

Memory-based Algorithm

Dataset

```
# Ms
movie_train <- read.csv("../data/eachmovie_sample/data_train.csv")
movie_test <- read.csv("../data/eachmovie_sample/data_test.csv")
# Movie
MS_train <- read.csv("../data/MS_sample/data_train.csv")
MS_test <- read.csv("../data/MS_sample/data_test.csv")
```

Preprocess

```
source("../lib/data_preprocess.R")
movie_train <- Transformer(movie_train)
movie_test <- Transformer(movie_test)
# save(movie_train, file = "../output/clean_movie_train.RData")
# save(movie_test, file = "../output/clean_movie_test.RData")

MS_train <- Transformer2(MS_train)
MS_test <- Transformer2(MS_test)
# save(MS_train, file = "../output/clean_MS_train.RData")
# save(MS_test, file = "../output/clean_MS_test.RData")
```

Implementation

Similarity Weight

Pearson Correlation(not required)

```
# # Ms
# pearson_weight_ms <- cor(t(ms_train_mat), method = "pearson")
# save(pearson_weight_ms, file="../output/pearson_weight_ms.RData")

# # Movie
# pearson_weight_movie <- cor(t(movie_train_mat), method = "pearson", use = "pairwise.complete.obs")
# save(pearson_weight_movie, file="../output/pearson_weight_movie.RData")
```

Spearman Correlation(1,2)

```
# # Ms
# spearman_weight_ms <- cor(t(ms_train_mat), method = "spearman")
# save(spearman_weight_ms, file="../output/spearman_weight_ms.RData")

# # Movie
```

```
# spearman_weight_movie <- cor(t(movie_train_mat), method = "spearman", use = "pairwise.complete.obs")
# save(spearman_weight_movie, file="../output/spearman_weight_movie.RData")
```

Mean-square-difference(1,2)

```
# msd_weight <- function(mat){
#   n <- dim(mat)[1]
#   dissim <- matrix(NA, n, n)
#   user <- rownames(mat)
#   colnames(dissim) <- user
#   rownames(dissim) <- user
#   for (i in 1:n){
#     for (j in 1:n){
#       ui <- mat[i,]
#       uj <- mat[j,]
#       dissim[i,j] <- mean((ui - uj)^2, na.rm = T)
#     }
#   }
#   L <- max(dissim, na.rm = T)
#   w <- (L - dissim)/L
#   return(w)
# }
#
# msd_weight2 <- function(df){
#   n_user <- dim(df)[1]
#   n_item <- dim(df)[2]
#   c <- df
#   c[which(c>0)] = 1
#   s <- df
#   dissim <- matrix(NA, n_user, n_user)
#   user <- rownames(df)
#   colnames(dissim) <- user
#   rownames(dissim) <- user
#   for (i in 1:n_user){
#     for (j in 1:n_user){
#       t <- 0
#       b <- 0
#       for (n in 1:n_item){
#         t <- t + c[i,n]*c[j,n]*(s[i,n]-s[j,n])^2
#         b <- b + c[i,n]*c[j,n]
#       }
#       dissim[i,j] <- t/b
#       print(paste(i,j,t,b,dissim))
#     }
#   }
#   L <- max(dissim)
#   w <- (L - dissim)/L
#   return (w)
# }
#
# msd_weight_ms <- msd_weight(ms_train_mat)
# save(msd_weight_ms, file="../output/msd_weight_ms.RData")
```

```
# msd_weight_movie <- msd_weight(movie_train_mat)
# save(msd_weight_movie, file="../output/msd_weight_movie.RData")
```

Simrank(1)

```
# # MS
# # load pkg and data
# library("igraph")
# load("../output/ms_train_mat.RData")
#
# # create the network graph
# users <- rownames(ms_train_mat)
# votes <- colnames(ms_train_mat)
# nodes <- c(users, votes)
# df_edges <- data.frame()
# for (i in 1:length(users)){
#   sink <- names(which(ms_train_mat[i,]==1))
#   n_edges <- length(sink)
#   edges <- data.frame(rep(users[i],n_edges), sink)
#   colnames(edges) <- c("from","to")
#   df_edges <- rbind(df_edges, edges)
# }
# graph <- graph_from_data_frame(d=df_edges, vertices=nodes, directed=F)
# graph
# save(graph, file="../output/graph_ms.RData")
#
# # matrix representation of simrank
# # adjacency matrix
# A <- as_adjacency_matrix(graph)
# A <- as.matrix(A, "adjacency")
# # normalized by columns
# W <- scale(A, center=FALSE, scale=colSums(A))
# I <- diag(length(nodes))
# S <- diag(length(nodes))
# simrank <- function(C = 0.8, K = 5){
#   #res <- list()
#   for (k in 1:K){
#     X <- t(W) %*% S %*% W
#     D <- I
#     diag(D) <- diag(X)
#     S <- C*X - C*D + I
#     #res[[k]] <- S
#   }
#   return(S)
# }
# simrank_weight <- simrank()[1:4151,1:4151]
# save(simrank_weight, file="../output/simrank_weight_ms.RData")
#
# # basic simrank equation
# # neighbors(graph, v, mode = c("out", "in", "all", "total"))
# get_votes <- function(user){
#   votes <- neighbors(graph, user, mode = "out")
```

```

#   return(votes)
# }
#
# get_users <- function(vote){
#   users <- neighbors(graph, vote, mode = "in")
#   return(users)
# }
#
# # simrank
# user_sim <- diag(length(users))
# vote_sim <- diag(length(votes))
#
# user_simrank <- function(u1, u2, C) {
#   if (u1 == u2){
#     return(1)
#   }
#   else {
#     pre <- C / (length(get_votes(u1)) * length(get_votes(u2)))
#     post <- 0
#     for (i in get_votes(u1)){
#       for (j in get_votes(u2)){
#         o1 <- match(nodes[i], votes)
#         o2 <- match(nodes[j], votes)
#         #print(paste(o1,o2,post,vote_sim[o1, o2]))
#         post <- post + vote_sim[o1, o2]
#       }
#     }
#     return(pre*post)
#   }
# }
#
# vote_simrank <- function(v1, v2, C) {
#   if (v1 == v2){
#     return(1)
#   }
#   else {
#     pre <- C / (length(get_users(v1)) * length(get_users(v2)))
#     post <- 0
#     for (i in get_users(v1)){
#       for (j in get_users(v2)){
#         i1 <- match(nodes[i], users)
#         i2 <- match(nodes[j], users)
#         post <- post + user_sim[i1, i2]
#       }
#     }
#     return(pre*post)
#   }
# }
#
# simrank <- function(C = 0.8, K = 1, calc_user = T, calc_vote = F){
#
#   for (k in 1:K){
#

```

```

#   if(calc_user){
#       for (ui in users){
#           for (uj in users){
#               i <- match(ui, users)
#               j <- match(uj, users)
#               sim <- user_simrank(ui, uj, C)
#               user_sim[i, j] <- sim
#               print(paste(ui, uj, sim))
#           }
#       }
#   }
#
#   if(calc_vote){
#       for (vi in votes){
#           for (vj in votes){
#               i <- match(vi, votes)
#               j <- match(vj, votes)
#               sim <- vote_simrank(vi, vj, C)
#               vote_sim[i, j] <- sim
#               print(paste(vi, vj, sim))
#           }
#       }
#   }
# }

```

Variance Weighting

```

## Variance Weighting
# find_var <- function(mat=movie_train){
#   vari <- apply(mat, 2, var, na.rm=TRUE)
#   var_max <- max(vari, na.rm = TRUE)
#   var_min <- min(vari, na.rm = TRUE)
#   vi <- (vari - var_min)/var_max
#   return(vi)
# }
#
# variance_weight_assign <- function(i, j, vi, mat=movie_train){
#   zai <- scale(mat[i, ])
#   zui <- scale(mat[j, ])
#   index <- intersect(which(!is.na(zai)), which(!is.na(zui)))
#   wau <- sum(vi[index]*zai[index]*zui[index])/sum(vi[index])
#   return(wau)
# }
#
# variance_weight_matrix <- function(mat_dim_1, mat = movie_train){
#   mat_weight = matrix(1, nrow=mat_dim_1, ncol=mat_dim_1)
#   vi <- find_var(mat = mat)
#   for (i in 1:(mat_dim_1-1)){
#     print(i)
#     print(Sys.time())
#     for (j in (i+1):mat_dim_1){

```

```

#     wau <- variance_weight_assign(i, j, vi, mat = movie_train)
#     mat_weight[i, j] <- wau
#     mat_weight[j, i] <- wau
#   }
# }
# return(mat_weight)
# }
#
# movie_train <- Transformer(movie_train)
# movie_test <- Transformer(movie_test)
# MS_train <- Transformer2(MS_train)
# MS_test <- Transformer2(MS_test)
#
# # Movie
# mat_variance_weight_movie <- variance_weight_matrix(dim(movie_train)[1], mat = movie_train)
# #mat_variance_weight_movie[is.na(mat_variance_weight_movie)] = 0
# save(mat_variance_weight_movie, file = "variance_weight_Movie.RData")
#
# # MS
# mat_variance_weight_MS <- variance_weight_matrix(dim(MS_train)[1], mat = MS_train)
# #mat_variance_weight_MS[is.na(mat_variance_weight_MS)] = 0
# save(mat_variance_weight_MS, file = "variance_weight_MS.RData")

```

Selecting n-neighbors & Prediction

```

# select_n_neighbour
source("../lib/select_n_neighbour.R")

adjust <- function(matrix){
  matrix[is.na(matrix)] <- 0
  return(matrix)
}

# prediction
source("../lib/prediction.R")

```

pearson

```

load('../output/weight_matrix/movie/pearson_weight_movie.RData')
pearson_weight_movie <- adjust(pearson_weight_movie)

load('../output/weight_matrix/ms/pearson_weight_ms.RData')
pearson_weight_ms <- adjust(pearson_weight_ms)

pr.movie.neighbor = neighbors.select(pearson_weight_movie, n = 20)
pr.MS.neighbor = neighbors.select(pearson_weight_ms, n = 20)

pr.movie.pred = pred.matrix.movie(simweights = pearson_weight_movie, top.neighbors = pr.movie.neighbor)
pr.MS.pred = pred.matrix.ms(simweights = pearson_weight_ms, top.neighbors = pr.MS.neighbor)

```

```

# save(pr.movie.pred, file="../output/prediction/movie/pred_pearson_movie.RData")
# save(pr.MS.pred, file="../output/prediction/ms/pred_pearson_ms.RData")

pr.movie.neighbor1 = neighbors.select(pearson_weight_movie, n = 50)
pr.MS.neighbor1= neighbors.select(pearson_weight_ms, n = 50)

pr.movie.pred1 = pred.matrix.movie(simweights =pearson_weight_movie, top.neighbors = pr.movie.neighbor1)
pr.MS.pred1 = pred.matrix.ms(simweights =pearson_weight_ms, top.neighbors = pr.MS.neighbor1)

# save(pr.movie.pred1,file="../output/prediction/movie/pred_pearson_movie1.RData")
# save(pr.MS.pred1, file="../output/prediction/ms/pred_pearson_ms1.RData")

```

spearman

```

load('../output/weight_martix/movie/spearman_weight_movie.RData')
spearman_weight_movie <- adjust(spearman_weight_movie)

load('../output/weight_martix/ms/spearman_weight_ms.RData')
spearman_weight_ms <- adjust(spearman_weight_ms)

sp.movie.neighbor = neighbors.select(spearman_weight_movie, n = 20)
sp.MS.neighbor = neighbors.select(spearman_weight_ms, n = 20)

sp.movie.pred = pred.matrix.movie(simweights =spearman_weight_movie, top.neighbors = sp.movie.neighbor)
sp.MS.pred = pred.matrix.ms(simweights =spearman_weight_ms, top.neighbors = sp.MS.neighbor)

# save(sp.movie.pred, file="../output/prediction/movie/pred_spearman_movie.RData")
# save(sp.MS.pred, file="../output/prediction/ms/pred_spearman_ms.RData")

sp.movie.neighbor1 = neighbors.select(spearman_weight_movie, n = 50)
sp.MS.neighbor1 = neighbors.select(spearman_weight_ms, n = 50)

sp.movie.pred1 = pred.matrix.movie(simweights =spearman_weight_movie, top.neighbors = sp.movie.neighbor)
sp.MS.pred1 = pred.matrix.ms(simweights =spearman_weight_ms, top.neighbors = sp.MS.neighbor1)

# save(sp.movie.pred1,file="../output/prediction/movie/pred_spearman_movie1.RData")
# save(sp.MS.pred1, file="../output/prediction/ms/pred_spearman_ms1.RData")

```

msd

```

load('../output/weight_martix/movie/msd_weight_movie.RData')
msd_weight_movie <- adjust(msd_weight_movie)

load('../output/weight_martix/ms/msd_weight_ms.RData')
msd_weight_ms <- adjust(msd_weight_ms)

msd.movie.neighbor = neighbors.select(msd_weight_movie, n = 20)
msd.MS.neighbor = neighbors.select(msd_weight_ms, n = 20)

msd.movie.pred = pred.matrix.movie(simweights =msd_weight_movie, top.neighbors = msd.movie.neighbor)

```

```

msd.MS.pred = pred.matrix.ms(simweights =msd_weight_ms, top.neighbors = msd.MS.neighbor)

# save(msd.movie.pred, file="../output/prediction/movie/pred_msd_movie.RData")
# save(msd.MS.pred, file="../output/prediction/ms/pred_msd_ms.RData")

msd.movie.neighbor1 = neighbors.select(msd_weight_movie, n = 50)
msd.MS.neighbor1 = neighbors.select(msd_weight_ms, n = 50)

msd.movie.pred1 = pred.matrix.movie(simweights =msd_weight_movie, top.neighbors = msd.movie.neighbor1)
msd.MS.pred1 = pred.matrix.ms(simweights =msd_weight_ms, top.neighbors = msd.MS.neighbor1)

# save(msd.movie.pred1, file="../output/prediction/movie/pred_msd_movie1.RData")
# save(msd.MS.pred1, file="../output/prediction/ms/pred_msd_ms1.RData")

```

simrank

```

load('../output/weight_matrix/ms/simrank_weight_ms.RData')
simrank_weight_ms <- adjust(simrank_weight_ms)

sim.MS.neighbor = neighbors.select(simrank_weight_ms, n = 20)
sim.MS.pred = pred.matrix.ms(simweights =simrank_weight_ms, top.neighbors = sim.MS.neighbor)
# save(sim.MS.pred, file="../output/prediction/ms/pred_sim_ms.RData")

sim.MS.neighbor1 = neighbors.select(simrank_weight_ms, n = 50)
sim.MS.pred1 = pred.matrix.ms(simweights =simrank_weight_ms, top.neighbors = sim.MS.neighbor1)
# save(sim.MS.pred1, file="../output/prediction/ms/pred_sim_ms1.RData")

```

var

```

load('../output/weight_matrix/movie/variance_weight_movie.RData')
variance_weight_movie <- adjust(mat_variance_weight)

load('../output/weight_matrix/ms/variance_weight_MS.RData')
variance_weight_MS <- adjust(mat_variance_weight)

var.movie.neighbor = neighbors.select(variance_weight_movie, 20)
var.MS.neighbor = neighbors.select(variance_weight_MS, 20)

var.movie.pred = pred.matrix.movie(simweights =variance_weight_movie, top.neighbors = var.movie.neighbor)
var.MS.pred = pred.matrix.ms(simweights =variance_weight_MS, top.neighbors = var.MS.neighbor)

# save(var.movie.pred, file="../output/prediction/movie/pred_var_movie.RData")
# save(var.MS.pred, file="../output/prediction/ms/pred_var_ms.RData")

var.movie.neighbor1 = neighbors.select(variance_weight_movie, 50)
var.MS.neighbor1 = neighbors.select(variance_weight_MS, 50)

var.movie.pred1 = pred.matrix.movie(simweights =variance_weight_movie, top.neighbors = var.movie.neighbor1)
var.MS.pred1 = pred.matrix.ms(simweights =variance_weight_MS, top.neighbors = var.MS.neighbor1)

```



```
# save(var.movie.pred1, file="../output/prediction/movie/pred_var_movie1.RData")
# save(var.MS.pred1, file="../output/prediction/ms/pred_var_ms1.RData")
```

Evaluation

Without Variance

```
source("../lib/evaluation.R")

# Movie + TOP 20
pearson.movie.mae = evaluation.mae(pr.movie.pred, movie_test)
spearman.movie.mae = evaluation.mae(sp.movie.pred, movie_test)
msd.movie.mae = evaluation.mae(msd.movie.pred, movie_test)

# Movie + TOP 50
pearson.movie.mae1 = evaluation.mae(pr.movie.pred1, movie_test)
spearman.movie.mae1 = evaluation.mae(sp.movie.pred1, movie_test)
msd.movie.mae1 = evaluation.mae(msd.movie.pred1, movie_test)

# MS + TOP 20
pearson.MS.rs = rank_score(pr.MS.pred, MS_test)
spearman.MS.rs = rank_score(sp.MS.pred, MS_test)
msd.MS.rs = rank_score(msd.MS.pred, MS_test)
sim.MS.rs = rank_score(sim.MS.pred, MS_test)

# MS + TOP 50
pearson.MS.rs1 = rank_score(pr.MS.pred1, MS_test)
spearman.MS.rs1 = rank_score(sp.MS.pred1, MS_test)
msd.MS.rs1 = rank_score(msd.MS.pred1, MS_test)
sim.MS.rs1 = rank_score(sim.MS.pred1, MS_test)
```

With Variance

```
# Pearson + Variance
pearson.var.movie = variance_weight_movie * pearson_weight_movie
pearson.var.MS = variance_weight_MS * pearson_weight_ms
pearson.var.movie.neighbor = neighbors.select(pearson.var.movie, n = 20)
pearson.var.MS.neighbor = neighbors.select(pearson.var.MS, n = 20)
pearson.var.movie.pred = pred.matrix.movie(simweights = pearson.var.movie, top.neighbors = pearson.var.movie.neighbor)
pearson.var.MS.pred = pred.matrix.ms(simweights = pearson.var.MS, top.neighbors = pearson.var.MS.neighbor)

pearson.var.movie.neighbor1 = neighbors.select(pearson.var.movie, n = 50)
pearson.var.MS.neighbor1 = neighbors.select(pearson.var.MS, n = 50)
pearson.var.movie.pred1 = pred.matrix.movie(simweights = pearson.var.movie, top.neighbors = pearson.var.movie.neighbor1)
pearson.var.MS.pred1 = pred.matrix.ms(simweights = pearson.var.MS, top.neighbors = pearson.var.MS.neighbor1)

# Spearman + Variance
spearman.var.movie = variance_weight_movie * spearman_weight_movie
spearman.var.MS = variance_weight_MS * spearman_weight_ms
```

```

spearman.var.movie.neighbor = neighbors.select(spearman.var.movie, n=20)
spearman.var.MS.neighbor = neighbors.select(spearman.var.MS, n=20)
spearman.var.movie.pred = pred.matrix.movie(simweights=spearman.var.movie,top.neighbors = spearman.var.MS.neighbor)
spearman.var.MS.pred = pred.matrix.ms(simweights=spearman.var.MS,top.neighbors = spearman.var.MS.neighbor)

spearman.var.movie.neighbor1 = neighbors.select(spearman.var.movie, n=50)
spearman.var.MS.neighbor1 = neighbors.select(spearman.var.MS, n=50)
spearman.var.movie.pred1 = pred.matrix.movie(simweights=spearman.var.movie,top.neighbors = spearman.var.MS.neighbor1)
spearman.var.MS.pred1 = pred.matrix.ms(simweights=spearman.var.MS,top.neighbors = spearman.var.MS.neighbor1)

# MSD + Variance
msd.var.movie = variance_weight_movie * msd_weight_movie
msd.var.MS = variance_weight_MS * msd_weight_ms
msd.var.movie.neighbor = neighbors.select(msd.var.movie, n=20)
msd.var.MS.neighbor = neighbors.select(msd.var.MS, n=20)
msd.var.movie.pred = pred.matrix.movie(simweights=msd.var.movie,top.neighbors = msd.var.movie.neighbor)
msd.var.MS.pred = pred.matrix.ms(simweights=msd.var.MS,top.neighbors = msd.var.MS.neighbor)

msd.var.movie.neighbor1 = neighbors.select(msd.var.movie, n=50)
msd.var.MS.neighbor1 = neighbors.select(msd.var.MS, n=50)
msd.var.movie.pred1 = pred.matrix.movie(simweights=msd.var.movie,top.neighbors = msd.var.movie.neighbor1)
msd.var.MS.pred1 = pred.matrix.ms(simweights=msd.var.MS,top.neighbors = msd.var.MS.neighbor1)

# SimRank + Var
simrank.var.ms = variance_weight_MS * simrank_weight_ms
simrank.var.ms.neighbor = neighbors.select(simrank.var.ms, n=20)
simrank.var.ms.pred = pred.matrix.ms(simweights=simrank.var.ms,top.neighbors = simrank.var.ms.neighbor)

simrank.var.ms1 = variance_weight_MS * simrank_weight_ms
simrank.var.ms.neighbor1 = neighbors.select(simrank.var.ms, n=50)
simrank.var.ms.pred1 = pred.matrix.ms(simweights=simrank.var.ms,top.neighbors = simrank.var.ms.neighbor1)

# Movie + TOP 20
pearson.var.movie.mae = evaluation.mae(pearson.var.movie.pred, movie_test)
spearman.var.movie.mae = evaluation.mae(spearman.var.movie.pred, movie_test)
msd.var.movie.mae = evaluation.mae(msd.var.movie.pred, movie_test)

# Movie + TOP 50
pearson.var.movie.mae1 = evaluation.mae(pearson.var.movie.pred1, movie_test)
spearman.var.movie.mae1 = evaluation.mae(spearman.var.movie.pred1, movie_test)
msd.var.movie.mae1 = evaluation.mae(msd.var.movie.pred1, movie_test)

# MS + TOP 20
pearson.var.MS.rs = rank_score(pearson.var.MS.pred, MS_test)
spearman.var.MS.rs = rank_score(spearman.var.MS.pred, MS_test)
msd.var.MS.rs = rank_score(msd.var.MS.pred, MS_test)
sim.var.MS.rs = rank_score(simrank.var.ms.pred, MS_test)

# MS + TOP 50
pearson.var.MS.rs1 = rank_score(pearson.var.MS.pred1, MS_test)
spearman.var.MS.rs1 = rank_score(spearman.var.MS.pred1, MS_test)
msd.var.MS.rs1 = rank_score(msd.var.MS.pred1, MS_test)
sim.var.MS.rs1 = rank_score(simrank.var.ms.pred1, MS_test)

```