## Optimization

```
# Example of MLE optimization using log-likelihood of Gamma distribution, found in "Optimization" Lectu
LL=function(theta,x){
    n=length(x)
    sx = sum(x)
    slogx=sum(log(x))
    r=theta[1]
    lambda=theta[2]
    loglik=n*r*log(lambda)
    loglik=loglik+(r-1)*slogx-lambda*sx
    loglik=loglik-n*log(gamma(r))
    return(-loglik)
}
r=5
lambda=2
x=rgamma(100,r,lambda)
optim(c(1,1),LL,x=x)
## $par
## [1] 5.311412 2.173240
##
## $value
## [1] 141.1846
## $counts
## function gradient
         69
                  NA
##
##
## $convergence
## [1] 0
## $message
## NULL
library(SimDesign)
LL=function(theta,x){
    n=length(x)
    sx = sum(x)
    slogx=sum(log(x))
    r=theta[1]
    lambda=theta[2]
    loglik=n*r*log(lambda)
    loglik=loglik+(r-1)*slogx-lambda*sx
    loglik=loglik-n*log(gamma(r))
    return(-loglik)
}
```

```
#### Step 1 --- Define your conditions under study and create design data.frame
Design <- data.frame(N = c(100, 1000, 10000))
#~~~~~~~~
#### Step 2 --- Define generate, analyse, and summarise functions
# help(Generate)
Generate <- function(condition, fixed_objects = NULL){</pre>
    lambda <- 2
    r < -5
    x <- with(condition, rgamma(N, r, lambda)) # distributed N(10, 5)
    dat <- data.frame('x'=x)</pre>
    dat
}
# help(Analyse)
Analyse <- function(condition, dat, fixed_objects = NULL){</pre>
    x \leftarrow optim(c(1,1), LL, x=dat\$x) # mean of the sample data vector
    results <- data.frame('r'=mean(x$par[1]), 'lambda'=mean(x$par[2]))
    results
}
# help(Summarise)
Summarise <- function(condition, results, fixed_objects = NULL){</pre>
    ret <- c(r=mean(results$r), r_sd=sd(results$r), lambda=mean(results$lambda), lambda_sd=sd(results$r
}
#~~~~~~~
#### Step 3 --- Collect results by looping over the rows in design
# run the simulation
Final <- runSimulation(design=Design, replications=1000,
                       generate=Generate, analyse=Analyse, summarise=Summarise)
##
##
Design row: 1/3; Started: Fri Dec 13 14:48:46 2019; Total elapsed time: 0.00s
##
Design row: 2/3;
                  Started: Fri Dec 13 14:48:48 2019;
                                                        Total elapsed time: 1.50s
##
Design row: 3/3;
                 Started: Fri Dec 13 14:48:50 2019;
                                                        Total elapsed time: 3.71s
## Simulation complete. Total execution time: 18.90s
Final
##
                                 lambda lambda_sd REPLICATIONS SIM_TIME
                          r_sd
      100 5.141240 0.70667674 2.059443 0.70667674
                                                           1000
                                                                   1.50s
## 2 1000 5.009739 0.21436882 2.004403 0.21436882
                                                           1000
                                                                   2.20s
```

```
## 3 10000 5.001739 0.06650399 2.000612 0.06650399
                                                           1000 15.20s
##
                    COMPLETED
                                    SEED
## 1 Fri Dec 13 14:48:48 2019 1164521191
## 2 Fri Dec 13 14:48:50 2019 308209069
## 3 Fri Dec 13 14:49:05 2019 787047969
# reproduce exact simulation
Final_rep <- runSimulation(design=Design, replications=1000, seed=Final$SEED,</pre>
                       generate=Generate, analyse=Analyse, summarise=Summarise)
##
##
Design row: 1/3;
                 Started: Fri Dec 13 14:49:05 2019;
                                                        Total elapsed time: 0.00s
##
                   Started: Fri Dec 13 14:49:06 2019;
                                                        Total elapsed time: 1.10s
Design row: 2/3;
##
Design row: 3/3;
                  Started: Fri Dec 13 14:49:08 2019;
                                                        Total elapsed time: 3.17s
##
## Simulation complete. Total execution time: 18.65s
Final_rep
##
                                 lambda lambda_sd REPLICATIONS SIM_TIME
                          r_sd
                  r
       100 5.141240 0.70667674 2.059443 0.70667674
                                                           1000
                                                                   1.10s
## 2 1000 5.009739 0.21436882 2.004403 0.21436882
                                                           1000
                                                                   2.06s
## 3 10000 5.001739 0.06650399 2.000612 0.06650399
                                                           1000
                                                                  15.48s
                    COMPLETED
                                    SEED
## 1 Fri Dec 13 14:49:06 2019 1164521191
## 2 Fri Dec 13 14:49:08 2019 308209069
## 3 Fri Dec 13 14:49:24 2019 787047969
```