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N-Play Variability

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Overview and Synopsis

This routine analyzes variability of N-play video poker results based on simulation data made available by the Wizard of Odds http://wizardofodds.com/games/video-poker/appendix/2/ (http://wizardofodds.com/games/video-poker/appendix/2/). The game simulated was 9/6 Jacks or Better, and this routine looks at the impact of playing 5,000 hands with 1/3/5/10/50/100 lines per hand. The code broadly copies routines from Exercise002_v003.R, but with the intent of storing figures and summaries.

Data Processing

Coding Routine

The Wizard of Odds file was pre-processed in Excel and saved as a CSV once per each of the desired N-play outcomes. The file is read in, parsed to eliminate any unwanted values, and then assessed based on random draws from uniform(0,1). Results are stored for the final outcome and the minimum cumulative outcomes.

Below is the routine for creating the data. It has been converted to a function so it can be re-run multiple times.

First, a function is created to read and process files for mapping probabilities to outcomes.

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```
getBaseOutcomes <- function(myFileName="BaseOutcomes.csv", myDelete=NULL, force</pre>
EQ=FALSE) {
    if (file.exists(myFileName)) {
        baseOutcomes <- read.csv(myFileName,stringsAsFactors = FALSE)</pre>
        if (ncol(baseOutcomes) != 2) { stop("Error in CSV file, should have exa
ctly 2 columns") }
        colnames(baseOutcomes) <- c("probs", "outcomes")</pre>
    } else {
        baseOutcomes <- data.frame(probs=c(0.01,0.02,0.05,0.18,0.24,0.50),outco
mes=c(10,5,2,1,0,-1))
    baseOutcomes <- baseOutcomes[baseOutcomes$probs != 0,] ## Can have zeroes a
s inputs -- ignore those
    if ( forceEQ ) {
        pDelta <- sum(baseOutcomes$probs) - 1</pre>
        if (abs(pDelta) < 0.0000001 &
             abs(pDelta) / baseOutcomes[nrow(baseOutcomes),]$probs < 0.1</pre>
            )
            print(paste0("Modifying probablities ",paste0(baseOutcomes[nrow(bas
eOutcomes),],collapse=" ")))
            baseOutcomes[nrow(baseOutcomes),]$probs <- baseOutcomes[nrow(baseOu</pre>
tcomes), ] $probs - pDelta
            print(paste0("New probablities ",paste0(baseOutcomes[nrow(baseOutco
mes),],collapse=" ")))
    }
    if (sum(baseOutcomes$probs)!=1 | min(baseOutcomes$probs) < 0 |</pre>
        sum(is.na(baseOutcomes$probs)) > 0 | sum(is.na(baseOutcomes$outcomes))
> 0) {
        stop("Please resolve the issue with inputs for probs and outcomes, abor
ting")
    }
    ## Store the original value read in as outcomes
    baseOutcomes$oldOutcomes <- baseOutcomes$outcomes</pre>
    \#\# Null the baseOutcomes$outcomes where outcomes >= X
    if (!is.null(myDelete)) {
        myCond <- parse(text=paste0("baseOutcomes$outcomes", myDelete))</pre>
        baseOutcomes$outcomes[eval(myCond)] <- 0</pre>
        print(paste0("Converted all cases where ",myCond," to baseOutcomes$outc
omes = 0")
    }
```

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Second, a function is created to draw the random variables and calculate the outcomes database.

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```
calcOutcomes <- function(baseOutcomes=baseOutcomes,nPlay=1) {</pre>
    ## Allow nTrials, nPerTrial, and myHurdle to come from global environment
    print(paste0("Running ",nPlay,"-play with nTrials=",nTrials,
                  " nPerTrial=", nPerTrial, " and hurdle ", myHurdle
          )
    myCDF <- numeric(nrow(baseOutcomes)+1)</pre>
    myCDF[1] < - 0
    for ( intCtr in 1:nrow(baseOutcomes) ) {
        myCDF[intCtr+1] <- myCDF[intCtr] + baseOutcomes$probs[intCtr]</pre>
    }
    mtxCumOutcomes <- matrix(baseOutcomes$outcomes[findInterval(matrix(data=run</pre>
if(nTrials*nPerTrial,0,1),
                                                                           nrow=nPe
rTrial,
                                                                           ncol=nTr
ials
                                                                           ),
                                                                   myCDF, rightmos
t.closed=TRUE
                                                  ],
                          nrow=nPerTrial,
                          ncol=nTrials
    print(paste0("Ouctomes across ",nTrials*nPerTrial," draws of ",nPlay,"-pla
y have mean: ",
                  format (mean (mtxCumOutcomes), digits=3), " and variance: ",
                  format(sd(mtxCumOutcomes)^2, digits=3)
                  )
         )
    mtxCumOutcomes <- apply(mtxCumOutcomes,2,FUN=cumsum) ## About 2.5 seconds</pre>
for 12,000 x 5,000
    maxPerTrial <- apply(mtxCumOutcomes,2,FUN=max) ## About 1.0 seconds for 1</pre>
2,000 \times 5,000
    minPerTrial <- apply(mtxCumOutcomes,2,FUN=min) ## About 1.0 seconds for 1
2,000 x 5,000
    lastPerTrial <- as.numeric(mtxCumOutcomes[nrow(mtxCumOutcomes),])</pre>
    dfSummary <- data.frame(myTrial = 1:nTrials, myMax = maxPerTrial, myMin = m
inPerTrial,
                             myLast = lastPerTrial, myCond = FALSE, myN Cond = N
A, myVal Cond = NA
```

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```
dfSummary$myCond <- eval(parse(text=paste0("dfSummary$myMin",myHurdle)))

foo <- function(x) {
    which(eval(parse(text=paste0("x",myHurdle))))[1]
  }

dfSummary$myN_Cond <- apply(mtxCumOutcomes,2,FUN=foo) ## About 2.5 second
s for 12,000 x 5,000

for ( intCtr in 1:nTrials ) {
    dfSummary$myVal_Cond[intCtr] <- mtxCumOutcomes[dfSummary$myN_Cond[intCtr],dfSummary$myTrial[intCtr]]
  }

return(dfSummary)
}</pre>
```

Additionally, a function is created to graph the data and store the outputs.

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```
graphSummary <- function(graphData, nPlay=1) {</pre>
    graphData <- graphData[order(-graphData$myCond, graphData$myN Cond, -graphD</pre>
ata$myLast),]
    print(summary(graphData))
    \#\# Have the x and y units auto-calculated
    minX <- min(graphData$myMin)</pre>
                                                   ## Find most negative element
    maxX <- max(0, graphData$myLast)</pre>
                                                  ## Find most positive elemen
t (use 0 if all are negative)
    powX <- log10(max(1, abs(minX), abs(maxX))) ## Find rough "power" of data</pre>
   ## If thousands, use hundred
s; if hundreds, use tens; etc.
    minX <- unitX*(floor(minX/unitX)-1)</pre>
                                                  ## Round to similar units as
   maxX <- unitX*(ceiling(maxX/unitX)+1)</pre>
                                                  ## Round to similar units as
unitX
   hist(graphData$myMin,
         col=rgb(1,0,0,.25),
         main=paste0("Results: ",nTrials," Trials (",nPerTrial," ",
                     nPlay, "-play draws per trial)"
                     ),
         xlab="Units", ylab="N Trials",
         breaks=seq(minX, maxX, by=unitX),
         xlim=c(minX, maxX)
         )
    hist(graphData$myLast,col=rgb(0,0,1,.25),
         breaks=seq(minX, maxX, by=unitX),
         xlim=c(minX, maxX),
         add=TRUE
         )
    legend("topright", col=c(rgb(1,0,0,.25), rgb(0,0,1,.25), rgb(0.5,0,0.5,.5)),
           legend=c("Minimum", "Final", "Overlap"), pch=20, pt.cex=2
```

Prepare the global parameters

Finally, the key global parameters are set.

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```
nTrials <- 2000

nPerTrial <- 5000

myHurdle <- "<=-500"
```

Results

The simulation is repeated for each of the desired N-play outcomes. In this case, we have run the routine for 1/3/5/10/50/100 play.

Results for 1-play

```
## Run for 1-play
baseOutcomes <- getBaseOutcomes(myFileName="Play001Outcomes.csv", forceEQ=TRUE)</pre>
```

```
## [1] "Modifying probablities 0.54543467 -1"
## [1] "New probablities 0.54543466 -1"
## [1] "Probabilities sum to 1. Outcomes has mean -0.00456 and variance 19.5"
```

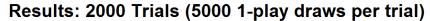
```
dfSummary <- calcOutcomes(baseOutcomes=baseOutcomes, nPlay=1)</pre>
```

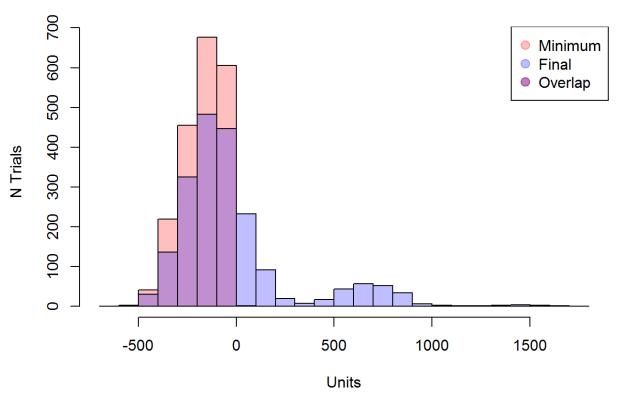
```
## [1] "Running 1-play with nTrials=2000 nPerTrial=5000 and hurdle <=-500"
## [1] "Ouctomes across 1e+07 draws of 1-play have mean: -0.0039 and variance:
19.1"</pre>
```

```
graphSummary(dfSummary, nPlay=1)
```

```
##
     myTrial
                    myMax
                                  myMin
                                                 myLast
## Min. : 1.0 Min. : -1.0 Min. :-554.0 Min. :-515.00
## 1st Qu.: 500.8 1st Qu.: 22.0 1st Qu.:-239.0 1st Qu.:-198.00
## Median: 1000.5 Median: 56.0 Median: -157.0 Median: -94.00
## Mean :1000.5 Mean : 150.4 Mean :-169.5 Mean : -19.49
  3rd Qu.:1500.2 3rd Qu.: 118.0 3rd Qu.: -85.0 3rd Qu.: 26.00
## Max. :2000.0 Max. :1743.0 Max. : 1.0 Max. :1617.00
##
    myCond
            myN Cond myVal Cond
## Mode:logical Min.: 4302 Min.: -500
## FALSE:1997 1st Qu.:4597 1st Qu.:-500
## TRUE :3
               Median: 4892 Median: -500
## NA's :0
               Mean :4710 Mean :-500
##
               3rd Qu.:4914 3rd Qu.:-500
                Max. :4937 Max. :-500
##
##
                NA's :1997 NA's :1997
```

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Results for 3-play

```
## Run for 3-play
baseOutcomes <- getBaseOutcomes(myFileName="Play003Outcomes.csv", forceEQ=TRUE)</pre>
```

```
## [1] "Modifying probablities 0.262602735 -3"
## [1] "New probablities 0.26260273 -3"
## [1] "Probabilities sum to 1. Outcomes has mean -0.0152 and variance 67.7"
```

dfSummary <- calcOutcomes(baseOutcomes=baseOutcomes, nPlay=3)</pre>

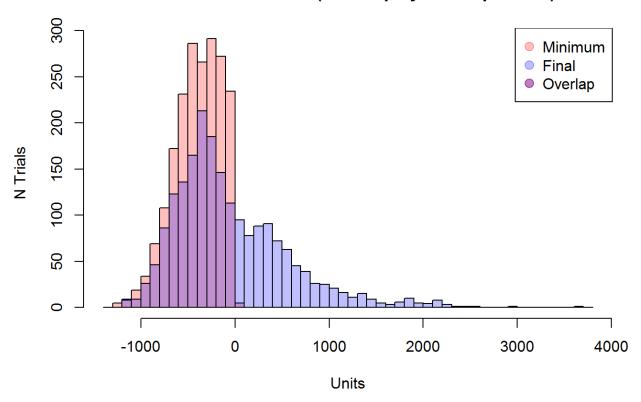
```
## [1] "Running 3-play with nTrials=2000 nPerTrial=5000 and hurdle <=-500"
## [1] "Ouctomes across 1e+07 draws of 3-play have mean: -0.00986 and varianc
e: 71"</pre>
```

```
graphSummary(dfSummary, nPlay=3)
```

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```
{\tt myMin}
##
       myTrial
                           {\tt myMax}
                                                                  myLast
##
           :
                1.0
                      Min.
                              : -3.0
                                         Min.
                                                 :-1296.0
                                                             Min.
                                                                     :-1199.00
    1st Qu.: 500.8
                       1st Qu.:
                                  43.0
                                         1st Qu.: -561.2
                                                             1st Qu.: -463.00
##
    Median :1000.5
                       Median : 134.0
                                         Median : -377.5
                                                             Median : -199.00
    Mean
            :1000.5
                      Mean
                              : 349.1
                                         Mean
                                                 : -395.4
                                                                        -49.31
                                                             Mean
    3rd Qu.:1500.2
                       3rd Qu.: 561.8
                                          3rd Qu.: -196.0
                                                             3rd Qu.:
                                                                        275.00
##
    Max.
            :2000.0
                              :3823.0
                                                       9.0
                                                                     : 3668.00
                      Max.
                                         Max.
                                                             Max.
##
##
      myCond
                         myN Cond
                                        myVal Cond
##
                             :1189
                                              :-502.0
    Mode :logical
                     Min.
                                      Min.
##
    FALSE:1354
                     1st Qu.:2639
                                      1st Qu.:-501.0
    TRUE :646
                     Median :3352
                                      Median :-501.0
    NA's :0
                     Mean
                             :3360
                                      Mean
                                              :-500.7
##
                     3rd Qu.:4158
                                      3rd Qu.:-500.0
##
                     Max.
                                              :-500.0
                             :4995
                                      Max.
##
                     NA's
                             :1354
                                      NA's
                                              :1354
```

Results: 2000 Trials (5000 3-play draws per trial)



Results for 5-play

```
## Run for 5-play
baseOutcomes <- getBaseOutcomes(myFileName="Play005Outcomes.csv", forceEQ=TRUE)</pre>
```

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```
## [1] "Modifying probablities 0.130120405 -5"
## [1] "New probablities 0.130120414 -5"
## [1] "Probabilities sum to 1. Outcomes has mean -0.0253 and variance 130"
```

```
dfSummary <- calcOutcomes(baseOutcomes=baseOutcomes, nPlay=5)
```

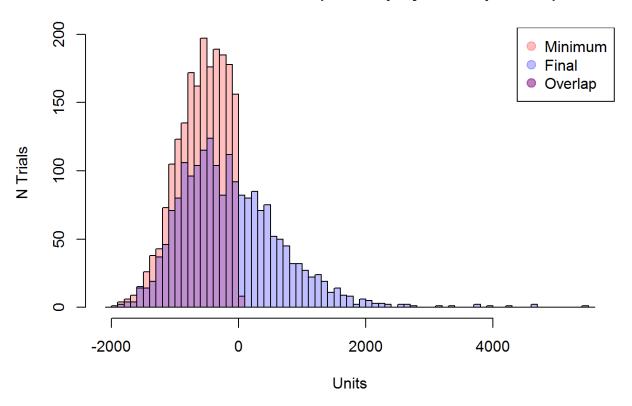
```
## [1] "Running 5-play with nTrials=2000 nPerTrial=5000 and hurdle <=-500"
## [1] "Ouctomes across 1e+07 draws of 5-play have mean: -0.0245 and variance:
130"</pre>
```

```
graphSummary(dfSummary, nPlay=5)
```

```
##
     myTrial
                    myMax
                                   myMin
                                                  myLast
## Min. : 1.0 Min. : -5.0 Min. :-1922.0 Min. :-1891.0
## 1st Qu.: 500.8 1st Qu.: 66.0
                               1st Qu.: -856.5 1st Qu.: -696.0
## Median: 1000.5 Median: 237.5 Median: -554.5 Median: -231.5
## Mean :1000.5 Mean : 477.4 Mean : -596.4 Mean : -122.6
## 3rd Qu.:1500.2 3rd Qu.: 733.0 3rd Qu.: -284.0 3rd Qu.: 330.2
## Max. :2000.0 Max. :5668.0 Max. : 21.0 Max. : 5461.0
##
                            myVal Cond
##
   myCond
              myN Cond
## Mode:logical Min.: 533 Min.: -504.0
## FALSE:892
                1st Qu.:1589 1st Qu.:-502.0
## TRUE :1108
               Median :2317 Median :-501.0
               Mean :2503 Mean :-501.3
## NA's :0
                3rd Qu.:3311 3rd Qu.:-500.0
##
##
                Max. :4988 Max. :-500.0
##
                NA's :892 NA's :892
```

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Results: 2000 Trials (5000 5-play draws per trial)



Results for 10-play

```
## Run for 10-play
baseOutcomes <- getBaseOutcomes(myFileName="Play010Outcomes.csv", forceEQ=TRUE)</pre>
```

```
## [1] "Modifying probablities 0.025913774 -10"
## [1] "New probablities 0.025913775 -10"
## [1] "Probabilities sum to 1. Outcomes has mean -0.0506 and variance 345"
```

dfSummary <- calcOutcomes(baseOutcomes=baseOutcomes, nPlay=10)</pre>

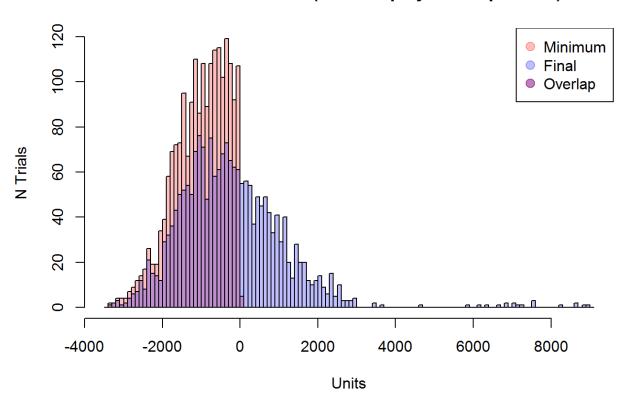
```
## [1] "Running 10-play with nTrials=2000 nPerTrial=5000 and hurdle <=-500"
## [1] "Ouctomes across 1e+07 draws of 10-play have mean: -0.0459 and varianc
e: 397"</pre>
```

```
graphSummary(dfSummary, nPlay=10)
```

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```
##
       myTrial
                                            myMin
                          myMax
                                                                myLast
##
           :
               1.0
                      Min.
                              : -10.0
                                        Min.
                                                :-3372.0
                                                           Min.
                                                                   :-3334.0
    1st Qu.: 500.8
                      1st Qu.: 139.0
                                        1st Qu.:-1479.0
                                                           1st Qu.:-1130.5
                      Median : 498.5
                                        Median : -935.5
##
    Median :1000.5
                                                           Median : -362.0
    Mean
           :1000.5
                      Mean
                              : 796.4
                                        Mean
                                                :-1020.4
                                                                   : -229.6
                                                           Mean
    3rd Qu.:1500.2
                      3rd Qu.:1138.8
                                        3rd Qu.: -475.0
                                                            3rd Qu.:
                                                                     521.2
##
           :2000.0
                              :9760.0
                                                    35.0
                                                                   : 8975.0
    Max.
                      Max.
                                        Max.
                                                           Max.
##
##
      myCond
                        myN Cond
                                       myVal Cond
##
                            : 204
                                            :-509.0
   Mode :logical
                     Min.
                                     Min.
##
    FALSE:533
                     1st Qu.: 731
                                     1st Qu.:-504.0
                     Median :1205
    TRUE :1467
                                     Median :-502.0
    NA's :0
                     Mean
                            :1579
                                     Mean
                                             :-502.5
##
                                     3rd Qu.:-501.0
                     3rd Qu.:2114
##
                     Max.
                            :4993
                                             :-500.0
                                     Max.
##
                     NA's
                            :533
                                     NA's
                                             :533
```

Results: 2000 Trials (5000 10-play draws per trial)



Results for 50-play

```
## Run for 50-play
baseOutcomes <- getBaseOutcomes(myFileName="Play050Outcomes.csv", forceEQ=TRUE)</pre>
```

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```
## [1] "Modifying probablities 2.1776e-05 -50"
## [1] "New probablities 2.1764999999978e-05 -50"
## [1] "Probabilities sum to 1. Outcomes has mean -0.253 and variance 5139"
```

```
dfSummary <- calcOutcomes(baseOutcomes=baseOutcomes, nPlay=50)
```

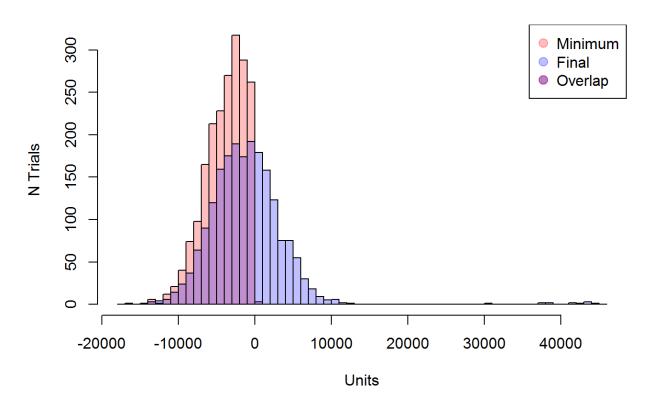
```
## [1] "Running 50-play with nTrials=2000 nPerTrial=5000 and hurdle <=-500"
## [1] "Ouctomes across 1e+07 draws of 50-play have mean: -0.218 and variance:
5249"</pre>
```

```
graphSummary(dfSummary, nPlay=50)
```

```
##
     myTrial
                    myMax
                                   myMin
                                                 myLast
## Min. : 1.0 Min. : -41.0 Min. :-16435 Min. :-14915
## 1st Qu.: 500.8 1st Qu.: 758.5 1st Qu.: -5570 1st Qu.: -4164
## Median: 1000.5 Median: 1946.5 Median: -3428 Median: -1312
## Mean :1000.5 Mean : 2744.9 Mean : -3889 Mean : -1092
## 3rd Qu.:1500.2 3rd Qu.: 3733.2 3rd Qu.: -1835 3rd Qu.: 1470
## Max. :2000.0 Max. :48369.0 Max. : 86 Max. :44346
##
              myN Cond myVal Cond
##
   myCond
## Mode:logical Min.: 24 Min.:-544.0
## FALSE:123
                1st Qu.: 81 1st Qu.:-518.0
## TRUE :1877
               Median : 170 Median :-510.0
               Mean : 457 Mean :-511.5
## NA's :0
##
                3rd Qu.: 442
                            3rd Qu.:-504.0
##
                Max. :4818 Max. :-500.0
##
                NA's :123 NA's :123
```

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Results: 2000 Trials (5000 50-play draws per trial)



Results for 100-play

```
## Run for 100-play
baseOutcomes <- getBaseOutcomes(myFileName="Play100Outcomes.csv", forceEQ=TRUE)</pre>
```

```
## [1] "Modifying probablities 6.3e-08 -99"
## [1] "New probablities 6.48000000379104e-08 -99"
## [1] "Probabilities sum to 1. Outcomes has mean -0.506 and variance 18791"
```

dfSummary <- calcOutcomes(baseOutcomes=baseOutcomes, nPlay=100)</pre>

```
## [1] "Running 100-play with nTrials=2000 nPerTrial=5000 and hurdle <=-500"
## [1] "Ouctomes across 1e+07 draws of 100-play have mean: -0.623 and varianc
e: 14590"</pre>
```

```
graphSummary(dfSummary, nPlay=100)
```

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```
##
       myTrial
                          myMax
                                            myMin
                                                              myLast
##
           :
                1.0
                      Min.
                              : -73
                                       Min.
                                               :-28505
                                                          Min.
                                                                  :-28461
    1st Qu.: 500.8
                      1st Qu.: 1352
                                        1st Qu.:-10916
                                                          1st Qu.: -8290
    Median :1000.5
                      Median: 3420
                                       Median : -6768
##
                                                          Median : -3188
           :1000.5
                                               : -7698
    Mean
                      Mean
                              : 4667
                                       Mean
                                                          Mean
                                                                  : -3114
                      3rd Qu.: 6585
                                        3rd Qu.: -3608
    3rd Qu.:1500.2
                                                          3rd Qu.:
                                                                    1512
           :2000.0
                              :93758
                                                    704
                                                                  : 93462
##
    Max.
                      Max.
                                        Max.
                                                          Max.
##
##
      myCond
                        myN Cond
                                       myVal Cond
##
    Mode :logical
                                     Min.
                                             :-573.0
                     Min.
                                 9
##
    FALSE:62
                     1st Qu.:
                                30
                                     1st Qu.:-535.0
    TRUE :1938
                                     Median :-521.0
                     Median :
                                60
##
    NA's :0
                     Mean
                             : 274
                                     Mean
                                             :-523.1
##
                     3rd Qu.: 184
                                      3rd Qu.:-509.0
##
                     Max.
                             :4932
                                     Max.
                                             :-500.0
##
                     NA's
                             :62
                                     NA's
                                             :62
```

Results: 2000 Trials (5000 100-play draws per trial)

