Group Randomized Trial Design For Targeted Agent – A Simulation Study

Zijiang Yang March 30, 2017

```
library(powerSurvEpi)
library(stats)
library(base)
library(survival)
library(PwrGSD)
library(ggplot2)
```

The simulation

```
simulation <- function(sims,countries,positive_only,assumption,test,T0,T1){</pre>
  # sims: How many simulations
  # countries: How many countries
  # positive only: Include only positive patients or not
  # TO: End of accrural (in year)
  # T1: End of study (in year)
  # test: Type of hypothesis testing
  # #"log rank": Perform a log rank test
  # #"t": Perform a one-tailed t test on the five-year survival rate
  # assumption: ssumption of efficacy of the drug
  # #"best": 45% for +, 40% for -
  # #"unif": unif(0.35-0.45) for +, unif(0.3-0.4) for -
  TO <- 365*TO
  T1 <- 365*T1
  Total N <- 0
  f \leftarrow c()
  significance <- c()</pre>
  p_list <- c()
  N <- 100
  for (round in 1:sims){
    if (round\%50 == 0){
      cat("Round ", round, "\n")
    big_dat <- data.frame()</pre>
    cur_id <- 1
    cur_time <- 0
    accrural_end <- 0
    i <- 1
    while(accrural_end==0){
      set.seed(round*1001+i)
      x <- rbinom(N,1,0.25) #Biomarker status
      g <- rbinom(N,1,0.5) #Group assignment
```

```
sp_list <- c()</pre>
s <- c()
c <- c()
delta <- c() #Censoring status</pre>
follow_up <- c() #Actual follow-up days since intake (considering censoring)
five_yr_live <- c() #Alive at five year of follow-up or not
accrued <- N
for (j in 1:N){
  #Simulate entry time in days
  gap <- rexp(1,(72*countries)/365) \#S_i-S_{i-1}, assuming 3 countries: 72*3 = 216
  cur_time <- cur_time+gap</pre>
  if (cur_time > T0){ #Stop Accrural
    accrued <- j-1
    accrural_end <- 1
    break
  }
  s <- c(s,cur_time)</pre>
  #Simulate survival probability of 5 years
  sp <- 0
  if (g[j] == 1){
    if (assumption=="unif"){
      #Uniform Scenario
      if (x[j] == 1) sp <- runif(1,0.35,0.45)
      else sp \leftarrow runif(1,0.3,0.4)
    else if (assumption=="best"){
      #Best case scenario
      if (x[j] == 1) sp <- 0.45
      else sp <- 0.4
    }
  }else{
    sp <- 0.3
  sp_list <- c(sp_list,sp)</pre>
  #Simulate censoring time since intake (in days)
  c_{day} \leftarrow rexp(1,0.05/365)
  c \leftarrow c(c,c_{day})
if (accrued == 0){}
  break
lambda <- -log(sp_list)/5</pre>
t <- c() #Survival time since intake (in days)
for (j in 1:accrued){
  st <- rexp(1,lambda[j])*365
  t <- c(t,st)
  delta <- c(delta,ifelse(c[j]<=t[j],1,0)) #right censored</pre>
  follow_up <- c(follow_up,min(t[j],c[j]))</pre>
  if (s[j]+follow_up[j]>T1){
    follow_up[j] <- T1-s[j]</pre>
    delta[j] <- 1 #right censored</pre>
  five_yr_live <- c(five_yr_live,ifelse(t[j]>=1825,1,0))
```

```
id <- seq(cur_id,cur_id+accrued-1)</pre>
      cur_id <- cur_id+accrued</pre>
      if (accrural_end){
        x <- x[1:accrued]
        g <- g[1:accrued]
      dat <- data.frame(id=id,x=x,g=g,s=s,t=t,c=c,delta=delta,follow_up=follow_up,five_yr_live=five_yr_
      big_dat <- rbind(big_dat,dat)</pre>
      i < -i + 1
    }
    if(positive_only){
      sub <- subset(big dat,x==1)</pre>
    }else{
      sub <- big_dat
    Total_N <- Total_N + length(sub$id)</pre>
    f <- c(f,sum(sub$follow_up)/length(sub$follow_up))</pre>
    if (test=="log rank"){
      s <- survdiff(Surv(follow_up,delta==0) ~ g,data=sub)</pre>
      p <- 1 - pchisq(s$chisq, 1)</pre>
      p_list <- c(p_list,p)</pre>
      #print(p)
      significance <- c(significance,ifelse(p<=0.05,1,0))</pre>
    else if (test == "t"){
      sub <- subset(sub,c>t) #delete dropouts
      trt <- subset(sub,g==1)</pre>
      ctr <- subset(sub,g==0)
      #print(length(ctr$five_yr_live))
      s <- t.test(ctr$five_yr_live,trt$five_yr_live,alternative = "less", var.equal = TRUE)
      p_list <- c(p_list,s$p.value)</pre>
      significance <- c(significance,ifelse(s$p.value<=0.05,1,0))</pre>
      print("Please enter correct test type!")
      quit()
  }
  cat("T0 = ", T0, "\n")
  cat("T1 = ", T1, "\n")
  cat("test = ", test, "\n")
  cat("assumption = ", assumption, "\n")
  cat("positive_only = ", positive_only, "\n")
  cat("countries = ", countries, "\n")
  cat("power = ",mean(significance), "\n")
  cat("Mean total sample size = ",Total_N/sims, "\n")
  cat("Mean follow_up time per subject= ",mean(f), "\n\n\n")
  sim <- data.frame(T0=T0,T1=T1,assumption=assumption,positive_only=positive_only,countries=countries,s
  return (sim)
# direct output to a file
```

$\#sink("/Users/river/Documents/699/Project_4/output.txt", append=TRUE, split=FALSE)$

```
sim_results <- data.frame()</pre>
for (countries in 3:4){
  for (positive_only in c(TRUE,FALSE)){
    for (assumption in c("best", "unif")){
      for (T0 in 3:5){
        for (T1 in 5:10){
           test <- "log rank"
           sims <- 0 #Set to 0 for output purpose only; should be 1000
           sim <- simulation(sims,countries,positive_only,assumption,test,T0,T1)</pre>
           sim_results<-rbind(sim_results,sim)</pre>
        }
      }
    }
  }
}
#sink()
sim_results$T0 <- sim_results$T0/365</pre>
sim_results$T1 <- sim_results$T1/365</pre>
```

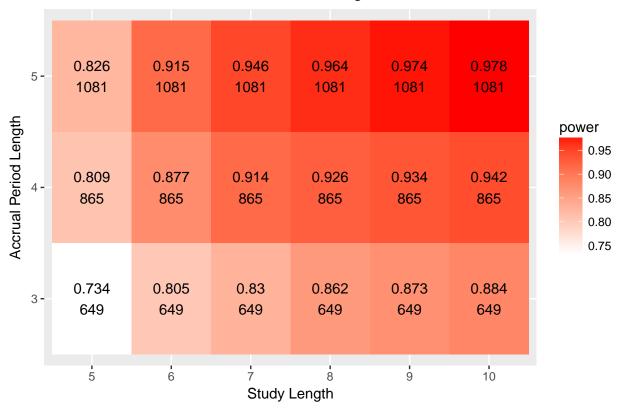
Simulation Results

```
#write.table(sim_results, file = "sim_results.csv", sep = ",", col.names = NA, qmethod = "double")
#For output purpose only, loading saved results from simulation
sim_results <- read.table("/Users/river/Documents/699/Project_4/sim_results.csv",sep=",",header = TRUE)
#Listing results that have power >= 0.7
subset(sim_results,power>=0.7)[,2:9]
```

```
##
       TO T1 assumption positive_only countries sample_size power follow_up
## 12
        4 10
                  best
                                 TRUE
                                              3
                                                    216.560 0.713 1262.2956
## 16
       5 8
                  best.
                                TRUE
                                              3
                                                    270.299 0.720 1070.3796
       5 9
## 17
                  best
                                TRUE
                                              3
                                                    270.299 0.753 1159.2970
       5 10
                                              3
## 18
                  best
                                TRUE
                                                    270.299 0.787 1229.1874
## 37
       3 5
                  best
                               FALSE
                                              3
                                                   648.561 0.734 826.5350
## 38
       3 6
                  best
                               FALSE
                                              3
                                                   648.561 0.805 960.5547
## 39
       3 7
                  best
                               FALSE
                                              3
                                                   648.561 0.830 1064.6032
## 40
       3 8
                  best
                               FALSE
                                              3
                                                   648.561 0.862 1145.2311
## 41
       3 9
                               FALSE
                                              3
                                                   648.561 0.873 1207.7733
                  best
## 42
       3 10
                  best
                               FALSE
                                              3
                                                   648.561 0.884 1256.2934
## 43
                               FALSE
                                              3
                                                   865.106 0.809 732.7468
       4 5
                  best
## 44
        4
          6
                  best
                               FALSE
                                              3
                                                   865.106 0.877 888.0599
        4 7
## 45
                               FALSE
                                              3
                                                   865.106 0.914 1008.5421
                  best
## 46
        4 8
                               FALSE
                                              3
                                                   865.106 0.926 1102.0410
                  best
       4 9
## 47
                  best.
                               FALSE
                                              3
                                                   865.106 0.934 1174.6468
## 48
       4 10
                               FALSE
                                              3
                                                   865.106 0.942 1230.9584
                  best
## 49
       5 5
                  best
                               FALSE
                                              3
                                                   1080.642 0.826 620.0889
                                              3 1080.642 0.915 800.9620
## 50
       5 6
                  best
                               FALSE
                               FALSE
       5 7
                                                  1080.642 0.946 941.0860
## 51
                  best
```

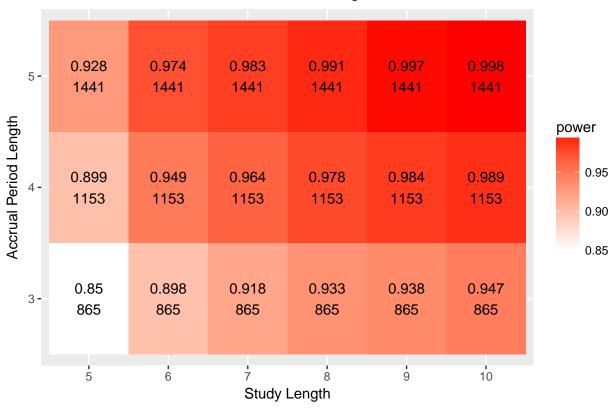
```
1080.642 0.964 1049.7834
## 52
        5 8
                   best
                                 FALSE
                                                3
## 53
        5 9
                   best
                                 FALSE
                                                3
                                                     1080.642 0.974 1134.1100
## 54
        5 10
                   best
                                 FALSE
                                                3
                                                     1080.642 0.978 1199.5141
                                                4
                                                      216.560 0.700 1238.0129
## 77
        3 9
                   best
                                  TRUE
## 78
        3 10
                   best
                                  TRUE
                                                4
                                                      216.560 0.713 1290.9061
## 81
        4 7
                   best
                                  TRUE
                                                4
                                                      288.530 0.745 1026.9596
## 82
        4 8
                   best
                                  TRUE
                                                      288.530 0.772 1125.3156
                                                4
## 83
        4 9
                                  TRUE
                                                      288.530 0.814 1202.5775
                   best
                                                4
## 84
        4 10
                   best
                                  TRUE
                                                4
                                                      288.530 0.822 1263.2088
## 86
        5 6
                                                4
                                                      360.406 0.729
                                                                     812.2796
                   best
                                  TRUE
## 87
        5 7
                   best
                                  TRUE
                                                      360.406 0.796
                                                                     957.3533
        5 8
                                                      360.406 0.842 1070.9712
## 88
                   best
                                  TRUE
                                                4
## 89
        5 9
                                                      360.406 0.866 1160.1464
                   best
                                  TRUE
                                                4
        5 10
## 90
                   best
                                  TRUE
                                                4
                                                      360.406 0.886 1230.1165
## 109
        3 5
                   best
                                 FALSE
                                                4
                                                      865.106 0.850
                                                                     826.7241
        3
## 110
           6
                   best
                                 FALSE
                                                4
                                                      865.106 0.898
                                                                     960.9169
## 111
        3
           7
                                 FALSE
                                                4
                                                      865.106 0.918 1065.0849
                   best
        3
## 112
                   best
                                 FALSE
                                                      865.106 0.933 1145.9542
## 113
        3
           9
                   best
                                 FALSE
                                                4
                                                      865.106 0.938 1208.7147
## 114
        3 10
                   best
                                 FALSE
                                                4
                                                      865.106 0.947 1257.4264
## 115
        4
           5
                   best
                                 FALSE
                                                4
                                                     1152.824 0.899
                                                                     732.9600
## 116
        4
           6
                   best
                                 FALSE
                                                4
                                                     1152.824 0.949
                                                                     888.3083
## 117
        4
           7
                                                     1152.824 0.964 1008.8364
                   best
                                 FALSE
                                                4
        4
## 118
           8
                   best
                                 FALSE
                                                4
                                                     1152.824 0.978 1102.3353
        4 9
## 119
                                                4
                                                     1152.824 0.984 1174.8590
                   best
                                 FALSE
## 120
        4 10
                   best
                                 FALSE
                                                4
                                                     1152.824 0.989 1231.0889
## 121
        5 5
                   best
                                 FALSE
                                                4
                                                     1441.158 0.928
                                                                     619.9900
## 122
        5
           6
                                 FALSE
                                                     1441.158 0.974
                                                                     800.9211
                   best
                                                4
        5
## 123
           7
                                                     1441.158 0.983
                   best
                                 FALSE
                                                4
                                                                     941.1725
## 124
        5
          8
                                                     1441.158 0.991 1049.8935
                   best
                                 FALSE
                                                4
## 125
        5 9
                   best
                                 FALSE
                                                4
                                                     1441.158 0.997 1134.2076
## 126
        5 10
                   best
                                 FALSE
                                                4
                                                     1441.158 0.998 1199.5456
## 138
        4 10
                                                4
                   unif
                                 FALSE
                                                     1150.819 0.706 1183.4834
## 142
        5 8
                                 FALSE
                                                4
                                                     1438.970 0.718 1017.7893
                   unif
## 143
        5
          9
                   unif
                                 FALSE
                                                4
                                                     1438.970 0.764 1095.4418
## 144
       5 10
                   unif
                                 FALSE
                                                4
                                                     1438.970 0.794 1154.7509
best_3_f <- subset(sim_results,assumption=="best" & countries==3 & positive_only==FALSE)
unif_4_f <- subset(sim_results,assumption=="unif" & countries==4 & positive_only==FALSE)
best_4_f <- subset(sim_results,assumption=="best" & countries==4 & positive_only==FALSE)
best_4_t <- subset(sim_results,assumption=="best" & countries==4 & positive_only==TRUE)
ggplot(best_3_f, aes(as.factor(T1), as.factor(T0))) +
    geom_tile(aes(fill = power)) +
    geom text(aes(label = paste(power,round(sample size), sep="\n"))) +
    scale_fill_gradient(low = "white", high = "red") +
    ggtitle("Best case scenario, 3 countries, including all") +
    labs(x="Study Length",y="Accrual Period Length")
```

Best case scenario, 3 countries, including all



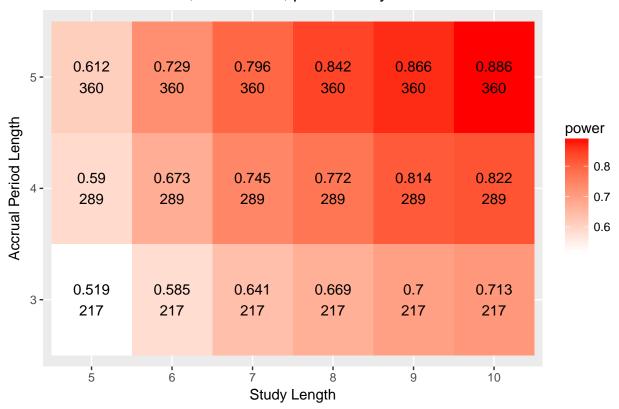
```
ggplot(best_4_f, aes(as.factor(T1), as.factor(T0))) +
  geom_tile(aes(fill = power)) +
  geom_text(aes(label = paste(power,round(sample_size), sep="\n"))) +
  scale_fill_gradient(low = "white", high = "red") +
  ggtitle("Best case scenario, 4 countries, including all") +
  labs(x="Study Length",y="Accrual Period Length")
```

Best case scenario, 4 countries, including all



```
ggplot(best_4_t, aes(as.factor(T1), as.factor(T0))) +
   geom_tile(aes(fill = power)) +
   geom_text(aes(label = paste(power,round(sample_size), sep="\n"))) +
   scale_fill_gradient(low = "white", high = "red") +
   ggtitle("Best case scenario, 4 countries, positive only") +
   labs(x="Study Length",y="Accrual Period Length")
```

Best case scenario, 4 countries, positive only



```
ggplot(unif_4_f, aes(as.factor(T1), as.factor(T0))) +
  geom_tile(aes(fill = power)) +
  geom_text(aes(label = paste(power,round(sample_size), sep="\n"))) +
  scale_fill_gradient(low = "white", high = "red") +
  ggtitle("Uniform scenario, 4 countries, including all") +
  labs(x="Study Length",y="Accrual Period Length")
```

Uniform scenario, 4 countries, including all

