

Sport Betting Presentation

author: Group 6 date: autosize: true

```
install.packages('dplyr')
```

```
## Installing package into '/usr/local/lib/R/site-library'  
## (as 'lib' is unspecified)
```

```
install.packages('dummies')
```

```
## Installing package into '/usr/local/lib/R/site-library'  
## (as 'lib' is unspecified)
```

```
install.packages('lpSolveAPI')
```

```
## Installing package into '/usr/local/lib/R/site-library'  
## (as 'lib' is unspecified)
```

a) Model relative strengths of the teams

```
library(dplyr)
```

```
##
```

```
## Attaching package: 'dplyr'
```

```
## The following objects are masked from 'package:stats':
```

```
##
```

```
##      filter, lag
```

```
## The following objects are masked from 'package:base':
```

```
##
```

```
##      intersect, setdiff, setequal, union
```

```
df <- read.csv('RegularSeasonData.csv', fileEncoding = 'latin1')
```

```
teams = sort(unique(df$home))
```

```
df_ot = df %>% filter(ot==1)
```

```
df<- df%>% mutate(h = ifelse(ot==1,pmin(h,v),h), v = ifelse(ot==1,pmin(h,v),v))
```

```
df1 = df %>% select(home, visitor, h) %>% rename(Attacker = home, Defender = visitor, Goals = h) %>% mu
```

```
df2 = df %>% select(home, visitor, v) %>% rename(Attacker = visitor, Defender = home, Goals = v) %>% mu
```

```
data = df1 %>% rbind(df2)
```

```
library(dummies)
```

```
## dummies-1.5.6 provided by Decision Patterns
```

```
data2 = dummy.data.frame(data,names = c("Attacker","Defender"), sep="_")
```

```
glm_model = glm(data=data2, formula = Goals ~ -1+., family = poisson())
```

```
glm_model
```

```
##
```

```
## Call: glm(formula = Goals ~ -1 + ., family = poisson(), data = data2)
```

```
##
```

```
## Coefficients:
```

```
##      Attacker_Ässät      Attacker_HIFK      Attacker_HPK
```

```
##          0.80812          0.77720          0.68236
## Attacker_Ilves Attacker_Jukurit Attacker_JYP
##          0.80918          0.60504          0.95279
## Attacker_KalPa Attacker_Kärpät Attacker_KooKoo
##          0.65263          0.97122          0.67446
## Attacker_Lukko Attacker_Pelicans Attacker_SaiPa
##          0.62337          0.80403          0.68889
## Attacker_Sport Attacker_Tappara Attacker_TPS
##          0.74640          0.73109          0.93071
## Defender_Ässät Defender_HIFK Defender_HPK
##          0.19937          -0.17447          0.06781
## Defender_Ilves Defender_Jukurit Defender_JYP
##          0.25927          0.11891          0.02168
## Defender_KalPa Defender_Kärpät Defender_KooKoo
##          -0.09860          -0.09561          0.28237
## Defender_Lukko Defender_Pelicans Defender_SaiPa
##          -0.05286          0.17050          0.09067
## Defender_Sport Defender_Tappara Defender_TPS
##          0.33720          -0.14036          NA
##          Home
##          0.16295
##
## Degrees of Freedom: 900 Total (i.e. Null); 870 Residual
## Null Deviance: 2521
## Residual Deviance: 926 AIC: 3291
```

Since the Defender_TPS coefficient is currently NA, we re-regress the model without this parameter. The result is as followed:

```
glm_fixed = glm(data=data2, formula = Goals ~ -1+.-Defender_TPS, family=poisson())
glm_fixed$coefficients
```

```
## Attacker_Ässät Attacker_HIFK Attacker_HPK Attacker_Ilves
##          0.80811993          0.77719578          0.68235582          0.80917525
## Attacker_Jukurit Attacker_JYP Attacker_KalPa Attacker_Kärpät
##          0.60504042          0.95279308          0.65262828          0.97121635
## Attacker_KooKoo Attacker_Lukko Attacker_Pelicans Attacker_SaiPa
##          0.67446285          0.62337371          0.80402755          0.68888973
## Attacker_Sport Attacker_Tappara Attacker_TPS Defender_Ässät
##          0.74639756          0.73109391          0.93070865          0.19936543
## Defender_HIFK Defender_HPK Defender_Ilves Defender_Jukurit
##          -0.17447225          0.06781017          0.25927475          0.11890728
## Defender_JYP Defender_KalPa Defender_Kärpät Defender_KooKoo
##          0.02167827          -0.09859855          -0.09560925          0.28236836
## Defender_Lukko Defender_Pelicans Defender_SaiPa Defender_Sport
##          -0.05286361          0.17050400          0.09066661          0.33719941
## Defender_Tappara Home
##          -0.14036259          0.16294700
```

```
string = ""
for (i in (1:15)){
  string = cat(string,as.character(teams[i]),'&')
  string = cat(string,glm_fixed$coefficients[i], '&',glm_fixed$coefficients[i+15], '& \\')
}
```

```
## Ässät & 0.8081199 & 0.1993654 & \ HIFK & 0.7771958 & -0.1744723 & \ HPK & 0.6823558 & 0.06781017 & \
```

After getting the coefficients vector, we add back $\text{TPS_Defender} = 0$ to this vector.

```
coefs = glm_fixed$coefficients
coefs = c(coefs[1:29],0,coefs[30])
coefs = matrix(coefs)
```

b) Predict number of goals scored by teams

Test case:

```
home_team = "HIFK"
away_team = "SaiPa"
```

Function to predict goals scored by each team:

```
predict_goals = function(home_team, away_team){
  home_id = which(teams==home_team)
  away_id = which(teams==away_team)
  new_match = matrix(rep(0,62),ncol=31)
  new_match[1,home_id] = 1
  new_match[1,away_id+15] = 1
  new_match[1,31] = 1
  new_match[2,away_id] = 1
  new_match[2,home_id+15] = 1
  predicted_goals = exp(new_match*coefs)
  return(predicted_goals)
}
```

```
predicted_goals = predict_goals(home_team,away_team)
sprintf("Predict number of goals scored by Home team: %f", predicted_goals[1])
```

```
## [1] "Predict number of goals scored by Home team: 2.803334"
```

```
sprintf("Predict number of goals scored by Visiting team: %f", predicted_goals[2])
```

```
## [1] "Predict number of goals scored by Visiting team: 1.672664"
```

c) Estimate winning probabilities of individual games

```
home_team = "HIFK"
away_team = "Ilves"
```

Use Monte Carlo simulation to attain 1000000 simulations of goals scored by each team, then compare them element-wise. The playoff variable in the function tells if the result accepts draw (playoff=True - no draws)

```
match_result = function(home_team, away_team, n_simu = 1000000, playoff=T){
  p_goals = predict_goals(home_team,away_team)
  hgoals = rpois(n_simu, p_goals[1])
  vgoals = rpois(n_simu, p_goals[2])
  hwin = sum(hgoals>vgoals)/n_simu
  vwin = sum(hgoals<vgoals)/n_simu
  if (playoff){
    wplayoff = hwin+vwin
    hwin = hwin/wplayoff
  }
}
```

```

    vwin = vwin/wplayoff
    return(c(hwin,vwin,0))
}
draw = sum(hgoals==vgoals)/n_simu
return(c(hwin,vwin,draw))
}

p_result = match_result(home_team, away_team, playoff = F)
sprintf("Home team has %d%% chance to win", round(p_result[1]*100))

## [1] "Home team has 66% chance to win"
sprintf("Away team has %d%% chance to win", round(p_result[2]*100))

## [1] "Away team has 19% chance to win"
sprintf("Chance that the match draws is %d%%", round(p_result[3]*100))

## [1] "Chance that the match draws is 15%"

```

d) Likelihood of different outcomes for the entire playoff bracket

Generate winner for one set of playoff matches (best of 7). The teams take turns to be the host, and the result of the games are simulated accordingly. If one game is drew, then it is simulated again until there is a winner.

```

best_of_seven = function(high_team,low_team){
  pgoals = cbind(predict_goals(high_team,low_team),rev(predict_goals(low_team, high_team)))
  high_wins = 0
  low_wins = 0
  i = 1
  while (high_wins<4 & low_wins<4) {
    g1 = 0
    g2 = 0
    while (g1 == g2){
      g1 = rpois(1,pgoals[1,i])
      g2 = rpois(1,pgoals[2,i])
    }
    if (g1>g2){
      high_wins = high_wins + 1
    } else {
      low_wins = low_wins + 1
    }
    i = i + 1
    if (i == 3) {i=1}
  }
  if (high_wins >=4) {
    return(high_team)
  } else {
    return(low_team)
  }
}

print(best_of_seven(home_team,away_team))

```

```
## [1] "HIFK"
```

Function the_champion generate from a list of 8 teams a champion:

```
the_champion = function(teams){  
  q1_winner = best_of_seven(teams[1],teams[2])  
  q2_winner = best_of_seven(teams[3],teams[4])  
  q3_winner = best_of_seven(teams[5],teams[6])  
  q4_winner = best_of_seven(teams[7],teams[8])  
  s1_winner = best_of_seven(q1_winner,q4_winner)  
  s2_winner = best_of_seven(q2_winner,q3_winner)  
  champion = best_of_seven(s1_winner,s2_winner)  
  return(champion)  
}
```

Simulating 1000000 times to attain chances of each team to be the winner:

```
final_teams = teams[c(8,1,15,12,14,7,6,2)]  
scores = rep(0,8)  
n_simu = 1000000  
for (i in (1:n_simu)){  
  new_champion = the_champion(final_teams)  
  champ_index = which(final_teams==new_champion)  
  temp = scores[champ_index] + 1  
  scores[champ_index] = temp  
}  
chances = scores/n_simu  
  
for (i in (1:8)){  
  print(paste("Team ",final_teams[i]," has ",chances[i]*100,"% chance of winning the title."))  
}
```

```
## [1] "Team Kärpät has 44.641 % chance of winning the title."  
## [1] "Team Ässät has 0.3296 % chance of winning the title."  
## [1] "Team TPS has 20.354 % chance of winning the title."  
## [1] "Team SaiPa has 0.4776 % chance of winning the title."  
## [1] "Team Tappara has 9.6297 % chance of winning the title."  
## [1] "Team KalPa has 2.6903 % chance of winning the title."  
## [1] "Team JYP has 10.4182 % chance of winning the title."  
## [1] "Team HIFK has 11.4596 % chance of winning the title."
```

```
string = ""  
for (i in (1:8)){  
  string = cat(string, as.character(final_teams[i]), '&', chances[i]*100, '//')  
}
```

```
## Kärpät & 44.641 // Ässät & 0.3296 // TPS & 20.354 // SaiPa & 0.4776 // Tappara & 9.6297 // KalPa & 2.6903 // JYP & 10.4182 // HIFK & 11.4596
```

```
x = data.frame(teams = final_teams,chances = chances)  
write.csv(x,'chances.csv')
```

e)Solve the allocation of a 1000 euros budget

Using the chances calculated above and the betting odds, getting optimal allocation of budget using lpSolveAPI

```

betting_odds = read.csv('BettingOdds.csv')
bet_odds = c()
for (team in final_teams){
  odd = betting_odds[which(betting_odds$Team==team),2]
  bet_odds = c(bet_odds,odd)
}
budget = 1000
max_porp = 0.5
nteam = length(final_teams)
A = matrix(0,nrow=nteam,ncol=nteam)
for (i in (1:nteam)){
  A[i,i] = 1
}
A = rbind(rep(1,nteam),A)
b = c(budget,rep(max_porp*budget,nteam))
f = chances*bet_odds

## Warning in chances * bet_odds: longer object length is not a multiple of
## shorter object length

library(lpSolveAPI)
lp = make.lp(nrow(A),ncol(A))
for (c in (1:ncol(A))){
  set.column(lp, c, A[,c])
}
set.constr.type(lp,rep("<=",nteam+1))
set.rhs(lp,b)
set.objfn(lp,f)
lp.control(lp,sense='max')

## $anti.degen
## [1] "fixedvars" "stalling"
##
## $basis.crash
## [1] "none"
##
## $bb.depthlimit
## [1] -50
##
## $bb.floorfirst
## [1] "automatic"
##
## $bb.rule
## [1] "pseudononint" "greedy"          "dynamic"          "rcostfixing"
##
## $break.at.first
## [1] FALSE
##
## $break.at.value
## [1] 1e+30
##
## $epsilon
##      epsb      epsd      epsel      epsint  epsperturb  epspivot
##      1e-10      1e-09      1e-12      1e-07      1e-05      2e-07

```

```

##
## $improve
## [1] "dualfeas" "thetagap"
##
## $infinite
## [1] 1e+30
##
## $maxpivot
## [1] 250
##
## $mip.gap
## absolute relative
##      1e-11      1e-11
##
## $negrange
## [1] -1e+06
##
## $obj.in.basis
## [1] TRUE
##
## $pivoting
## [1] "devex"      "adaptive"
##
## $presolve
## [1] "none"
##
## $scalelimit
## [1] 5
##
## $scaling
## [1] "geometric"    "equilibrate" "integers"
##
## $sense
## [1] "maximize"
##
## $simplextype
## [1] "dual"      "primal"
##
## $timeout
## [1] 0
##
## $verbose
## [1] "neutral"
solve(lp)

## [1] 0
OptimalSolution <- get.variables(lp)
maxValue = get.objective(lp)

cat("The maximum expected value of the bet is ",maxValue,"\n")

## The maximum expected value of the bet is  4562.311

```

```
for (i in (1:nteam)){
  print(paste("Bet", OptimalSolution[i], "euros on team", final_teams[i]))
}
```

```
## [1] "Bet 500 euros on team Kärpät"
## [1] "Bet 0 euros on team Ässät"
## [1] "Bet 0 euros on team TPS"
## [1] "Bet 0 euros on team SaiPa"
## [1] "Bet 0 euros on team Tappara"
## [1] "Bet 0 euros on team KalPa"
## [1] "Bet 0 euros on team JYP"
## [1] "Bet 500 euros on team HIFK"
```

f) Another allocation

We feel that 50% is still a way too big number, so we limit the maximum proportion on each team to 25%.

```
max_porp = 0.25
A = matrix(0, nrow=nteam, ncol=nteam)
for (i in (1:nteam)){
  A[i,i] = 1
}
A = rbind(rep(1, nteam), A)
b = c(budget, rep(max_porp*budget, nteam))
f = chances*bet_odds
```

```
## Warning in chances * bet_odds: longer object length is not a multiple of
## shorter object length
```

```
library(lpSolveAPI)
lp = make.lp(nrow(A), ncol(A))
for (c in (1:ncol(A))){
  set.column(lp, c, A[,c])
}
set.constr.type(lp, rep("<=", nteam+1))
set.rhs(lp, b)
set.objfn(lp, f)
lp.control(lp, sense='max')
```

```
## $anti.degen
## [1] "fixedvars" "stalling"
##
## $basis.crash
## [1] "none"
##
## $bb.depthlimit
## [1] -50
##
## $bb.floorfirst
## [1] "automatic"
##
## $bb.rule
## [1] "pseudononint" "greedy" "dynamic" "rcostfixing"
##
```



```

## $break.at.first
## [1] FALSE
##
## $break.at.value
## [1] 1e+30
##
## $epsilon
##      epsb      epsd      epsel      epsint  epsperturb  epspivot
##      1e-10      1e-09      1e-12      1e-07      1e-05      2e-07
##
## $improve
## [1] "dualfeas" "thetagap"
##
## $infinite
## [1] 1e+30
##
## $maxpivot
## [1] 250
##
## $mip.gap
## absolute relative
##      1e-11      1e-11
##
## $negrange
## [1] -1e+06
##
## $obj.in.basis
## [1] TRUE
##
## $pivoting
## [1] "devex"      "adaptive"
##
## $presolve
## [1] "none"
##
## $scalelimit
## [1] 5
##
## $scaling
## [1] "geometric"  "equilibrate" "integers"
##
## $sense
## [1] "maximize"
##
## $simplextype
## [1] "dual"      "primal"
##
## $timeout
## [1] 0
##
## $verbose
## [1] "neutral"

```

```

solve(lp)

## [1] 0
OptimalSolution <- get.variables(lp)
maxValue = get.objective(lp)

cat("The maximum expected value of the bet is ",maxValue,"\n")

## The maximum expected value of the bet is 2682.378
for (i in (1:nteam)){
  print(paste("Bet", OptimalSolution[i],"euros on team",final_teams[i]))
}

## [1] "Bet 250 euros on team Kärpät"
## [1] "Bet 0 euros on team Ässät"
## [1] "Bet 250 euros on team TPS"
## [1] "Bet 0 euros on team SaiPa"
## [1] "Bet 250 euros on team Tappara"
## [1] "Bet 0 euros on team KalPa"
## [1] "Bet 0 euros on team JYP"
## [1] "Bet 250 euros on team HIFK"

```

g)

```

library(dplyr)
df.new <- read.csv('RegularSeasonData.csv', fileEncoding = 'latin1')
teams = sort(unique(df.new$home))

df.new <- df.new %>% mutate(h = ifelse(ot==1,pmin(h,v),h), v = ifelse(ot==1,pmin(h,v),v))

df.new1 = df.new %>% select(home, visitor, h) %>% rename(Attacker = home, Defender = visitor, Goals = h)
df.new2 = df.new %>% select(home, visitor, v) %>% rename(Attacker = visitor, Defender = home, Goals = v)
data.new = df.new1 %>% rbind(df.new2)
library(dummies)
data.new = dummy.data.frame(data.new,names = c("Attacker","Defender","Home"), sep="_")
data.new = data.new[-47]
new_glm_model = glm(data=data.new, formula = Goals ~ -1+.-Defender_TPS, family = poisson())
new_glm_model

##
## Call: glm(formula = Goals ~ -1 + . - Defender_TPS, family = poisson(),
## data = data.new)
##
## Coefficients:
## Attacker_Ässät Attacker_HIFK Attacker_HPK
## 0.79888 0.57215 0.87684
## Attacker_Ilves Attacker_Jukurit Attacker_JYP
## 0.79355 0.60848 1.00988
## Attacker_KalPa Attacker_Kärpät Attacker_KooKoo
## 0.46183 0.90007 0.73711
## Attacker_Lukko Attacker_Pelicans Attacker_SaiPa
## 0.58850 0.76786 0.80146

```

```
## Attacker_Sport Attacker_Tappara Attacker_TPS
## 0.77483 0.71126 0.99302
## Defender_Ässät Defender_HIFK Defender_HPK
## 0.19937 -0.17447 0.06781
## Defender_Ilves Defender_Jukurit Defender_JYP
## 0.25927 0.11891 0.02168
## Defender_KalPa Defender_Kärpät Defender_KooKoo
## -0.09860 -0.09561 0.28237
## Defender_Lukko Defender_Pelicans Defender_SaiPa
## -0.05286 0.17050 0.09067
## Defender_Sport Defender_Tappara Home_Ässät
## 0.33720 -0.14036 0.17997
## Home_HIFK Home_HPK Home_Ilves
## 0.51427 -0.23293 0.19167
## Home_Jukurit Home_JYP Home_KalPa
## 0.15657 0.05466 0.49141
## Home_Kärpät Home_KooKoo Home_Lukko
## 0.29080 0.04380 0.22653
## Home_Pelicans Home_SaiPa Home_Sport
## 0.22884 -0.05635 0.10970
## Home_Tappara Home_TPS
## 0.19933 0.04445
##
```

```
## Degrees of Freedom: 900 Total (i.e. Null); 856 Residual
## Null Deviance: 2521
## Residual Deviance: 907.9 AIC: 3300
```

```
coefs2 = new_glm_model$coefficients
coefs2 = c(coefs2[1:29],0,coefs2[30:44])
coefs2 = matrix(coefs2)
```

```
predict_goals = function(home_team, away_team){
  home_id = which(teams==home_team)
  away_id = which(teams==away_team)
  new_match = matrix(rep(0,90),ncol=45)
  new_match[1,home_id] = 1
  new_match[1,away_id+15] = 1
  new_match[1,home_id+30] = 1
  new_match[2,away_id] = 1
  new_match[2,home_id+15] = 1
  predicted_goals = exp(new_match*coefs2)
  return(predicted_goals)
}
```

```
final_teams = teams[c(8,1,15,12,14,7,6,2)]
scores = rep(0,8)
n_simu = 1000000
for (i in (1:n_simu)){
  new_champion = the_champion(final_teams)
  champ_index = which(final_teams==new_champion)
  temp = scores[champ_index] + 1
  scores[champ_index] = temp
}
chances = scores/n_simu
for (i in (1:8)){
```

```

print(paste("Team ",final_teams[i]," has ",chances[i]*100,"% chance of winning the title."))
}

## [1] "Team Kärpät has 45.8598 % chance of winning the title."
## [1] "Team Ässät has 0.3493 % chance of winning the title."
## [1] "Team TPS has 20.3848 % chance of winning the title."
## [1] "Team SaiPa has 0.5478 % chance of winning the title."
## [1] "Team Tappara has 10.1996 % chance of winning the title."
## [1] "Team KalPa has 1.983 % chance of winning the title."
## [1] "Team JYP has 11.271 % chance of winning the title."
## [1] "Team HIFK has 9.4047 % chance of winning the title."

string = ""
for (i in (1:8)){
  string = cat(string, as.character(final_teams[i]), '&', chances[i]*100, '//')
}

## Kärpät & 45.8598 // Ässät & 0.3493 // TPS & 20.3848 // SaiPa & 0.5478 // Tappara & 10.1996 // KalPa

x = data.frame(teams = final_teams,chances = chances)
write.csv(x = x,file = 'chances2.csv')

max_porp = 0.5
A = matrix(0,nrow=nteam,ncol=nteam)
for (i in (1:nteam)){
  A[i,i] = 1
}
A = rbind(rep(1,nteam),A)
b = c(budget,rep(max_porp*budget,nteam))
f = chances*bet_odds

## Warning in chances * bet_odds: longer object length is not a multiple of
## shorter object length

library(lpSolveAPI)
lp = make.lp(nrow(A),ncol(A))
for (c in (1:ncol(A))){
  set.column(lp, c, A[,c])
}
set.constr.type(lp,rep("<=",nteam+1))
set.rhs(lp,b)
set.objfn(lp,f)
lp.control(lp,sense='max')

## $anti.degen
## [1] "fixedvars" "stalling"
##
## $basis.crash
## [1] "none"
##
## $bb.depthlimit
## [1] -50
##
## $bb.floorfirst
## [1] "automatic"
##
## $bb.rule

```

```

## [1] "pseudononint" "greedy"          "dynamic"          "rcostfixing"
##
## $break.at.first
## [1] FALSE
##
## $break.at.value
## [1] 1e+30
##
## $epsilon
##      epsb      epsd      epsel      epsint  epsperturb  epspivot
##      1e-10      1e-09      1e-12      1e-07      1e-05      2e-07
##
## $improve
## [1] "dualfeas" "thetagap"
##
## $infinite
## [1] 1e+30
##
## $maxpivot
## [1] 250
##
## $mip.gap
## absolute relative
##      1e-11      1e-11
##
## $negrange
## [1] -1e+06
##
## $obj.in.basis
## [1] TRUE
##
## $pivoting
## [1] "devex"      "adaptive"
##
## $presolve
## [1] "none"
##
## $scalelimit
## [1] 5
##
## $scaling
## [1] "geometric"  "equilibrate" "integers"
##
## $sense
## [1] "maximize"
##
## $simplextype
## [1] "dual"      "primal"
##
## $timeout
## [1] 0
##
## $verbose
## [1] "neutral"

```

```

solve(lp)

## [1] 0
OptimalSolution <- get.variables(lp)
maxValue = get.objective(lp)

cat("The maximum expected value of the bet is ",maxValue,"\n")

## The maximum expected value of the bet is 4029.223
for (i in (1:nteam)){
  print(paste("Bet", OptimalSolution[i],"euros on team",final_teams[i]))
}

## [1] "Bet 500 euros on team Kärpät"
## [1] "Bet 0 euros on team Ässät"
## [1] "Bet 0 euros on team TPS"
## [1] "Bet 0 euros on team SaiPa"
## [1] "Bet 0 euros on team Tappara"
## [1] "Bet 0 euros on team KalPa"
## [1] "Bet 0 euros on team JYP"
## [1] "Bet 500 euros on team HIFK"

```