

## Master 2 M.M.M.E.F. 2016 – 2017

# Time Series Tutorial $n^0$ 1 :

## How to manipulate and generate time series?

The aims of this tutorial is a to provide a first overview on the objects and commands of the R software relative to time series.

R is a free software of numerical applied mathematics and more precisely statistics. It is continuously developed from the more recent researches of mathematicians. It can be downloaded from <http://www.r-project.org/> as well for Windows, Mac or Linux. An accurate version of R, called R-studio, could also be downloaded on <https://www.rstudio.com/>.

In the sequel, you may read at the left side the R commands which could be written on your computer, comments on these commands could be found on the right-side.

An interesting way of using this software is to open a R-script (on File) and write all your commands indeed. You could save the R-script and directly make run the commands on the command window.

### Manipulations of R objects

<code>x=c(4,3,7,1.7,3,8.4,5,12,9,12)</code>	Generate a numerical vector ( <code>c</code> as collector).
<code>xx=rep(c(-1,4,-log(2)),3)</code>	To repeat a sequence of numbers.
<code>x=c(x,xx)</code>	New vector $x$ from its previous affectation.
<code>x</code>	To print the value of $x$ .
<code>is.ts(x)</code>	Is $x$ a "time series" object?
<code>y=as.ts(x)</code>	Transform $x$ to a "time series" object..
<code>y</code>	Changes?
<code>time(y)</code>	See the vector of time of this time series
<code>is.ts(y)</code>	Just to verify...
	More generally, R software run with several types of objects:
	Vectors (commands <i>is.vector</i> and <i>as.vector</i> );
	Matrices (commands <i>is.matrix</i> and <i>as.matrix</i> );
	Data tables (commands <i>is.data.frame</i> and <i>as.data.frame</i> );
	Time series (commands <i>is.ts</i> and <i>as.ts</i> );
	Lists (commandes <i>is.list</i> and <i>as.list</i> );
<code>t=tsp(y)</code>	Associate to $y$ a vector of times $t$ (by default from 1 to 1, with frequency 1).
<code>plot.ts(y)</code>	Draw the path of the time series $y$ ..
<code>plot.ts(y,type="b")</code>	To indicate the points of the time series.
<code>z=ts(y,freq=4)</code>	Divide the time series in trimesters (run also with divisions in months where <i>freq</i> = 12 ...).
<code>z</code>	Verification.
<code>time(z)</code>	Associate vector of time
<code>z=ts(x,freq=4,1991+1/4, 1993)</code>	A new vector of times, with the beginning and the end.
<code>time(z)</code>	
<code>plot.ts(z)</code>	New graph.
<code>frequency(z)</code>	To specify the frequency.
<code>length(z)</code>	Length of the time series $z$ .

## Generation of a time series

	In the help desk, write the keyword "distributions".
	Note that prefix "r" is used to generate pseudo-random variables, "d" for density, "p" for cumulative distribution function and "q" for quantile.
qnorm(0.95)	95% percentile of standard Gaussian distribution.
pnorm(2)	Cumulative distribution function in 2 of standard Gaussian distribution.
x=rnorm(300)	On génère un bruit blanc.
mean(x)	Empirical mean.
sd(x)	Standard deviation.
var(x)	Empirical deviation. Which is the renormalization?
cov(x,x ^2)	Empirical covariance between both the vectors.
cor(x,x)	Empirical correlation. Explain the result?
cor(x,x^2)	Empirical correlation. Explain the result?
par(mfrow=c(2,2))	Share the window in 4 windows.
plot.ts(x)	Graph.
hist(x,nclass=6)	Histogram with a specified number of classes.
	Generate 100 independent realizations of $\mathcal{N}(-1, 3)$ random variables.
	Compute the empirical mean, the standard deviation and draw an histogram.
	Explain the results..
x=rbinom(30,10,0.3)	Generation of another vector of independent binomial random variables.
	Compute the usual statistics relative to this vector.
	Center and normalize this time series. Let $z$ be this new vector.
y=as.ts(z)	Transform $y$ in a time series.
y=sort(y)	To order $y$ .
plot.ts(x,y)	Explain this graph.
acf(x)	Correlogram of $x$ . Explain the result.

## Exercises

**Exercise 1:** Let  $(\varepsilon_i)_{i \in \mathbf{Z}}$  be a white noise of  $[-3, 3]$ -uniform distribution.

1. Generate a realization of  $(\varepsilon_1, \dots, \varepsilon_{100})$ .
2. Let  $X_i = \varepsilon_{i+1} - 2\varepsilon_i$  for  $i \in \mathbf{Z}$ . Generate  $(X_1, \dots, X_{100})$ .
3. Draw the correlogram of  $(\varepsilon_1, \dots, \varepsilon_{100})$  and  $(X_1, \dots, X_{100})$ . Explain the results.

**Exercise 2:** Let  $Z = (Z_i)_{1 \leq i \leq n}$  be a vector of independent standard Gaussian random variables.

1. Let  $A = (A_1, \dots, A_n)$  be a (deterministic) vector of real numbers and  $\Sigma$  be a  $(n, n)$  definite positive matrix. Show that  $A + \Sigma^{1/2} Z$  is a realization of a  $\mathcal{N}(A, \Sigma)$  random vector. In the sequel  $n = 100$ .
2. Use R software to generate a realization  $X$  of a  $\mathcal{N}(A, \Sigma)$  random vector with  $A = 0$  and  $\Sigma_{ii} = 5$ ,  $\Sigma_{ij} = -2$  if  $|j - i| = 1$  and  $\Sigma_{ij} = 0$  if  $|j - i| > 1$  for  $1 \leq i, j \leq n$  (you may use the command `matrix` and `chol`).
3. Prove that  $X_i = Z_{i+1} - 2Z_i$  for  $i = 1, \dots, n$ .