Assignment2

Michael Seebregts

2025-10-27

```
## Warning: package 'magick' was built under R version 4.5.1

## Linking to ImageMagick 6.9.13.29
## Enabled features: cairo, freetype, fftw, ghostscript, heic, lcms, pango, raw, rsvg, webp
## Disabled features: fontconfig, x11
```

#Q1

Q1a

```
game_status=function(xt,objects, rad)
       = rep(0,dim(xt)[1])
 min_dists = rep(0,dim(xt)[1])
          = dim(objects)[1]
           = matrix(1,J,1)
 ones
 for(i in 1:dim(xt)[1])
   min_dists[i] = min(sqrt(rowSums((objects-ones%*%xt[i,])^2)))
   if (((xt[i, 1])^2 + (xt[i, 2]^2) >= 1))
   {
     sk[i] = 1
   else if (min_dists[i] < rad)</pre>
     sk[i] = -1
   }
   else
     sk[i] = 0
   }
 }
  \#sk = 1*(xt[,2]>1)-1*((xt[,1]<-1)|(xt[,1]>+1)|(xt[,2]<-1)|(min\_dists< rad))
 ret = list(status = sk, minDist = min_dists)
 return(ret)
```

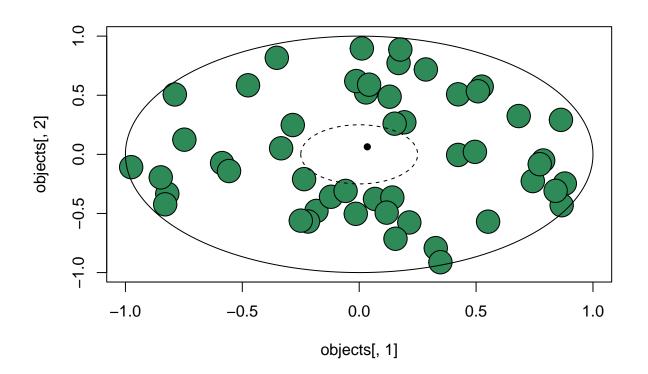
Q₁b

i

```
options(scipen = 999)

draw_objects = function(J)
{
    r_o = runif(J,0.3,1)
    pi_vals = runif(J,-1,1)*pi
    o1 = r_o*cos(pi_vals) # x-coordinates of objects
    o2 = r_o*sin(pi_vals)
    return(cbind(o1,o2))
}
draw_starts = function(N = 1)
{
    r_x = runif(N,0,0.25)
```

```
= runif(N,-1,1)*pi
 pi_x
              matrix(cbind(r_x*cos(pi_x),r_x*sin(pi_x)),nrow = N,byrow = TRUE)
  xt
}
set.seed(2024)
        = 50
objects = draw_objects(J)
        = draw_starts()
        = 0.025
                            # How big are the steps you can take?
delt
rad
        = 0.05
                            # How close to an object before you crash?
# Just a function to plot the game:
plot_game = function(xt,objects,rad,cols = 1)
  plot(objects[,2] \sim objects[,1], type = 'n', ylim = c(-1,1), xlim = c(-1,1))
  symbols(objects[,1],objects[,2],circles = rep(rad,J),ylim = c(-1,1),xlim = c(-1,1),inches = FALSE,add
  points(xt[,2]~xt[,1], pch = 16, cex = 1,col = cols)
  pi_v = seq(-1,1,1/100)*pi
  y_edge = sin(pi_v)
  x_edge = cos(pi_v)
  lines(y_edge~x_edge)
  lines(c(0.25*y_edge)~c(0.25*x_edge), lty = 2)
}
plot_game(xt,objects,rad,'black')
```



```
play = function(x0,delt,objects,rad,theta,plt = FALSE,trace = FALSE)
 k
              = 0 # Count how many steps
 xt
              = x0  # Set the initial coordinate(s) for the drone.
  trajectories = NULL
  # Check the game status:
 res_status = game_status(xt, objects, rad)
           = res status$status
    # Check which games are still active:
  terminal
             = (status != 0)
  if(trace)
   trajectories = array(dim = c(dim(xt)[1],dim(xt)[2],101))
   trajectories[,,1] = xt
  if(plt){plot_game(xt,objects,rad,'black')}
  while((any(status==0))&(k<100))
   k = k + 1
    # Now, let the model update the position of the pieces:
   ct = control(xt, theta)
   xt = xt+ct*delt*cbind(1-terminal,1-terminal)
    # Checkk the game status after the positions are updates:
   res_status = game_status(xt, objects, rad)
               = res_status$status
   status
               = (status != 0)
   terminal
   if(trace){trajectories[,,k] = xt}
   if(plt){plot_game(xt,objects,rad,c('red','black','green')[status+2])}
 }
 return(list(k = k, status = status,xt= xt,trajectories = trajectories))
model = function(X, theta, nodes)
  # Infer dimensions:
 N = dim(X)[1]
 p = dim(X)[2]
 q = 2
 dims = c(p,nodes,q)
  # Populate weight and bias matrices:
  index = 1:(dims[1]*dims[2])
  W1 = matrix(theta[index],dims[1],dims[2])
  index = max(index)+1:(dims[2]*dims[3])
  W2 = matrix(theta[index],dims[2],dims[3])
  index = max(index)+1:(dims[3]*dims[4])
       = matrix(theta[index],dims[3],dims[4])
  index = max(index)+1:(dims[2])
```

```
b1 = matrix(theta[index],dims[2],1)
  index = max(index)+1:(dims[3])
  b2 = matrix(theta[index],dims[3],1)
  index = max(index)+1:(dims[4])
       = matrix(theta[index],dims[4],1)
         = matrix(1, 1, N)
  ones
  a0
         = t(X)
   # Evaluate the updating equation in matrix form
  a1 = tanh(t(W1)) **a0 + b1% **ones)
  a2 = tanh(t(W2)) * a1 + b2 * ones)
  a3 = tanh(t(W3)%*%a2 + b3%*%ones)
  # Return a list of relevant objects:
  return(list(a3 = t(a3)))
}
     = 2
p
     = 2
nodes = 3
npars = p*nodes+nodes*nodes+nodes+q+nodes+q
npars
## [1] 29
theta_rand = runif(npars,-1,1)
control = function(xt,pars)
  res_model = model(xt,pars,rep(nodes,2))
  return(res_model$a3)
control(xt,theta_rand)
                        [,2]
##
              [,1]
## [1,] 0.06081162 0.3134288
play_a_game = function(theta)
       = draw_starts()
  xt
       = play(xt,delt,objects,rad,theta, trace = TRUE)
  score = mean(res$status==1)
  return(score)
}
# play_a_game(theta_rand)
library('GA')
```

Warning: package 'GA' was built under R version 4.5.1

```
## Loading required package: foreach
## Loading required package: iterators
## Package 'GA' version 3.2.4
## Type 'citation("GA")' for citing this R package in publications.
##
## Attaching package: 'GA'
## The following object is masked from 'package:utils':
##
##
       de
obj = play_a_game
GA = ga(type = 'real-valued', fitness = play_a_game, lower = rep(-10, npars), upper = rep(10, npars), popSi
#plot(GA)
theta_hat = GA@solution[1,]
\#theta\_hat
fps = 1
w = 800; h = 800
img = image_graph(width = w, height = h, res = 120)
win = c()
for(i in 1:100)
  #objects = draw_objects(J)
 xt_try = draw_starts()
 plot_game(xt_try,objects,rad,'black')
  res_final = play(xt_try,delt,objects,rad,theta_hat,plt = FALSE,trace = TRUE)
  #print(typeof(res_final$trajectories))
 trajs = na.omit(res_final$trajectories)
 lines(trajs[, 2,]~trajs[, 1, ])
  win[i] = (res_final$status==1)
propWins = data.frame("Proportion of successful navigations" = mean(win)*100)
kable(propWins)
```

Proportion.of.successful.navigations

48

ii

```
img2 = image_graph(width = w, height = h, res = 120)
winNewObjs = c()
for(i in 1:100)
{

    objects = draw_objects(J)
    xt_try = draw_starts()
    plot_game(xt_try,objects,rad,'black')
    res_final = play(xt_try,delt,objects,rad,theta_hat,plt = FALSE,trace = TRUE)
    #print(typeof(res_final$trajectories))

    trajs = na.omit(res_final$trajectories)
    lines(trajs[, 2,]~trajs[, 1, ])
    winNewObjs[i] = (res_final$status==1)
}
propNewWins = data.frame("Proportion of successful navigations" = mean(winNewObjs))
kable(propNewWins)
```

Proportion.of.successful.navigations

0.27

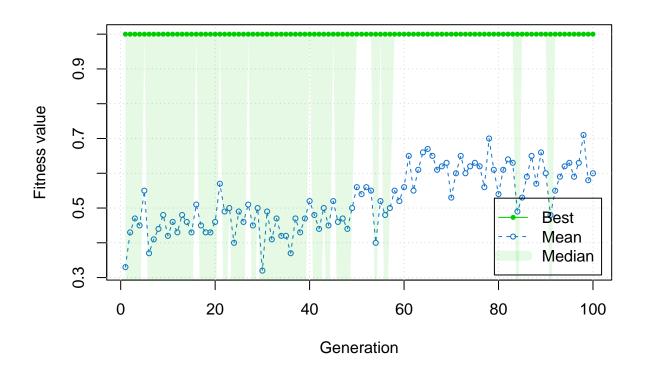
Q1c

i

```
### c
playAdj = function(x0,delt,objects,rad,theta,plt = FALSE,trace = FALSE)
{
             = 0 # Count how many steps
 k
 xt
             = x0  # Set the initial coordinate(s) for the drone.
 trajectories = NULL
  # Check the game status:
 res_status = game_status(xt, objects, rad)
  status
            = res status$status
 minDists = res_status$minDist
  inverseDist = 1/(minDists-rad)
  # Check which games are still active:
  terminal
              = (status != 0)
  if(trace)
   trajectories = array(dim = c(dim(xt)[1],dim(xt)[2],101))
   trajectories[,,1] = xt
  if(plt){plot_game(xt,objects,rad,'black')}
  while((any(status==0))&(k<100))
   k = k + 1
```

```
ct = controlAdjusted(xt, theta, inverseDist)
    xt = xt+ct*delt*cbind(1-terminal,1-terminal)
    # Checkk the game status after the positions are updates:
    res_status = game_status(xt, objects, rad)
              = res_status$status
    minDists = res_status$minDist
    inverseDist = 1/(minDists-rad)
    terminal
             = (status != 0)
    if(trace){trajectories[,,k] = xt}
    if(plt){plot_game(xt,objects,rad,c('red','black','green')[status+2])}
 return(list(k = k, status = status,xt= xt,trajectories = trajectories))
controlAdjusted = function(xt,pars, inverseDist)
 xt_aug = cbind(xt, inverseDist)
 res_model = model(xt_aug,pars,rep(nodes,2))
 return(res_model$a3)
play_a_game_adj = function(theta)
       = draw_starts()
 xt
      = playAdj(xt,delt,objects,rad,theta, trace = TRUE)
  score = mean(res$status==1)
  return(score)
}
     = 3
q = 2
nodes = 3
npars = p*nodes+nodes*nodes+nodes+q+nodes+q
npars
## [1] 32
theta_rand = runif(npars,-1,1)
objAdj = play_a_game_adj
GA_adj = ga(type = 'real-valued',fitness = play_a_game_adj,lower = rep(-10,npars),upper = rep(10,npars
plot(GA_adj)
```

Now, let the model update the position of the pieces:



```
theta_hat_adj = GA_adj@solution[1,]
theta_hat_adj
##
                       x2
                                  xЗ
                                              x4
                                                         x5
                                                                    x6
                                                                                x7
           x1
   -0.9701872
               0.7625378
                           2.2235240
                                     -0.4363090
                                                  3.3083093 -0.9100121 -1.8116587
##
                       x9
##
           x8
                                 x10
                                            x11
                                                        x12
                                                                    x13
                                                                               x14
               2.2081672 -0.8227137
                                      1.8983000
##
   -0.6714361
                                                -0.2765110 -3.1899070 -0.2120395
##
          x15
                     x16
                                             x18
                                                                    x20
##
    2.1475885
               1.5860119 -2.0250661 -0.0130785
                                                -1.0213971
                                                             2.8699384 -1.0138585
          x22
                      x23
                                 x24
                                             x25
                                                        x26
                                                                    x27
                                                                               x28
##
    1.8663929 -1.1554169 -0.3377329 -1.4882045
                                                 7.7751805 -1.0679383 3.0472488
##
          x29
                     x30
                                 x31
##
                                             x32
                          1.1963050 3.2648460
    0.4254153 0.6348349
##
img3 = image_graph(width = w, height = h, res = 120)
win_adj = c()
for(i in 1:100)
{
  #objects = draw_objects(J)
            = draw_starts()
  xt_try
  plot_game(xt_try,objects,rad,'black')
  res_final = playAdj(xt_try,delt,objects,rad,theta_hat_adj,plt = FALSE,trace = TRUE)
  #print(typeof(res_final$trajectories))
```

```
trajs = na.omit(res_final$trajectories)
lines(trajs[, 2,]~trajs[, 1, ])
win_adj[i] = (res_final$status==1)
}
propWinsAdj = data.frame("Proportion of successful navigations" = mean(win_adj)*100)
kable(propWinsAdj)
```

Proportion.of.successful.navigations

29

```
img4 = image_graph(width = w, height = h, res = 120)
winNewObjs_adj = c()
for(i in 1:100)
{

    objects = draw_objects(J)
    xt_try = draw_starts()
    plot_game(xt_try,objects,rad,'black')
    res_final = playAdj(xt_try,delt,objects,rad,theta_hat_adj,plt = FALSE,trace = TRUE)
    #print(typeof(res_final$trajectories))

    trajs = na.omit(res_final$trajectories)
    lines(trajs[, 2,]~trajs[, 1, ])
    winNewObjs_adj[i] = (res_final$status==1)
}
mean(winNewObjs_adj)
```

[1] 0.28

propNewWinsAdj = data.frame("Proportion of successful navigations" = mean(winNewObjs_adj)*100)
kable(propNewWinsAdj)

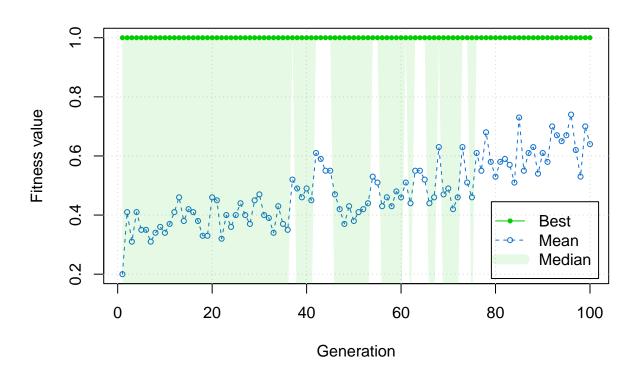
 ${\bf Proportion. of. successful. navigations}$

28

Q1d

```
### d
play_a_game_adj_newObs = function(theta)
{
    xt = draw_starts()
    objects = draw_objects(J)
    res = playAdj(xt,delt,objects,rad,theta, trace = TRUE)
    score = mean(res$status==1)
    return(score)
}
```

```
objAdj = play_a_game_adj_newObs
GA_adj_newObs = ga(type = 'real-valued',fitness = play_a_game_adj_newObs,lower = rep(-10,npars),upper
plot(GA_adj_newObs)
```



```
theta_hat_adj_newObs = GA_adj_newObs@solution[1,]
theta_hat_adj_newObs
                                              x4
##
                       x2
                                   хЗ
                                                          x5
                                                                     x6
                                                                                 x7
           x1
                           0.3020354
    3.9029900
               3.8203046
                                      3.6447905
                                                  3.4153999 -1.6367394
                                                                         1.5385434
##
                                                         x12
##
           x8
                       x9
                                 x10
                                             x11
                                                                    x13
                                                                                x14
##
    1.3441913 -0.4753239 -0.7238650
                                       3.0368669
                                                  0.2852006 -0.6652189
                                                                          1.2127239
          x15
                      x16
                                             x18
##
                                 x17
                                                         x19
                                                                    x20
                                                                                x21
##
    2.0225949
               2.7806615 -0.3843214
                                       2.9709117
                                                  0.5513355
                                                              0.9206854
                                                                          4.1124271
                                 x24
                                                                    x27
##
          x22
                      x23
                                             x25
                                                         x26
                                                                                x28
   -0.4281843
               0.7484773 -1.5721754 -2.1998529
                                                  0.8128878 -0.7787385
##
                                                                         2.9601865
##
          x29
                      x30
                                 x31
                                             x32
## -3.4875263
               1.9224238 -1.9864429 -0.4461203
img5 = image_graph(width = w, height = h, res = 120)
win_adj_new0bs = c()
for(i in 1:100)
{
```

```
#objects = draw_objects(J)
  xt_try = draw_starts()
  plot_game(xt_try,objects,rad,'black')
  res_final = playAdj(xt_try,delt,objects,rad,theta_hat_adj_newObs,plt = FALSE,trace = TRUE)
  #print(typeof(res_final$trajectories))
  trajs = na.omit(res_final$trajectories)
  lines(trajs[, 2,]~trajs[, 1, ])
  win_adj_newObs[i] = (res_final$status==1)
mean(win_adj_newObs)
## [1] 0.56
img6 = image_graph(width = w, height = h, res = 120)
winNewObjs_adj_genNewObs = c()
for(i in 1:100)
{
  objects = draw_objects(J)
  xt try
           = draw_starts()
  plot_game(xt_try,objects,rad,'black')
  res_final = playAdj(xt_try,delt,objects,rad,theta_hat_adj_newObs,plt = FALSE,trace = TRUE)
  #print(typeof(res_final$trajectories))
  trajs = na.omit(res final$trajectories)
  lines(trajs[, 2,]~trajs[, 1, ])
  winNewObjs_adj_genNewObs[i] = (res_final$status==1)
mean(winNewObjs_adj_genNewObs)
## [1] 0.6
\mathbf{Q2}
         [,1] [,2] [,3] [,4] [,5] [,6] [,7] [,8]
##
## [1,]
            1
                 0
                      0
                           1
                                0
                                     0
                                          1
## [2,]
                                          0
                                               0
                 0
                      0
                           0
                                     0
            1
                                1
## [3,]
            1
                 0
                      0
                           0
                                0
                                     1
                                          0
                                               1
## [4,]
            0
                1
                      0
                                0
                                     0
                                          0
## [5,]
           0
                      0
                           0
                                     0
              1
                                1
                                          1
                                               1
## [6,]
           0
                1
                      0
                           0
                                0
                                     1
                                          0
                                               0
              0
## [7,]
           0
                                0
                                     0
                                          0
                      1
                           1
                                               1
## [8,]
            0 0
                           0
                              1
                                     0
                                               0
```

Q2a

[9,]

0 0

1 1

```
game_tree= function(m,k, currMoves = 0, maxMoves = 9)
  g = c()
  game_state = rho(m,S)
  if(game_state$terminal)
    g = c(g,game_state$winner)
   return(g)
  else if(currMoves == maxMoves)
    g = c(g, 2)
   return(g)
  else{
    Index = which(m == 0)
    for(i in 1:length(Index))
     x = m
     x[Index[i]]=k
      g = c(g, game\_tree(x, -1*k, currMoves + 1, maxMoves))
    return(g)
  }
}
m = as.matrix(c(0,0,0,0,0,0,0,0,0))
res5 = game_tree(m, 1, 0, 5)
n_g5 = length(res5)
Xwins5 = sum(res5 == -1)
Draws5 = sum(res5 == 0)
Owins5 = sum(res5 == +1)
Unfinished5 = sum(res5==+2)
\#Games5 = c(n_g5, Xwins5, Draws5, Owins5, Unfinished5)
games5 = data.frame("Number of moves" = 5, "Number of games" = n_g5, "X wins" = Xwins5, "O wins" = Owin
res8 = game_tree(m, 1, 0, 8)
n_g8 = length(res8)
Xwins8 = sum(res8 == -1)
Draws8 = sum(res8 == 0)
Owins8 = sum(res8 == +1)
Unfinished8 = sum(res8==+2)
\#Games8 = c(n_g8, Xwins8, Draws8, Owins8, Unfinished8)
games8 = data.frame("Number of moves" = 8, "Number of games" = n_g5, "X wins" = Xwins5, "O wins" = Owin
res9 = game_tree(m, 1, 0, 9)
n_g9 = length(res9)
Xwins9 = sum(res9 == -1)
Draws9 = sum(res9 == 0)
Owins9 = sum(res9 == +1)
Unfinished9 = sum(res9==+2)
```

```
CombinedFull = c(n_g9,Xwins9/n_g9,Draws9/n_g9,Owins9/n_g9, Unfinished9)
datQ2A = rbind(games5, games8)
kable(datQ2A)
```

Number.of.moves	Number.of.games	X.wins	O.wins	Draws
5	15120	0	1440	0
8	15120	0	1440	0

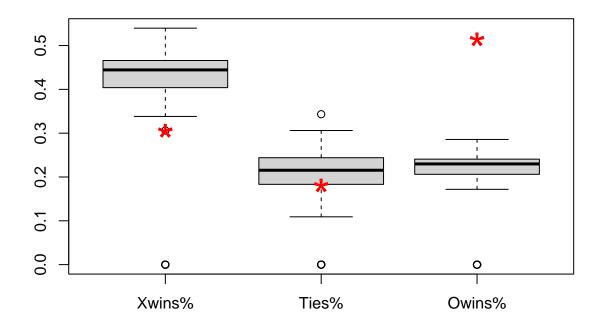
Q2b

```
mcts = function(m, k, alpha)
 g = c()
 game_state = rho(m,S)
 randAlpha = runif(1, 0, 1)
  if(game_state$terminal)
   g = c(g,game_state$winner)
   return(g)
  else
    if (randAlpha <= alpha)</pre>
      Index = which(m == 0)
     for(i in 1:length(Index))
       x[Index[i]]=k
       g = c(g,mcts(x,-1*k, alpha))
     return(g)
    }
    else
      g = c(g,2)
     return(g)
    }
  }
m = as.matrix(c(1,1,0,0,0,0,0,0,-1))
resMCTS = mcts(m,-1, 0.95)
n_gMCTS = length(resMCTS)
```

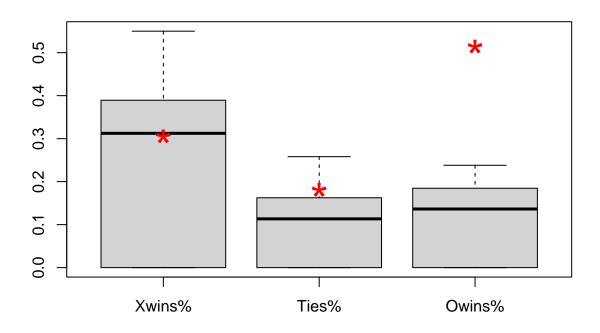
```
XwinsMCTS = sum(resMCTS==-1)
DrawsMCTS = sum(resMCTS== 0)
OwinsMCTS = sum(resMCTS==+1)
UnfinishedMCTS = sum(resMCTS==+2)
MCTS = c(n_gMCTS,XwinsMCTS,DrawsMCTS,OwinsMCTS, UnfinishedMCTS)
```

Q2c

```
m = as.matrix(c(1,1,-1,0,0,0,0,0,-1))
df90 = data.frame()
df70 = data.frame()
for(i in 1:100)
  resMCTS90 = mcts(m, 1, 0.9)
  resMCTS70 = mcts(m, 1, 0.7)
  n_gMCTS90 = length(resMCTS90)
  XwinsMCTS90 = sum(resMCTS90==-1)
  DrawsMCTS90 = sum(resMCTS90== 0)
  OwinsMCTS90 = sum(resMCTS90==+1)
  UnfinishedMCTS90 = sum(resMCTS==+2)
  Combined90 = c(n_gMCTS90, XwinsMCTS90/n_gMCTS90, DrawsMCTS90/n_gMCTS90, OwinsMCTS90/n_gMCTS90, Unfinished
  n_gMCTS70 = length(resMCTS70)
  XwinsMCTS70 = sum(resMCTS70==-1)
  DrawsMCTS70 = sum(resMCTS70== 0)
  OwinsMCTS70 = sum(resMCTS70==+1)
  UnfinishedMCTS70 = sum(resMCTS70==+2)
  Combined70 = c(n_gMCTS70, XwinsMCTS70/n_gMCTS70, DrawsMCTS70/n_gMCTS70, OwinsMCTS70/n_gMCTS70, Unfinished
 df90 = rbind(df90, Combined90)
  df70 = rbind(df70, Combined70)
colnames(df90) = c("Games", "Xwins%", "Ties%", "Owins%", "Incomplete")
colnames(df70) = c("Games", "Xwins%", "Ties%", "Owins%", "Incomplete")
boxplot(df90[, 2:4])
points(c(CombinedFull[2], CombinedFull[3], CombinedFull[4]), pch = "*", col = "red", cex = 3)
```

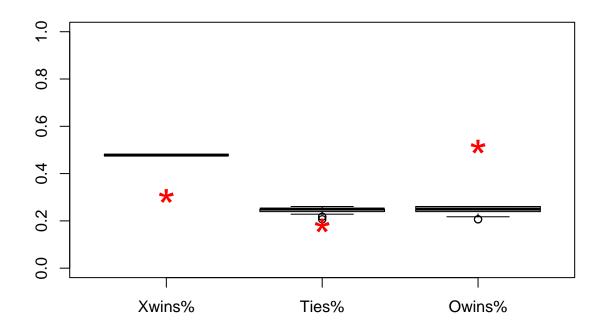


```
boxplot(df70[, 2:4])
points(c(CombinedFull[2], CombinedFull[3], CombinedFull[4]), pch = "*", col = "red", cex = 3)
```

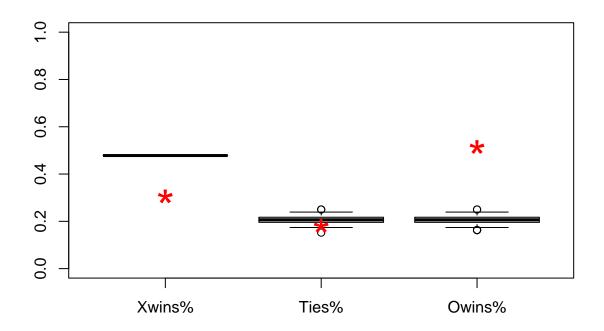


```
mcts_minBranch = function(m, k, alpha, currMoves, minBranch)
{
  g = c()
  game_state = rho(m,S)
 randAlpha = runif(1, 0, 1)
  if(game_state$terminal)
    g = c(g,game_state$winner)
    return(g)
  else
    if (currMoves <= minBranch)</pre>
      Index = which(m == 0)
      for(i in 1:length(Index))
        x = m
        x[Index[i]]=k
        g = c(g,mcts_minBranch(x,-1*k, alpha, currMoves + 1, minBranch))
      return(g)
```

```
else
    {
      if (randAlpha <= alpha)</pre>
       Index = which(m == 0)
        for(i in 1:length(Index))
          x = m
          x[Index[i]]=k
          g = c(g,mcts\_minBranch(x,-1*k, alpha, currMoves + 1, minBranch))
       return(g)
      }
      else
       g = c(g,2)
       return(g)
   }
 }
\# m = as.matrix(c(1,1,0,0,0,0,0,0,-1))
# resMCTS_Branch = mcts_minBranch(m,-1, 0.95, 3, 9)
\# n_qMCTS\_Branch = length(resMCTS\_Branch)
# XwinsMCTS_Branch = sum(resMCTS_Branch==-1)
# DrawsMCTS_Branch = sum(resMCTS_Branch== 0)
# OwinsMCTS_Branch = sum(resMCTS_Branch==+1)
# UnfinishedMCTS_Branch = sum(resMCTS_Branch==+2)
# c(n_qMCTS_Branch, XwinsMCTS_Branch, DrawsMCTS_Branch, OwinsMCTS_Branch, UnfinishedMCTS_Branch)
m = as.matrix(c(1,1,-1,0,0,0,0,0,-1))
df90_Branch_new = data.frame()
df70_Branch_new = data.frame()
for(i in 1:100)
  resMCTS90_new = mcts_minBranch(m,1, 0.9, 4, 7)
  resMCTS70_new = mcts_minBranch(m,1, 0.7, 4, 7)
  n_gMCTS90_new = length(resMCTS90_new)
  XwinsMCTS90_new = sum(resMCTS90_new==-1)
  DrawsMCTS90_new = sum(resMCTS90_new== 0)
  OwinsMCTS90_new = sum(resMCTS90_new==+1)
  UnfinishedMCTS90_new = sum(resMCTS90_new==+2)
  Combined90_new = c(n_gMCTS90_new, XwinsMCTS90_new/n_gMCTS90_new,
                     DrawsMCTS90_new/n_gMCTS90_new,OwinsMCTS90_new/n_gMCTS90_new, UnfinishedMCTS90_new)
  n_gMCTS70_new = length(resMCTS70_new)
  XwinsMCTS70_new = sum(resMCTS70_new==-1)
```



```
boxplot(df70_Branch_new[, 2:4], ylim = c(0, 1))
points(c(CombinedFull[2], CombinedFull[3], CombinedFull[4]), pch = "*", col = "red", cex = 3)
```



 $\mathbf{Q3}$