

Stats506: hw2_4

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Stats506: Problem 4 Code

Data Used:

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We are looking to compare coverage probabilities and width of confidence intervals for the median with 4 different distributions and 3 different sample sizes.

Most of the computationally intensive methods are embedded in the functions, so I will just display the tables

```
# Standard Normal Distribution, for sample sizes 50, 250, and 1000 (mean = 0, sd = 1)
a1 = Compute_median_cvrg_prob(samplesize = 50, intervalrep = 200, dist = rnorm(n = 50, mean = 0, sd = 1))
a2 = Compute_median_cvrg_prob(samplesize = 250, intervalrep = 200, dist = rnorm(n = 250, mean = 0, sd = 1))
a3 = Compute_median_cvrg_prob(samplesize = 1000, intervalrep = 200, dist = rnorm(n = 1000, mean = 0, sd = 1))

a4 = Compute_median_95CI_width(samplesize = 50, intervalrep = 200, bigdist = rnorm(n = 50*200, mean = 0, sd = 1))
a5 = Compute_median_95CI_width(samplesize = 250, intervalrep = 200, bigdist = rnorm(n = 250*200, mean = 0, sd = 1))
a6 = Compute_median_95CI_width(samplesize = 1000, intervalrep = 200, bigdist = rnorm(n = 1000*200, mean = 0, sd = 1))

a7 = Compute_robust_cvrg_prob(samplesize = 50, intervalrep = 200, dist = rnorm(n = 50, mean = 0, sd = 1))
a8 = Compute_robust_cvrg_prob(samplesize = 250, intervalrep = 200, dist = rnorm(n = 250, mean = 0, sd = 1))
a9 = Compute_robust_cvrg_prob(samplesize = 1000, intervalrep = 200, dist = rnorm(n = 1000, mean = 0, sd = 1))

a10 = Compute_robust_estimator_CI_width(samplesize = 50, intervalrep = 200, bigdist = rnorm(n = 50*200, mean = 0, sd = 1))
a11 = Compute_robust_estimator_CI_width(samplesize = 250, intervalrep = 200, bigdist = rnorm(n = 250*200, mean = 0, sd = 1))
a12 = Compute_robust_estimator_CI_width(samplesize = 1000, intervalrep = 200, bigdist = rnorm(n = 1000*200, mean = 0, sd = 1))

#Table
normtable = createtable(a1,a2,a3,a4,a5,a6,a7,a8,a9,a10,a11,a12, "Standard Normal Dist", "mean = 0, sd = 1")

##          Convergence Probability
##          "Standard Normal Dist"
## Bootstrap, Size = 50          "0.855"
## Bootstrap, Size = 250        "0.015"
## Bootstrap, Size = 1000       "0.925"
## Robust Estimation, Size = 50  "0.885"
## Robust Estimation, Size = 250 "0.55"
## Robust Estimation, Size = 1000 "0.855"
##          Width of Confidence Interval
##          "mean = 0, sd = 1"
## Bootstrap, Size = 50          "0.690510438776347"
## Bootstrap, Size = 250        "0.309720009618319"
## Bootstrap, Size = 1000       "0.154674604734466"
## Robust Estimation, Size = 50  "0.544950058568191"
## Robust Estimation, Size = 250 "0.249722744070916"
## Robust Estimation, Size = 1000 "0.124364775469699"

# Exponential Distribution, for sample sizes 50, 250, and 1000 (rate parameter = 1)
b1 = Compute_median_cvrg_prob(samplesize = 50, intervalrep = 200, dist = rexp(n = 50, rate = 1), bigdist = rexp(n = 50*200, rate = 1))
b2 = Compute_median_cvrg_prob(samplesize = 250, intervalrep = 200, dist = rexp(n = 250, rate = 1), bigdist = rexp(n = 250*200, rate = 1))
b3 = Compute_median_cvrg_prob(samplesize = 1000, intervalrep = 200, dist = rexp(n = 1000, rate = 1), bigdist = rexp(n = 1000*200, rate = 1))
```

```

b4 = Compute_median_95CI_width(samplesize = 50, intervalrep = 200, bigdist = rexp(n = 50*200, rate = 1))
b5 = Compute_median_95CI_width(samplesize = 250, intervalrep = 200, bigdist = rexp(n = 250*200, rate = 1))
b6 = Compute_median_95CI_width(samplesize = 1000, intervalrep = 200, bigdist = rexp(n = 1000*200, rate = 1))

b7 = Compute_robust_cvrg_prob(samplesize = 50, intervalrep = 200, dist = rexp(n = 50, rate = 1), bigdist = rexp(n = 50*200, rate = 1))
b8 = Compute_robust_cvrg_prob(samplesize = 250, intervalrep = 200, dist = rexp(n = 250, rate = 1), bigdist = rexp(n = 250*200, rate = 1))
b9 = Compute_robust_cvrg_prob(samplesize = 1000, intervalrep = 200, dist = rexp(n = 1000, rate = 1), bigdist = rexp(n = 1000*200, rate = 1))

b10 = Compute_robust_estimator_CI_width(samplesize = 50, intervalrep = 200, bigdist = rexp(n = 50*200, rate = 1))
b11 = Compute_robust_estimator_CI_width(samplesize = 250, intervalrep = 200, bigdist = rexp(n = 250*200, rate = 1))
b12 = Compute_robust_estimator_CI_width(samplesize = 1000, intervalrep = 200, bigdist = rexp(n = 1000*200, rate = 1))

# Table
exptable = createtable(b1,b2,b3,b4,b5,b6,b7,b8,b9,b10,b11,b12, "Exponential Dist", "rate = 1")
exptable

```

```

##                               Convergence Probability
##                               "Exponential Dist"
## Bootstrap, Size = 50         "0.76"
## Bootstrap, Size = 250        "0.905"
## Bootstrap, Size = 1000       "0.565"
## Robust Estimation, Size = 50  "0.835"
## Robust Estimation, Size = 250 "0.17"
## Robust Estimation, Size = 1000 "0.75"
##                               Width of Confidence Interval
##                               "rate = 1"
## Bootstrap, Size = 50         "0.551515351637972"
## Bootstrap, Size = 250        "0.250987104622502"
## Bootstrap, Size = 1000       "0.123590769596971"
## Robust Estimation, Size = 50  "0.393610442104561"
## Robust Estimation, Size = 250 "0.176215055464033"
## Robust Estimation, Size = 1000 "0.089021504395167"

```

```

# Uniform Distribution, for sample sizes 50, 250, and 1000 (min = 0, max = 1)
c1 = Compute_median_cvrg_prob(samplesize = 50, intervalrep = 200, dist = runif(n = 50, min = 0, max = 1))
c2 = Compute_median_cvrg_prob(samplesize = 250, intervalrep = 200, dist = runif(n = 250, min = 0, max = 1))
c3 = Compute_median_cvrg_prob(samplesize = 1000, intervalrep = 200, dist = runif(n = 1000, min = 0, max = 1))

c4 = Compute_median_95CI_width(samplesize = 50, intervalrep = 200, bigdist = runif(n = 50*200, min = 0, max = 1))
c5 = Compute_median_95CI_width(samplesize = 250, intervalrep = 200, bigdist = runif(n = 250*200, min = 0, max = 1))
c6 = Compute_median_95CI_width(samplesize = 1000, intervalrep = 200, bigdist = runif(n = 1000*200, min = 0, max = 1))

c7 = Compute_robust_cvrg_prob(samplesize = 50, intervalrep = 200, dist = runif(n = 50, min = 0, max = 1), bigdist = runif(n = 50*200, min = 0, max = 1))
c8 = Compute_robust_cvrg_prob(samplesize = 250, intervalrep = 200, dist = runif(n = 250, min = 0, max = 1), bigdist = runif(n = 250*200, min = 0, max = 1))
c9 = Compute_robust_cvrg_prob(samplesize = 1000, intervalrep = 200, dist = runif(n = 1000, min = 0, max = 1), bigdist = runif(n = 1000*200, min = 0, max = 1))

c10 = Compute_robust_estimator_CI_width(samplesize = 50, intervalrep = 200, bigdist = runif(n = 50*200, min = 0, max = 1))
c11 = Compute_robust_estimator_CI_width(samplesize = 250, intervalrep = 200, bigdist = runif(n = 250*200, min = 0, max = 1))
c12 = Compute_robust_estimator_CI_width(samplesize = 1000, intervalrep = 200, bigdist = runif(n = 1000*200, min = 0, max = 1))

# Table
uniformtable = createtable(c1,c2,c3,c4,c5,c6,c7,c8,c9,c10,c11,c12, "Uniform Dist", "min = 0, max = 1")
uniformtable

```

```

##                               Convergence Probability
##                               "Uniform Dist"

```

```

## Bootstrap, Size = 50          "0.725"
## Bootstrap, Size = 250        "0.915"
## Bootstrap, Size = 1000       "0.775"
## Robust Estimation, Size = 50  "0.82"
## Robust Estimation, Size = 250 "0.745"
## Robust Estimation, Size = 1000 "0.795"
##                               Width of Confidence Interval
##                               "min = 0, max = 1"
## Bootstrap, Size = 50          "0.268622345614218"
## Bootstrap, Size = 250        "0.12186597735282"
## Bootstrap, Size = 1000       "0.0614908542177582"
## Robust Estimation, Size = 50  "0.197751426757243"
## Robust Estimation, Size = 250 "0.0911275472376818"
## Robust Estimation, Size = 1000 "0.0459218959596955"

# Gamma Distribution, for sample sizes 50, 250, and 1000 (shape parameter = 3, rate = 1)
d1 = Compute_median_cvrg_prob(samplesize = 50, intervalrep = 200, dist = rgamma(n = 50, shape = 3, rate = 1))
d2 = Compute_median_cvrg_prob(samplesize = 250, intervalrep = 200, dist = rgamma(n = 250, shape = 3, rate = 1))
d3 = Compute_median_cvrg_prob(samplesize = 1000, intervalrep = 200, dist = rgamma(n = 1000, shape = 3, rate = 1))

d4 = Compute_median_95CI_width(samplesize = 50, intervalrep = 200, bigdist = rgamma(n = 50*200, shape = 3, rate = 1))
d5 = Compute_median_95CI_width(samplesize = 250, intervalrep = 200, bigdist = rgamma(n = 250*200, shape = 3, rate = 1))
d6 = Compute_median_95CI_width(samplesize = 1000, intervalrep = 200, bigdist = rgamma(n = 1000*200, shape = 3, rate = 1))

d7 = Compute_robust_cvrg_prob(samplesize = 50, intervalrep = 200, dist = rgamma(n = 50, shape = 3, rate = 1))
d8 = Compute_robust_cvrg_prob(samplesize = 250, intervalrep = 200, dist = rgamma(n = 250, shape = 3, rate = 1))
d9 = Compute_robust_cvrg_prob(samplesize = 1000, intervalrep = 200, dist = rgamma(n = 1000, shape = 3, rate = 1))

d10 = Compute_robust_estimator_CI_width(samplesize = 50, intervalrep = 200, bigdist = rgamma(n = 50*200, shape = 3, rate = 1))
d11 = Compute_robust_estimator_CI_width(samplesize = 250, intervalrep = 200, bigdist = rgamma(n = 250*200, shape = 3, rate = 1))
d12 = Compute_robust_estimator_CI_width(samplesize = 1000, intervalrep = 200, bigdist = rgamma(n = 1000*200, shape = 3, rate = 1))

# Table
gammatable = createtable(d1,d2,d3,d4,d5,d6,d7,d8,d9,d10,d11,d12, "Gamma Dist", "shape = 3, rate = 1")
gammatable

##                               Convergence Probability
##                               "Gamma Dist"
## Bootstrap, Size = 50          "0.93"
## Bootstrap, Size = 250        "0.935"
## Bootstrap, Size = 1000       "0.86"
## Robust Estimation, Size = 50  "0.775"
## Robust Estimation, Size = 250 "0.385"
## Robust Estimation, Size = 1000 "0.815"
##                               Width of Confidence Interval
##                               "shape = 3, rate = 1"
## Bootstrap, Size = 50          "1.12943965287951"
## Bootstrap, Size = 250        "0.498649060936842"
## Bootstrap, Size = 1000       "0.252522627334669"
## Robust Estimation, Size = 50  "0.858623341344718"
## Robust Estimation, Size = 250 "0.390588073609076"
## Robust Estimation, Size = 1000 "0.195685839087385"

```

The tables are fairly straightforward in showing that the CI widths generally decrease as we increase sample size. In addition, we can compare the coverage probabilities by their trends as we alter the sample size. Based on the characteristics of the distribution at hand, the

estimator from bootstrap and robust estimation
can vary from little to wildly

```
## Appendix ##
## Packages Utilized ##
library("dplyr", lib.loc=~R/x86_64-pc-linux-gnu-library/3.4")
library("ggplot2", lib.loc=~R/x86_64-pc-linux-gnu-library/3.4")
library("knitr", lib.loc=~R/x86_64-pc-linux-gnu-library/3.4")
library("rmarkdown", lib.loc=~R/x86_64-pc-linux-gnu-library/3.4")
library("stringdist", lib.loc=~R/x86_64-pc-linux-gnu-library/3.4")
library("stringr", lib.loc=~R/x86_64-pc-linux-gnu-library/3.4")
library("tidyr", lib.loc=~R/x86_64-pc-linux-gnu-library/3.4")

# Begin Functions Section #
Boot_median_95CI_function = function(x, B = 1000){ # Use the bootstrapping technique with 1000 bootstrap samples
  n = length(x)
  boot_samples = sample(x, n*B, replace = TRUE) # Sample with replacement
  dim(boot_samples) = c(B, n) # each row is a dataset
  boot_norm_median = apply(boot_samples, 1, function(b) median(b)) # Apply median to each bootstrap sample
  norm_lower_bound = unname(quantile(boot_norm_median, .025))
  norm_upper_bound = unname(quantile(boot_norm_median, .975)) # Find the 95% range of values and bounds
  return(c(norm_lower_bound, norm_upper_bound))
}

Compute_median_cvrg_prob = function(samplesize, intervalrep, dist, bigdist){ # Calculate convergence probability
  norm_median_est = median(dist) # theoretical value
  dim(bigdist) = c(intervalrep, samplesize)
  AllCI = apply(bigdist, 1, Boot_median_95CI_function) # Bootstrap the repetitions of samples to obtain 95% CI
  cvrg_prob = mean(((AllCI[1,]) < norm_median_est) & ((AllCI[2,]) > norm_median_est)) # Calculate the proportion of CIs
  return(cvrg_prob)
}

Compute_median_95CI_width = function(samplesize, intervalrep, bigdist){ # Calculating the average width of 95% CI
  dim(bigdist) = c(intervalrep, samplesize)
  AllCI = apply(bigdist, 1, Boot_median_95CI_function) # Bootstrapping again
  width = mean(AllCI[2,] - AllCI[1,])
  return(width)
}

Compute_robust_cvrg_prob = function(samplesize, intervalrep, dist, bigdist){ # Using a robust method, width of 95% CI
  norm_median_est = median(dist) # Theoretical value
  dim(bigdist) = c(intervalrep, samplesize)
  # Calculation of estimated parameters
  med = apply(bigdist, 1, median)
  absol = abs(bigdist - med)
  mad = apply(absol, 1, median)
  mul = qnorm(1-{1-.95}/2) # 95% CI Level
  error = (mul * (1.49 * mad)) / (sqrt(dim(bigdist)[2]))
  ubd = med + error
  lbd = med - error
  cvrg_prob = mean(((lbd) < norm_median_est) & ((ubd) > norm_median_est)) # Calculate proportion of CIs
  return(cvrg_prob)
}
```

```

Compute_robust_estimator_CI_width = function(samplesize, intervalrep, bigdist){ # Calculating average w
  dim(bigdist) = c(intervalrep, samplesize)
  # Calculation of estimated parameters
  med = apply(bigdist, 1, median)
  absol = abs(bigdist - med)
  mad = apply(absol, 1, median)
  mul = qnorm(1-({1-.95}/2)) # 95% CI Level
  error = (mul * (1.49 * mad)) / (sqrt(dim(bigdist)[2]))
  ubd = med + error
  lbd = med - error
  return(mean(ubd - lbd))
}

createtable = function(a,b,c,d,e,f,g,h,i,j,k,l,m,n){ # Create a table for viewing and reporting purpose
  values = c(m,a,b,c,g,h,i,n,d,e,f,j,k,l)
  listdimnames = list(c("", "Bootstrap, Size = 50", "Bootstrap, Size = 250", "Bootstrap, Size = 1000", 
  table = matrix(data = values, nrow = 7, ncol = 2, dimnames = listdimnames)
  return(table)
}
# End Functions Section #

```