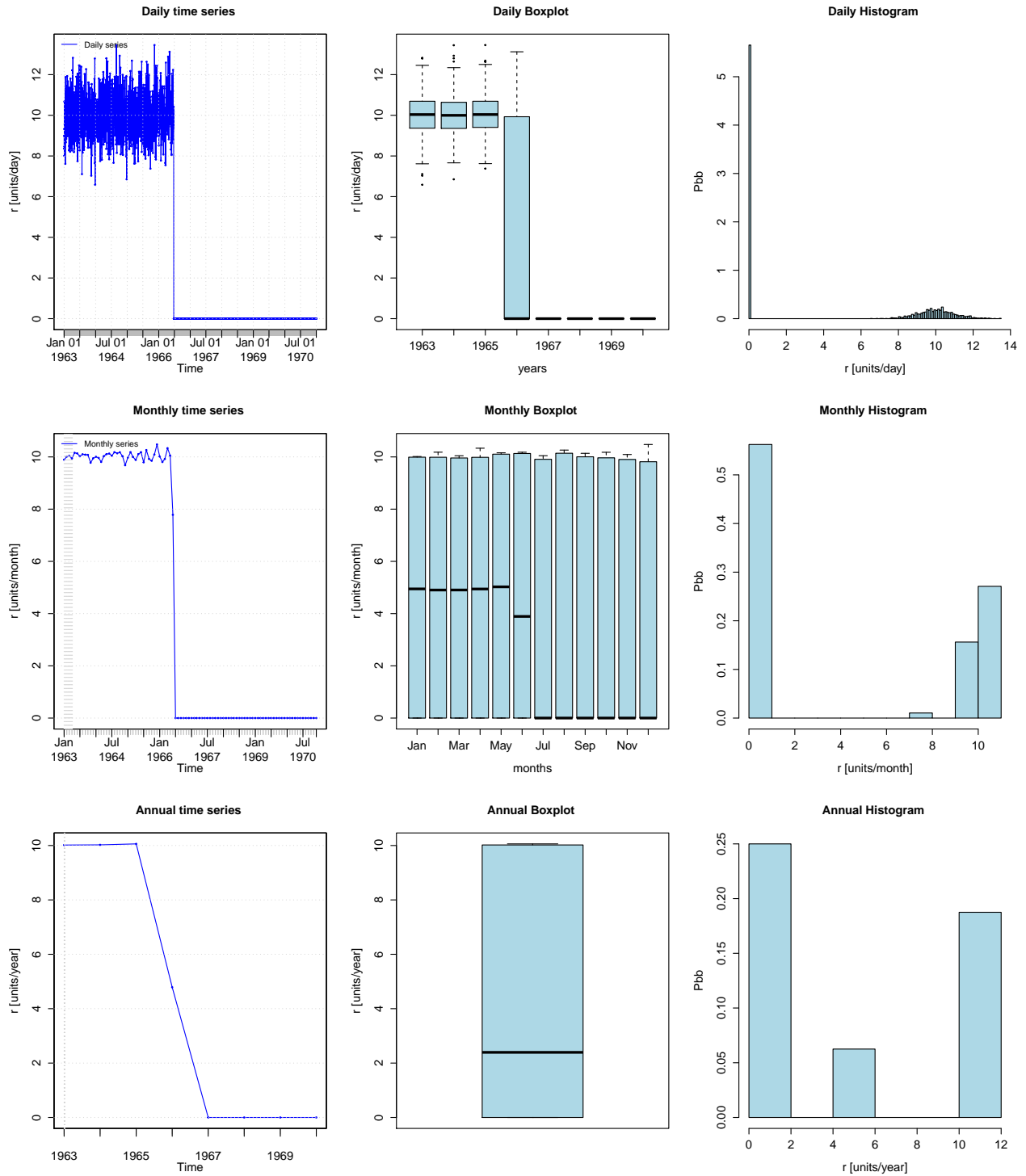
```
library(hydroTSM)
```

```
## Loading required package: xts
```

```
smry(r)
```

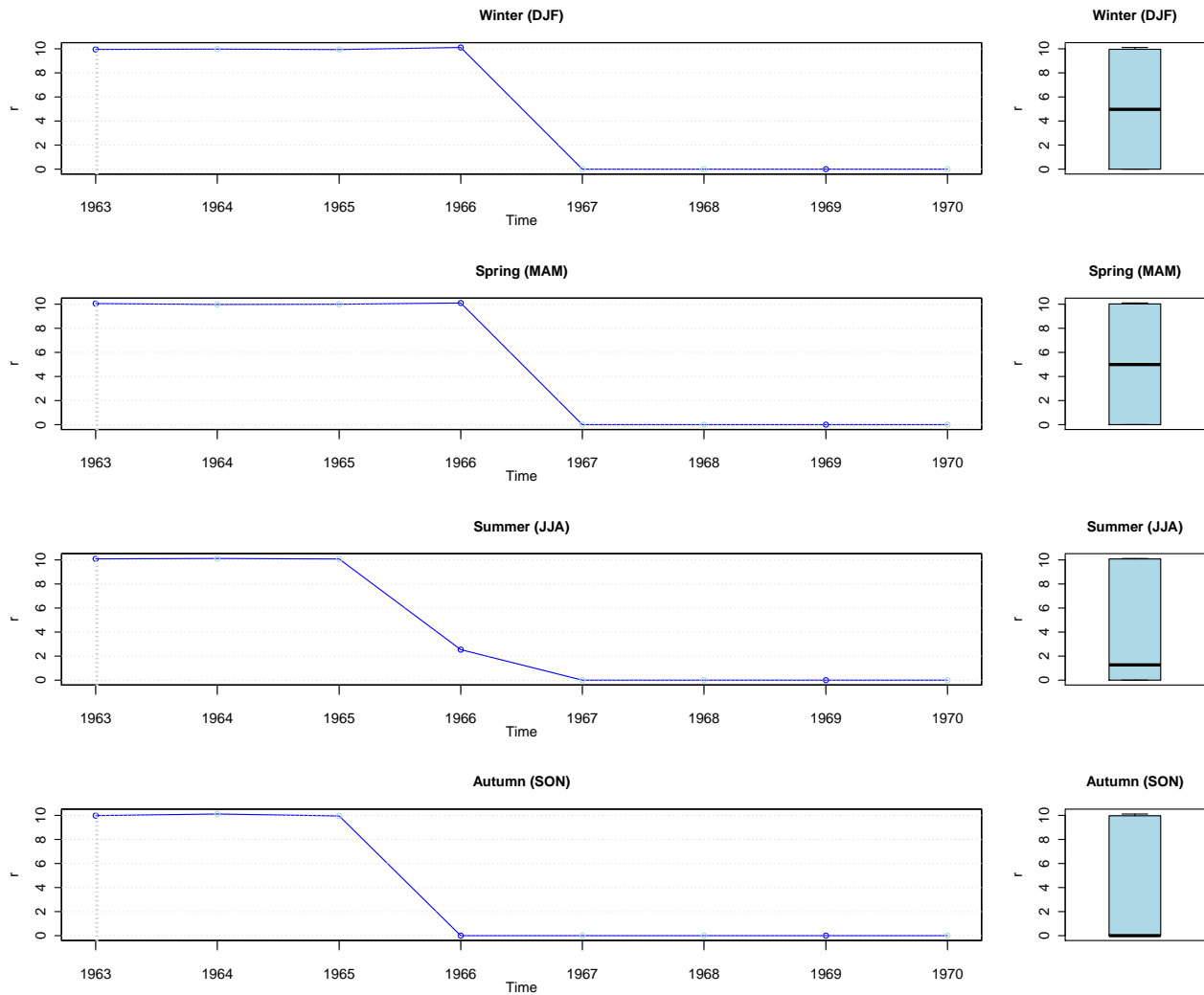
```
##           Index      r
## Min.      1963-01-01  0.0000
## 1st Qu.   1964-12-31  0.0000
## Median   1966-12-31  0.0000
## Mean     1966-12-31  4.3610
## 3rd Qu.  1968-12-30  9.8300
## Max.     1970-12-31 13.4500
## IQR      <NA>      9.8298
## sd       <NA>      5.0187
## cv       <NA>      1.1508
## Skewness <NA>      0.3159
## Kurtosis <NA>     -1.8315
## NA's     <NA>      2.0000
## n        <NA>    2922.0000
```

```
# daily, monthly and annual plots, boxplots and histograms
hydroplot(r, FUN=mean)
```



- Seasonal plots and boxplots

```
# daily, monthly and annual plots, boxplots and histograms
hydroplot(r, FUN=mean, pfreq="seasonal")
```



3 Software details

This tutorial was built under:

```
## [1] "x86_64-pc-linux-gnu (64-bit)"
## [1] "R Under development (unstable) (2020-03-11 r77927)"
## [1] "hydroGOF 0.4-0"
```

4 Version history

- v0.2: Mar-2020
- v0.1: Aug 2011