R Notebook

Code ▼

Load Libraries

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```
library(GenSA)
library(ggplot2)
library(GA)
```

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```
#Load Libraries
install.packages('GenSA')
```

The downloaded binary packages are in /var/folders/ln/wm_v8jtd0d720rc2ymvkfhg80000gn/T//RtmpETl71f/downloaded_packages

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```
install.packages('GA')
```

The downloaded binary packages are in /var/folders/1n/wm v8jtd0d720rc2ymvkfhg80000gn/T//RtmpETl71f/downloaded packages

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```
library('ggplot2')
package 'ggplot2' was built under R version 3.4.4
                                                                                   Hide
                                                                                   Hide
library('quantmod')
package 'quantmod' was built under R version 3.4.4Loading required package: xts
package 'xts' was built under R version 3.4.4Loading required package: zoo
package 'zoo' was built under R version 3.4.4
Attaching package: 'zoo'
The following objects are masked from 'package:base':
   as.Date, as.Date.numeric
Loading required package: TTR
package 'TTR' was built under R version 3.4.4Version 0.4-0 included new data defaults
. See ?getSymbols.
Learn from a quantmod author: https://www.datacamp.com/courses/importing-and-managing
-financial-data-in-r
                                                                                   Hide
                                                                                   Hide
library('GA')
package 'GA' was built under R version 3.4.4Loading required package: foreach
package 'foreach' was built under R version 3.4.3Loading required package: iterators
package 'iterators' was built under R version 3.4.4
/ | / \
                Genetic
                Algorithms
  \ \ version 3.1.1
Type 'citation("GA")' for citing this R package in publications.
                                                                                   Hide
                                                                                   Hide
library('GenSA')
package 'GenSA' was built under R version 3.4.3
```

[. .. .

```
library('PerformanceAnalytics')
```

```
package 'PerformanceAnalytics' was built under R version 3.4.3
Package PerformanceAnalytics (1.5.2) loaded.
Copyright (c) 2004-2018 Peter Carl and Brian G. Peterson, GPL-2 | GPL-3
https://github.com/braverock/PerformanceAnalytics

Attaching package: 'PerformanceAnalytics'
The following object is masked from 'package:graphics':
    legend
```

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```
#Feeding real-time stock data into the system
tickers <- c("GM", "AMZN", "BMWYY", "LVMUY", "KO")
getSymbols(tickers, from = "2010-12-01", to = "2018-11-05")</pre>
```

```
[1] "GM" "AMZN" "BMWYY" "LVMUY" "KO"
```

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```
P <- NULL
for(ticker in tickers) {
  tmp <- Cl(to.monthly(eval(parse(text = ticker))))</pre>
  P <- cbind(P, tmp)
colnames(P) <- tickers</pre>
R \leftarrow diff(log(P))
R < -R[-1,]
mu <- colMeans(R)</pre>
sigma <- cov(R)
library("PerformanceAnalytics")
pContribCVaR <- ES(weights = rep(0.2, 5), method = "gaussian", portfolio method = "co
mponent", mu = mu, sigma = sigma)$pct contrib ES
obj <- function(w) {</pre>
  fn.call <<- fn.call + 1</pre>
  if (sum(w) == 0) \{ w < -w + 1e-2 \}
  w \leftarrow w / sum(w)
  CVaR <- ES(weights = w, method = "gaussian", portfolio method = "component", mu = m
u, sigma = sigma)
  tmp1 <- CVaR$ES
  tmp2 <- max(CVaR$pct contrib ES - 0.225, 0)</pre>
  out \leftarrow tmp1 - 1e+3 * tmp2
  return(out)
obj1 <- function(w) {
  fn.call <<- fn.call + 1</pre>
  if (sum(w) == 0) \{ w < -w + 1e-2 \}
  w \leftarrow w / sum(w)
  CVaR <- ES(weights = w, method = "gaussian", portfolio_method = "component", mu = m
u, sigma = sigma)
  tmp1 <- CVaR$ES</pre>
  tmp2 <- max(CVaR$pct_contrib_ES - 0.225, 0)</pre>
  out1 < - tmp1 + 1e+3 * tmp2
  return(out1)
}
```

```
# Solution is the weights assigned to each of the stocks for optimum portfolio
set.seed(1234)
fn.call <<- 0
gap <- ga(type = "real-valued",fitness=obj,lower=rep(0,5),upper=rep(1,5), popSize = 5
0,maxiter = 150, pcrossover = 0.75, pmutation = 0.1)</pre>
```

```
GA | iter = 1 | Mean = -220.05129 | Best = -54.86347

GA | iter = 2 | Mean = -170.70494 | Best = -40.82414

GA | iter = 3 | Mean = -138.64441 | Best = -40.82414

GA | iter = 4 | Mean = -99.67271 | Best = -26.04375
```

```
GA | iter = 5 | Mean = -71.09705 | Best = -26.04375
                                   Best = -25.32443
     iter = 6 | Mean = -62.53484 |
GA | iter = 7 | Mean = -54.24932 | Best = -23.35230
GA |
     iter = 8
             Mean = -47.33546 | Best = -20.77581
GA | iter = 9 | Mean = -40.64160 | Best = -15.90522
    iter = 10 | Mean = -40.88976 | Best = -15.90522
GA |
GA | iter = 11 | Mean = -44.20312
                                    Best = -15.90522
    iter = 12 \mid Mean = -42.27071 \mid
                                    Best = -15.90522
GA |
GA | iter = 13 | Mean = -34.72313 | Best = -15.90522
GA | iter = 14 |
                 Mean = -37.48621
                                    Best = -15.90522
GA | iter = 15 | Mean = -29.74813 |
                                    Best = -15.90522
GA \mid iter = 16 \mid Mean = -30.88109 \mid
                                    Best = -15.90522
    iter = 17 | Mean = -30.75004 |
                                    Best = -15.90522
GA |
GA | iter = 18
                 Mean = -31.73937
                                    Best = -15.90522
GA | iter = 19 | Mean = -27.90865 |
                                    Best = -15.90522
GA | iter = 20 | Mean = -29.06460 |
                                    Best = -15.52273
GA | iter = 21 | Mean = -24.26602 |
                                    Best = -13.55976
GA | iter = 22 | Mean = -25.05263 | Best = -13.55976
GA | iter = 23 | Mean = -26.83828 |
                                    Best = -12.81688
GA | iter = 24 | Mean = -27.98375 |
                                    Best = -12.81688
GA |
    iter = 25 | Mean = -35.16641
                                    Best = -12.14503
GA | iter = 26 | Mean = -26.79523
                                    Best = -12.14503
    iter = 27 | Mean = -24.70203 |
                                    Best = -12.14503
GA |
GA | iter = 28 | Mean = -27.97698
                                    Best = -10.46231
    iter = 29 \mid Mean = -25.02368
                                    Best = -10.46231
GA |
GA | iter = 30 | Mean = -20.02017 | Best = -10.46231
GA | iter = 31 | Mean = -25.72428 | Best = -10.46231
GA | iter = 32 | Mean = -18.75614 |
                                    Best = -10.46231
GA | iter = 33 | Mean = -25.27058 |
                                    Best = -10.46231
GA |
    iter = 34 |
                Mean = -23.26855
                                    Best = -10.46231
GA | iter = 35 | Mean = -19.99589 | Best = -10.38601
GA | iter = 36 | Mean = -20.52644 |
                                    Best = -10.38601
GA | iter = 37 | Mean = -20.15578 | Best = -10.38601
                                    Best = -10.38601
GA | iter = 38 | Mean = -18.09100 |
GA | iter = 39 | Mean = -19.92437 | Best = -10.38601
GA | iter = 40 | Mean = -19.14357 | Best = -10.38601
GA | iter = 41 | Mean = -21.766103
                                   | Best =
                                             -8.996975
GA
    iter = 42 | Mean = -15.114655
                                     Best =
                                              -8.996975
GA | iter = 43 | Mean = -18.231048
                                     Best =
                                              -8.996975
     iter = 44 |
                 Mean = -24.000764
GA |
                                     Best =
                                              -8.996975
GA | iter = 45 |
                 Mean = -20.537755
                                              -8.996975
                                     Best =
    iter = 46 | Mean = -22.302709
GA |
                                     Best =
                                              -8.996975
GA |
    iter = 47 | Mean = -17.675847
                                              -8.996975
                                     Best =
GA |
     iter = 48
                 Mean = -12.735995
                                     Best =
                                              -8.922921
GA | iter = 49 | Mean = -15.140967
                                   Best =
                                              -8.922921
    iter = 50 | Mean = -18.053713 | Best =
                                              -8.676531
GA |
GΑ
    iter = 51 | Mean = -13.803133 |
                                              -8.676531
                                     Best =
GΑ
     iter = 52
                 Mean = -17.555392
                                     Best =
                                              -8.676531
GΑ
     iter = 53 | Mean = -21.242481 |
                                     Best =
                                              -8.676531
    iter = 54 | Mean = -19.464074 |
GA |
                                     Best =
                                              -8.676531
```

```
GA | iter = 55 | Mean = -14.433340
                                     Best =
                                              -7.847027
GA
     iter = 56
                 Mean = -18.597566
                                              -7.847027
                                     Best =
GA |
    iter = 57
                 Mean = -17.332378
                                     Best =
                                              -7.847027
GA |
     iter = 58 |
                 Mean = -15.877485
                                     Best =
                                              -7.847027
GΑ
    iter = 59
                 Mean = -18.027928
                                              -7.847027
                                     Best =
     iter = 60 | Mean = -15.076578
GA |
                                     Best =
                                              -7.847027
GΑ
    iter = 61 | Mean = -17.474123
                                              -7.847027
                                     Best =
    iter = 62 | Mean = -20.021801 |
                                              -7.847027
GA |
                                     Best =
GA | iter = 63 | Mean = -14.415924 |
                                     Best =
                                              -7.847027
    iter = 64
GA |
                 Mean = -13.534898
                                     Best =
                                              -7.847027
GΑ
    iter = 65 | Mean = -15.625316
                                     Best =
                                              -7.847027
GA |
    iter = 66 |
                 Mean = -11.635145
                                     Best =
                                              -7.091211
GA |
                 Mean = -15.934945
                                              -7.091211
    iter = 67 |
                                     Best =
GΑ
    iter = 68
                 Mean = -18.717324
                                              -7.091211
                                     Best =
    iter = 69 | Mean = -14.922012
                                              -7.091211
GA |
                                     Best =
GA | iter = 70 | Mean = -15.473479
                                              -7.091211
                                     Best =
    iter = 71 | Mean = -11.909650 |
                                              -7.091211
GA |
                                     Best =
GΑ
  | iter = 72
               | Mean = -18.261884
                                     Best =
                                              -5.940762
    iter = 73 | Mean = -17.904952
GA |
                                     Best =
                                              -5.940762
GA
  | iter = 74 | Mean = -15.834922
                                     Best =
                                              -5.940762
GΑ
    iter = 75 |
                 Mean = -16.659397
                                     Best =
                                              -5.940762
    iter = 76
                 Mean = -14.190657
                                              -5.940762
GΑ
                                     Best =
GA |
    iter = 77 | Mean = -16.883429
                                              -5.940762
                                     Best =
GΑ
    iter = 78
                 Mean = -19.875008
                                     Best =
                                              -5.940762
    iter = 79 |
GA |
                 Mean = -17.834207
                                              -5.940762
                                     Best =
GA
    iter = 80 | Mean = -16.858031
                                              -5.940762
                                     Best =
GA
    iter = 81 |
                 Mean = -16.780854
                                     Best =
                                              -5.940762
GA
    iter = 82
                 Mean = -17.041730
                                              -5.940762
                                     Best =
GA
    iter = 83
                 Mean = -18.694801
                                     Best =
                                              -5.940762
GΑ
    iter = 84 |
                 Mean = -18.525042
                                     Best =
                                              -5.940762
GA
    iter = 85
                 Mean = -19.781231
                                              -5.940762
                                     Best =
GA |
    iter = 86 |
                 Mean = -20.518230
                                              -5.940762
                                     Best =
    iter = 87 | Mean = -16.892118
                                              -5.742114
GΑ
                                     Best =
GA |
    iter = 88 \mid Mean = -16.259743 \mid
                                              -5.742114
                                     Best =
GA
    iter = 89 | Mean = -20.150040 |
                                              -5.742114
                                     Best =
GA
    iter = 90 | Mean = -12.582836 |
                                     Best =
                                              -5.579834
    iter = 91
               | Mean = -16.375683
                                              -5.579834
GΑ
                                     Best =
GΑ
    iter = 92
                 Mean = -12.016939
                                     Best =
                                              -5.579834
GΑ
    iter = 93
                 Mean = -13.189190
                                     Best =
                                              -5.579834
     iter = 94 |
                 Mean = -16.504596
                                              -5.579834
GΑ
                                     Best =
GΑ
    iter = 95 |
                 Mean = -16.025251
                                              -5.579834
                                     Best =
GA |
     iter = 96 | Mean = -17.644222
                                              -5.490242
                                     Best =
    iter = 97 |
                 Mean = -15.152526
                                   | Best =
GΑ
                                              -5.490242
GΑ
     iter = 98
                 Mean = -17.879772 | Best =
                                              -5.490242
GA
    iter = 99 | Mean = -11.743010 | Best =
                                              -5.490242
GA |
    iter = 100 |
                 Mean = -13.891530 | Best =
                                               -5.490242
GΑ
    iter = 101 |
                  Mean = -18.751676 | Best =
                                               -5.490242
GΑ
     iter = 102 |
                  Mean = -16.417500 | Best =
                                              -5.490242
GΑ
     iter = 103
                 Mean = -9.733724 | Best = -5.490242
     iter = 104 | Mean = -13.554079 | Best =
GΑ
                                              -5.490242
```

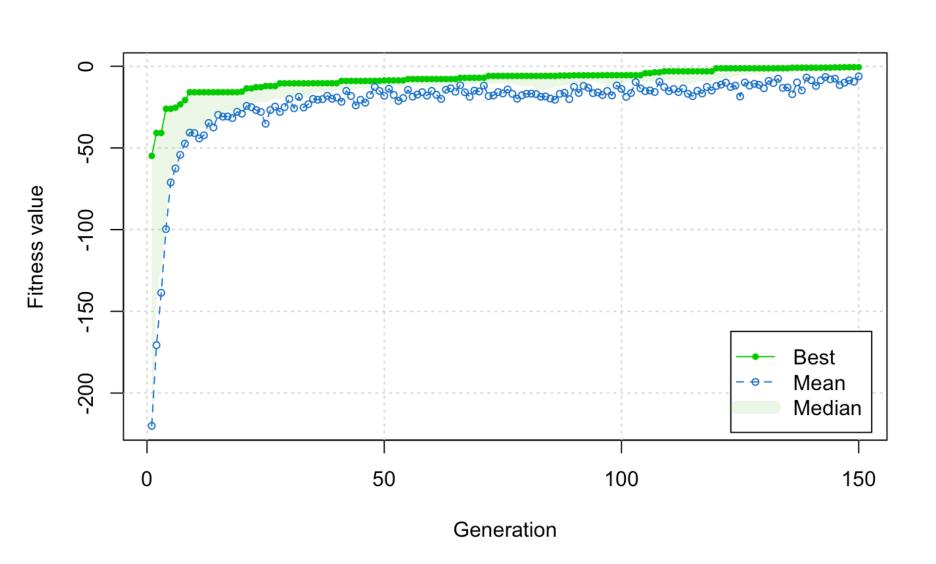
```
GA | iter = 105
                  Mean = -15.255389 | Best =
                                              -4.242993
    iter = 106
                  Mean = -14.821367
GA |
                                      Best =
                                              -4.232044
GΑ
   | iter = 107
                  Mean = -15.771833
                                      Best =
                                              -3.713437
GΑ
    iter = 108
                 Mean = -9.482741 | Best = -3.713437
   | iter = 109
                 Mean = -12.761215
                                      Best =
GΑ
                                              -3.113008
    iter = 110 |
                 Mean = -15.278978
GΑ
                                      Best =
                                              -3.113008
GΑ
    iter = 111
                 Mean = -13.954098
                                      Best =
                                              -3.113008
    iter = 112 |
                  Mean = -15.791069 | Best =
GA |
                                              -3.113008
GA
    iter = 113 |
                 Mean = -13.558644
                                      Best =
                                              -3.113008
    iter = 114 |
GΑ
                  Mean = -16.873784
                                      Best =
                                              -3.113008
GA
    iter = 115
                  Mean = -18.296013
                                      Best =
                                              -3.113008
GA |
    iter = 116
                  Mean = -15.009758
                                      Best =
                                              -3.113008
GA |
    iter = 117 |
                  Mean = -16.679559
                                      Best =
                                              -3.113008
    iter = 118
                  Mean = -12.665602
                                              -3.113008
GΑ
                                    | Best =
GA | iter = 119 |
                  Mean = -14.882788 | Best =
                                              -3.113008
GA | iter = 120 |
                  Mean = -12.087280 | Best =
                                              -1.244082
GA | iter = 121 |
                 Mean = -11.268033 | Best =
                                              -1.244082
GA | iter = 122 |
                 Mean = -10.026164 | Best =
                                              -1.244082
GΑ
    iter = 123 |
                  Mean = -12.716964 | Best =
                                              -1.244082
GA | iter = 124 |
                 Mean = -11.916685 | Best =
                                              -1.244082
GΑ
    iter = 125
                  Mean = -18.537473 | Best =
                                             -1.244082
                 Mean = -9.977300 | Best = -1.244082
GΑ
   | iter = 126
    iter = 127 |
                  Mean = -11.867164 | Best =
                                              -1.244082
GA |
GΑ
   | iter = 128
                  Mean = -10.740783 | Best =
                                              -1.244082
                 Mean = -11.401530 | Best =
    iter = 129 |
                                             -1.244082
GΑ
   | iter = 130 |
                  Mean = -13.465393 | Best = -1.244082
GΑ
                  Mean = -8.958469 | Best = -1.244082
GA | iter = 131 |
   | iter = 132
                  Mean = -10.336899 | Best = -1.244082
GΑ
                  Mean = -7.641691 | Best = -1.210087
GA
    iter = 133
                  Mean = -13.268918 | Best = -1.210087
GΑ
    iter = 134
                  Mean = -13.003052 | Best = -1.210087
GA |
    iter = 135 |
                  Mean = -17.1203751 | Best = -0.9408666
GA |
    iter = 136 |
   | iter = 137 |
                 Mean = -9.9292040 | Best = -0.9408666
GΑ
GA | iter = 138 |
                  Mean = -14.7808807 | Best = -0.9408666
GA | iter = 139 |
                 Mean = -6.9451916 | Best = -0.9408666
GA
    iter = 140
                 Mean = -8.5888664 | Best = -0.9408666
   | iter = 141 | Mean = -12.0541364 | Best = -0.9408666
GΑ
GA
    iter = 142 |
                 Mean = -8.6190551 | Best = -0.9408666
GΑ
   | iter = 143
                 Mean = -6.5696511 | Best = -0.8855573
    iter = 144 |
                 Mean = -8.0034805 | Best = -0.8855573
GA |
                 Mean = -7.6201253 | Best = -0.7273805
GΑ
   | iter = 145
                 Mean = -11.5436991 | Best = -0.7273805
    iter = 146 |
GA |
                 Mean = -10.0673968 | Best = -0.6083845
GΑ
    iter = 147 |
GΑ
    iter = 148 |
                 Mean = -8.6495918 | Best = -0.6083845
GΑ
    iter = 149
                 Mean = -9.4843359 | Best = -0.6083845
GΑ
   | iter = 150 | Mean = -6.1852469 | Best = -0.6083845
```

```
fn.call.gap <- fn.call</pre>
nsol
            x1
                      x2
                               x3
                                          x4
[1,] 0.1744992 0.2241486 0.135447 0.1770054 0.2888998
                                                                                      Hide
                                                                                      Hide
summary(gap)
- [1mGenetic Algorithm[22m -
GA settings:
Туре
                      = real-valued
Population size
                     = 50
Number of generations = 150
Elitism
                      = 2
Crossover probability = 0.75
Mutation probability = 0.1
Search domain =
      x1 x2 x3 x4 x5
lower 0 \quad 0 \quad 0 \quad 0
upper 1 1 1 1 1
GA results:
Iterations
                       = 150
Fitness function value = -0.6083845
Solution =
            x1
                      x2
                                 x3
                                           x4
                                                     x5
[1,] 0.5943835 0.7635006 0.4613628 0.6029201 0.9840577
                                                                                      Hide
```

```
plot(gap)
```

nsol <- gap@solution</pre>

nsol <- nsol / sum(nsol)</pre>



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```
#Applying GenSA to assign weights to the stocks for optimum portfolio using max objec
tive
set.seed(1234)
fn.call <<- 0
out.GenSA <- GenSA(fn = obj1, lower = rep(0, 5), upper = rep(1, 5), control = list(sm
ooth = FALSE, max.call = 3000))
fn.call.GenSA <- fn.call
out.GenSA$value</pre>
```

```
[1] 0.07357047
```

Hide

Hide

out.GenSA\$counts

[1] 5515

Hide

```
cat("GenSA call functions", fn.call.GenSA, "times.\n")
GenSA call functions 5515 times.
                                                                                      Hide
                                                                                      Hide
wstar.GenSA <- out.GenSA$par</pre>
wstar.GenSA <- wstar.GenSA / sum(wstar.GenSA)</pre>
rbind(tickers, round(100 * wstar.GenSA, 2))
        [,1] [,2] [,3] [,4] [,5]
tickers "GM" "AMZN" "BMWYY" "LVMUY" "KO"
        "16.17" "19.62" "5.93" "16.13" "42.15"
                                                                                      Hide
                                                                                      Hide
100 * (sum(wstar.GenSA * mu) - mean(mu))
[1] 0.03499312
                                                                                      Hide
                                                                                      Hide
wstar.GenSA
[1] 0.16169230 0.19624096 0.05927314 0.16133505 0.42145855
                                                                                      Hide
                                                                                      Hide
#comparing the weights as per both the algorithms
b <- matrix(c(nsol, wstar.GenSA), nrow = 5, ncol = 2)</pre>
rownames(b) = c("GM", "AMZN", "BMWYY", "LVMUY", "KO")
colnames(b) = c("GAPortfolio", "GenSAPortfolio")
b
```

```
GAPortfolio GenSAPortfolio
GM 0.1744992 0.16169230
AMZN 0.2241486 0.19624096
BMWYY 0.1354470 0.05927314
LVMUY 0.1770054 0.16133505
KO 0.2888998 0.42145855
```

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```
TickerSymbol <- (c("GM", "AMZN", "BMWYY", "LVMUY", "KO","________","TOTAL"))

Company <- (c("General Motors", "Amazon", "BMW", "Louis Vuitton", "Coca-Cola", "______",""))

GA_percent <- (c(17,22,14,18,29,"_______",100))

GenSA_percent <- (c(16,20,6,16,42,"______",100))

TData <- data.frame(TickerSymbol, Company, GA_percent, GenSA_percent)

TData
```

TickerSymbol <fctr></fctr>	Company <fctr></fctr>	GA_percent <fctr></fctr>	GenSA_percent <fctr></fctr>
GM	General Motors	17	16
AMZN	Amazon	22	20
BMWYY	BMW	14	6
LVMUY	Louis Vuitton	18	16
КО	Coca-Cola	29	42
TOTAL		100	100
7 rows			

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```
#Question number 2
x <- c(1, 3, 7, 9, 5, 2, 4, 8, 6, 22, 11, 33)
y <- c(50, 60, 70, 80, 90, 100, 66, 18, 32, 28, 69, 44)
a <- sum((y - mean(y)) ^ 2)
a1 <- sum((x - mean(x)) * (y - mean(y)))
a2 <- sum((x - mean(x)) ^ 2)
b1 <- a1/a2
b0 <- mean(y) - b1 * mean(x)
print(b1)</pre>
```

```
[1] -1.074035
                                                                                   Hide
                                                                                   Hide
print(b0)
[1] 68.85149
                                                                                   Hide
                                                                                   Hide
linear model \leftarrow lm(y \sim x)
summary(linear model)
Call:
lm(formula = y \sim x)
Residuals:
   Min 1Q Median 3Q Max
-42.259 -17.361 5.056 14.176 33.297
Coefficients:
           Estimate Std. Error t value Pr(>|t|)
(Intercept) 68.8515 10.1362 6.793 4.78e-05 ***
                       0.7893 -1.361 0.203
Х
            -1.0740
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 24.36 on 10 degrees of freedom
Multiple R-squared: 0.1562,
                              Adjusted R-squared:
F-statistic: 1.852 on 1 and 10 DF, p-value: 0.2035
                                                                                   Hide
                                                                                   Hide
obj <- function (r) {</pre>
    fn <- function (b0, b1) {
       return (sum(y - (b0 + b1 * x))^2)
```

return (fn(r[1], r[2]))

ubound \leftarrow c(2, 1) lbound \leftarrow c(0, 0)

}

```
#GA
ga_search <- ga(
    type = "real-valued",
    fitness = function (x) -obj(x),
    lower = lbound,
    upper = ubound,
    popSize = 50
)</pre>
GA | iter = 1 | Mean = -403892.1 | Best = -335421.3
```

```
GA | iter = 2 | Mean = -377150.0 | Best = -333919.3
GA | iter = 3 | Mean = -370129.6 | Best = -333919.3
GΑ
    iter = 4 \mid Mean = -362864.2 \mid Best = -333919.3
GΑ
   | iter = 5 | Mean = -362282.5 | Best = -333919.3
    iter = 6 | Mean = -363824.0 | Best = -333919.3
   | iter = 7 | Mean = -357286.4 | Best = -333919.3
GΑ
GA | iter = 8 | Mean = -353436.8 | Best = -333919.3
   | iter = 9 | Mean = -354898.5 |
                                   Best = -333919.3
GΑ
   | iter = 10 | Mean = -354040.8 | Best = -333919.3
GΑ
   | iter = 11 | Mean = -351485.2
                                    Best = -333919.3
GΑ
GA | iter = 12 | Mean = -351565.2
                                    Best = -333919.3
   | iter = 13 | Mean = -356063.5
                                    Best = -333919.3
GΑ
GΑ
    iter = 14 | Mean = -347128.4
                                    Best = -333919.3
    iter = 15 | Mean = -349145.6
                                    Best = -333919.3
GΑ
   | iter = 16 | Mean = -343803.0
                                    Best = -333919.3
GΑ
   | iter = 17 | Mean = -347402.4 |
                                    Best = -333919.3
GΑ
   | iter = 18 | Mean = -347163.9 |
                                    Best = -333919.3
GΑ
GA | iter = 19 | Mean = -342834.7 |
                                    Best = -332281.4
GA
   | iter = 20 | Mean = -340475.9 | Best = -332281.4
   | iter = 21 | Mean = -342022.8
                                    Best = -332281.4
GΑ
   | iter = 22 | Mean = -340873.2 |
                                    Best = -332281.4
GΑ
GΑ
    iter = 23 \mid Mean = -342108.1
                                    Best = -332281.4
GΑ
   | iter = 24 | Mean = -344330.4
                                    Best = -332281.4
    iter = 25 | Mean = -343726.3
                                    Best = -332281.4
GΑ
   | iter = 26 | Mean = -341465.1
                                    Best = -332281.4
GΑ
    iter = 27 | Mean = -341483.0
                                    Best = -332281.4
GΑ
   | iter = 28 | Mean = -338121.9
                                    Best = -332281.4
GΑ
GΑ
    iter = 29 | Mean = -341453.9
                                    Best = -332281.4
GA | iter = 30 | Mean = -339789.8
                                    Best = -332281.4
GA | iter = 31 | Mean = -342868.2
                                    Best = -332281.4
GA
    iter = 32 | Mean = -343080.4 |
                                    Best = -332281.4
GΑ
    iter = 33 | Mean = -346534.3
                                    Best = -332281.4
GΑ
    iter = 34 | Mean = -340127.2
                                    Best = -332281.4
GΑ
    iter = 35 | Mean = -339756.0 |
                                    Best = -332281.4
    iter = 36 | Mean = -338848.3 |
                                    Best = -332281.4
GΑ
    iter = 37 | Mean = -336189.7
                                    Best = -330283.5
GΑ
    iter = 38 | Mean = -337493.3 |
                                    Best = -330283.5
GΑ
```

```
GA | iter = 39 | Mean = -337052.4 | Best = -330283.5
GA | iter = 40 | Mean = -341067.8 | Best = -330283.5
GA | iter = 41 | Mean = -338055.6 | Best = -330283.5
GA | iter = 42 | Mean = -338749.9 | Best = -330283.5
GA | iter = 43 | Mean = -339646.8 | Best = -330283.5
GA | iter = 44 | Mean = -340985.4 | Best = -330283.5
GA | iter = 45 | Mean = -337562.0 | Best = -330283.5
GA | iter = 46 | Mean = -338880.6 | Best = -330283.5
GA | iter = 47 | Mean = -344157.3 | Best = -330283.5
GA | iter = 48 |
                Mean = -343735.9 | Best = -330283.5
GA | iter = 49 | Mean = -338466.7 | Best = -330283.5
GA | iter = 50 | Mean = -335228.3 | Best = -330283.5
GA | iter = 51 | Mean = -335926.5 | Best = -330283.5
GA | iter = 52 | Mean = -334966.7 | Best = -330283.5
GA | iter = 53 | Mean = -334931.3 | Best = -330283.5
GA | iter = 54 | Mean = -343858.1 | Best = -330283.5
GA | iter = 55 | Mean = -341752.0 | Best = -330283.5
GA | iter = 56 | Mean = -339282.8 | Best = -330283.5
GA | iter = 57 | Mean = -340306.3 | Best = -330283.5
GA | iter = 58 | Mean = -344794.6 | Best = -330283.5
GA | iter = 59 | Mean = -343859.1 | Best = -330283.5
GA | iter = 60 | Mean = -339531.1 | Best = -330283.5
GA | iter = 61 | Mean = -341775.4 | Best = -330283.5
GA | iter = 62 | Mean = -339617.2 | Best = -330283.5
GA | iter = 63 | Mean = -343398.9 | Best = -330283.5
GA | iter = 64 | Mean = -340969.4 | Best = -330283.5
GA | iter = 65 | Mean = -338236.5 | Best = -330283.5
GA | iter = 66 | Mean = -335959.0 | Best = -330283.5
GA | iter = 67 | Mean = -334600.6 | Best = -330283.5
GA | iter = 68 | Mean = -335563.8 | Best = -330283.5
GA | iter = 69 | Mean = -339584.7 | Best = -330283.5
GA | iter = 70 | Mean = -338229.7 | Best = -330283.5
GA | iter = 71 | Mean = -339000.0 | Best = -330283.5
GA | iter = 72 | Mean = -341541.7 | Best = -330283.5
GA | iter = 73 | Mean = -340092.1 | Best = -330283.5
GA | iter = 74 | Mean = -340178.6 | Best = -329092.6
GA | iter = 75 | Mean = -334147.4 | Best = -329092.6
GA | iter = 76 | Mean = -333630.5 | Best = -329092.6
GA | iter = 77 | Mean = -335727.1 | Best = -329092.6
GA | iter = 78 | Mean = -337175.8 | Best = -329092.6
GA | iter = 79 | Mean = -338815.5 | Best = -329092.6
GA | iter = 80 | Mean = -337000.0 | Best = -329092.6
GA | iter = 81 | Mean = -337607.0 | Best = -329092.6
GA | iter = 82 | Mean = -334785.7 | Best = -329047.1
GA | iter = 83 | Mean = -334470.7 | Best = -329047.1
GA | iter = 84 | Mean = -335528.8 | Best = -329047.1
GA | iter = 85 | Mean = -331863.6 | Best = -329011.7
                Mean = -339104.1 | Best = -328872.7
GΑ
    iter = 86 |
GΑ
    iter = 87 | Mean = -332051.2 |
                                    Best = -328872.7
GA | iter = 88 | Mean = -333586.3 | Best = -328872.7
```

```
GA | iter = 89 | Mean = -335494.7 | Best = -328872.7

GA | iter = 90 | Mean = -336700.1 | Best = -328872.7

GA | iter = 91 | Mean = -333298.6 | Best = -328872.7

GA | iter = 92 | Mean = -333040.3 | Best = -328872.7

GA | iter = 93 | Mean = -334963.9 | Best = -328872.7

GA | iter = 94 | Mean = -337678.7 | Best = -328872.7

GA | iter = 95 | Mean = -341479.6 | Best = -328872.7

GA | iter = 96 | Mean = -335546.5 | Best = -328872.7

GA | iter = 97 | Mean = -337048.7 | Best = -328872.7

GA | iter = 98 | Mean = -336001.5 | Best = -328872.7

GA | iter = 99 | Mean = -337561.5 | Best = -328649.5

GA | iter = 100 | Mean = -337931.5 | Best = -328649.5
```

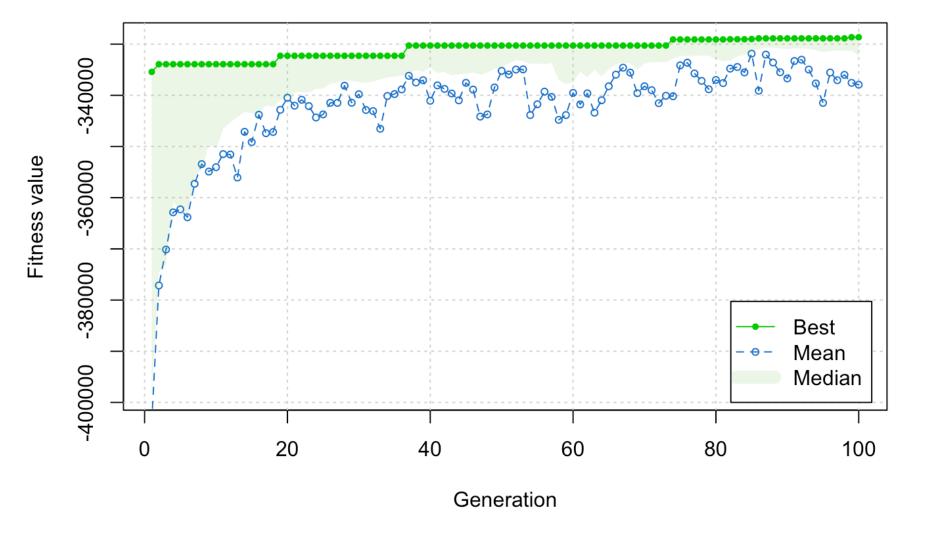
Hide

```
summary(ga_search)
```

```
— [1mGenetic Algorithm[22m -
GA settings:
                      = real-valued
Type
Population size
                      = 50
Number of generations = 100
Elitism
Crossover probability = 0.8
Mutation probability = 0.1
Search domain =
     x1 x2
lower 0 0
upper
       2 1
GA results:
Iterations
                       = 100
Fitness function value = -328649.5
Solution =
          x1
[1,] 1.93741 0.9952385
```

Hide

```
plot(ga_search)
```



```
#SA
par <- c(1, 0)
sa_search <- GenSA(
   par = par,
   lower = lbound,
   upper = ubound,
   fn = obj
)</pre>
```