## ISING - MCMC - Script

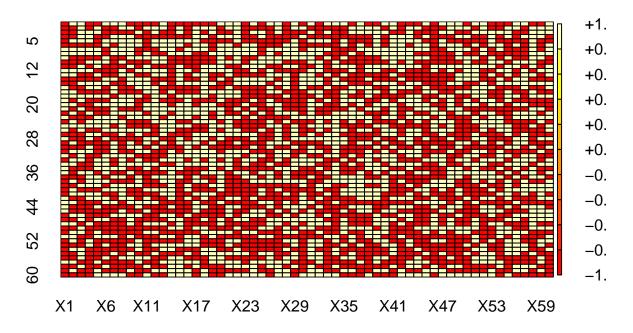
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The Monte-Carlo method here implemented was adapted from the pseudo-code provided in the textbook Frenkel, D., & Smit, B. (2001). Understanding molecular simulation: from algorithms to applications. For a better performance the user should consider to implement in C++ or in Fortran (this was the Frenkel and Smit idea).

```
Loading of the libraries
library(ggplot2)
library(plot.matrix)
## Warning: package 'plot.matrix' was built under R version 4.0.5
library(ggplotify)
## Warning: package 'ggplotify' was built under R version 4.0.5
library(grid)
library(dppmix)
## Warning: package 'dppmix' was built under R version 4.0.5
library(SpatEntropy)
## Warning: package 'SpatEntropy' was built under R version 4.0.5
## Loading required package: spatstat
## Warning: package 'spatstat' was built under R version 4.0.5
## Loading required package: spatstat.data
## Warning: package 'spatstat.data' was built under R version 4.0.5
## Loading required package: spatstat.geom
## Warning: package 'spatstat.geom' was built under R version 4.0.5
## spatstat.geom 2.3-1
## Loading required package: spatstat.core
## Warning: package 'spatstat.core' was built under R version 4.0.5
## Loading required package: nlme
## Warning: package 'nlme' was built under R version 4.0.5
## Loading required package: rpart
## spatstat.core 2.3-2
## Loading required package: spatstat.linnet
## Warning: package 'spatstat.linnet' was built under R version 4.0.5
```

```
## spatstat.linnet 2.3-1
## spatstat 2.3-0
                                                              (nickname: 'That's not important right now')
## For an introduction to spatstat, type 'beginner'
Variables intialization
ffn<-as.double(0)
ffn<-as.double(0)
sfn<-as.double(0)
tfn<-as.double(0)
J <- as.double(1) #SET HERE THE COUPLING CONSTANT</pre>
m <- as.double(0)</pre>
energy <- as.double(0)</pre>
energy_new <- as.double(0)</pre>
dimension <-as.integer(60) # SET HERE THE LATTICE DIMENSION
energy_history<-data.frame(matrix(0, ncol = 6, nrow = 20000))</pre>
colnames(energy_history)<-c("Step", "Energy", "Magnetization", "Mag_sd", "T-val", "S_Entropy")
lattice <- data.frame(replicate(dimension,replicate(dimension,0)))</pre>
lattice_save <- data.frame(replicate(dimension,replicate(dimension,0)))</pre>
\#lattice[1:dimension, 1:dimension] \leftarrow data.frame(replicate(dimension, sample(c(-1,1), dimension, rep=TRUE))
lattice[1:dimension,1:dimension] <- data.frame(matrix(2*rbinom(dimension*dimension,1,1/2)-1,ncol = dimension)
correlation_matrix_start <- array(dim=c(dimension ,dimension 
correlation_matrix <- array(dim=c(dimension ,dimension ,dimension ,dimension ))</pre>
mean_correlation_matrix <- array(dim=c(dimension ,dimension ))</pre>
lattice_save <- data.frame(replicate(dimension,replicate(dimension,0)))</pre>
Plot the starting configuration
Ising_lattice<-data.matrix(lattice)</pre>
plot(Ising_lattice,breaks=c(-1,1),xaxt = "n",ylab='',xlab='',tick = FALSE)
```

## Ising\_lattice



The core of the script

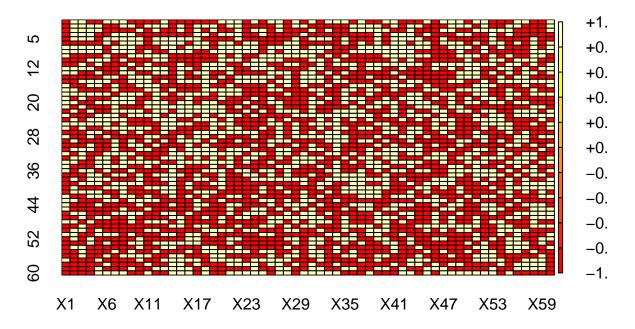
```
for (iter in 1:10) { #Set here the number of MC cycles, note that larger lattice will require larger cy
                    # ----->CAUTION <----- Just for this example we set 10, but the user should
 m < - 0
 energy <- 0
 energy_new <- 0
 lattice_save<-lattice # The old lattice is saved</pre>
for (i in 1:dimension) { #Energy evaluation before the MC move
 for (j in 1:dimension) {
   i_right= ((i) %% dimension)+1
                                    #Note that the PBC are applied in order to delete the borders
   i_left= ((i-2) %% dimension)+1
   j_{\text{down}} = ((j-2) \% \text{ dimension})+1
   j_up= ((j) %% dimension)+1
   if ( lattice[i,j]==lattice[i_right,j]*J){
      energy = energy -1
   if ( lattice[i,j]==lattice[i_left,j]*J){
      energy = energy -1
   if ( lattice[i,j]==lattice[i,j_up]*J){
      energy = energy -1
   if ( lattice[i,j]==lattice[i,j_down]*J){
```

```
energy = energy -1
    }
  }
}
  p<-shannon(as.matrix(lattice)) #The important values are saved in to a dataframe
  energy_history[iter, "Energy"] = energy/(dimension*dimension)
  energy_history[iter,"Step"]=iter
  energy_history[iter, "Magnetization"] = mean(as.matrix(lattice[1:dimension, 1:dimension]))
  energy_history[iter,"Mag_sd"]=sd(as.matrix(lattice[1:dimension,1:dimension]))
  energy_history[iter,"T-val"]=energy_history[iter,"Magnetization"]/energy_history[iter,"Mag_sd"]
  energy_history[iter,"S_Entropy"]=p$rel.shann
print(c(iter, energy_history[iter, "Energy"], energy_history[iter, "Magnetization"], energy_history[iter, "T-
lattice_save<-lattice</pre>
  x <- sample(1:dimension , 1) #MC move
  y <- sample(1:dimension , 1)
  if ( lattice[x,y] > 0){
    lattice[x,y]=-1
    } else {
    lattice[x,y]=+1
    }
# print(x)
# print(y)
  for (k in 1:3) { #Use this portion of code to put the diffusion centers
    for (j in 1:3) {
      lattice[k+1,j+1]=+1
    }
  }
  for (k in 1:3) {
    for (j in 1:3) {
      lattice [k+dimension-4, j+1]=-1
    }
  }
  for (k in 1:3) {
    for (j in 1:3) {
      lattice[k+1, j+dimension-4]=-1
```

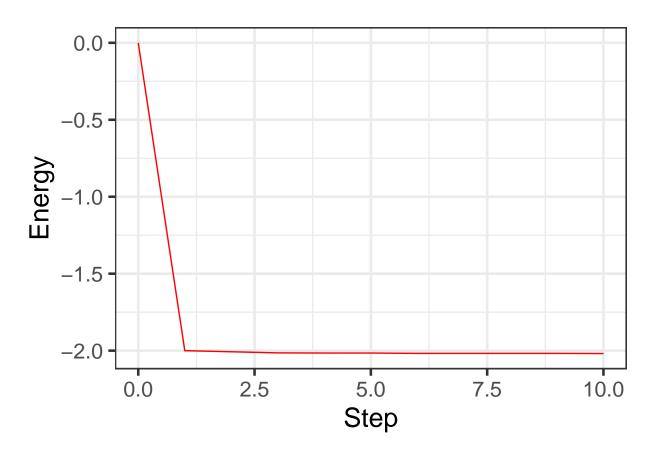
```
}
 }
for (k in 1:3) {
  for (j in 1:3) {
     lattice[k+dimension-4,j+dimension-4]=+1
  }
}
     lattice[dimension-k-3, dimension-j-3]=-2
 for (i in 1:dimension) { #Energy calculation after the MC move
  for (j in 1:dimension) {
     i_right= ((i) %% dimension)+1
     i_left= ((i-2) %% dimension)+1
     j_down = ((j-2) \% dimension) + 1
     j_up= ((j) %% dimension)+1
     if ( lattice[i,j]==lattice[i_right,j]*J){
      energy_new = energy_new -1
     if ( lattice[i,j]==lattice[i_left,j]*J){
       energy_new = energy_new -1
     if ( lattice[i,j]==lattice[i,j_up]*J){
      energy_new = energy_new -1
     if ( lattice[i,j]==lattice[i,j_down]*J){
       energy_new = energy_new -1
     }
  }
}
 if (energy_new < energy ){  #Metropolis code: if the new energy is lower accept it, otherwise exctra
 # print("Accepted")
if (energy_new >= energy ){
  delta<-as.double(0)</pre>
  q<-as.double(0)
  p<-sample(1:10,1)/10
  delta<-abs(energy_new-energy)</pre>
  #print(delta)
  q<-exp(-delta/0.000000001)
```

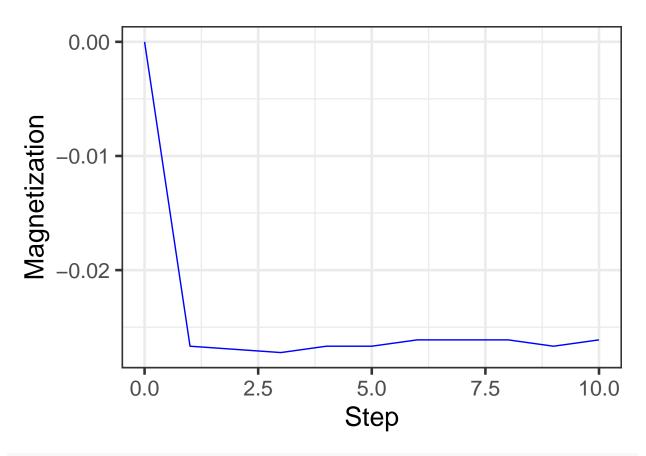
```
\#print(c(p,q))
   if(p > q){
  }
  }
  Ising lattice FINAL<-data.matrix(lattice)</pre>
}
## [1]
       1.00000000 -2.00000000 -0.02666667 -0.02667245 0.99948698
       2.00000000 -2.01444444 -0.02722222 -0.02722853 0.99946538
## [1]
## [1]
       3.00000000 -2.01444444 -0.02722222 -0.02722853 0.99946538
       4.00000000 -2.01555556 -0.02666667 -0.02667245 0.99948698
## [1]
## [1]
       5.00000000 -2.01555556 -0.02666667 -0.02667245 0.99948698
       6.00000000 -2.01777778 -0.02611111 -0.02611639 0.99950814
## [1]
       7.00000000 -2.01777778 -0.02611111 -0.02611639 0.99950814
## [1]
## [1]
       8.00000000 -2.01777778 -0.02611111 -0.02611639 0.99950814
## [1]
       9.00000000 -2.01777778 -0.02666667 -0.02667245 0.99948698
## [1] 10.00000000 -2.01888889 -0.02611111 -0.02611639 0.99950814
Plot the evolution of the important quantities (such as energy, mean magnetization, shannon entropy...)
Ising_lattice_FINAL<-data.matrix(lattice)</pre>
plot(Ising_lattice_FINAL,breaks=c(-1,1),xaxt = "n",ylab='',xlab='',tick = FALSE)
```

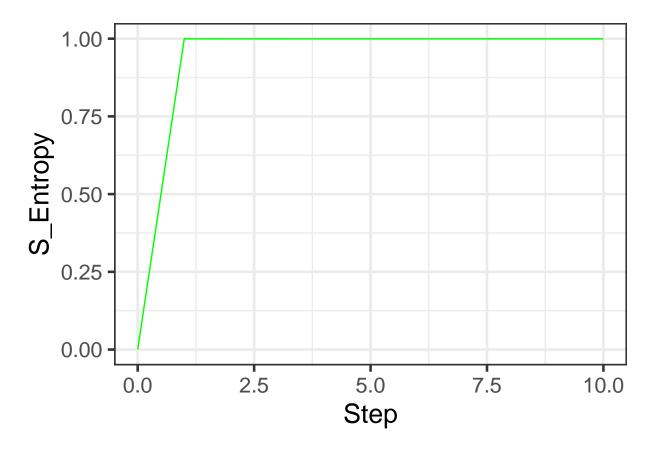
# Ising\_lattice\_FINAL



```
#plot(energy_history)
energy_history<-energy_history[-2,]
ggplot(data= energy_history,mapping = aes(x = Step, y = Energy))+geom_line(colour="red")+theme_bw(base_</pre>
```



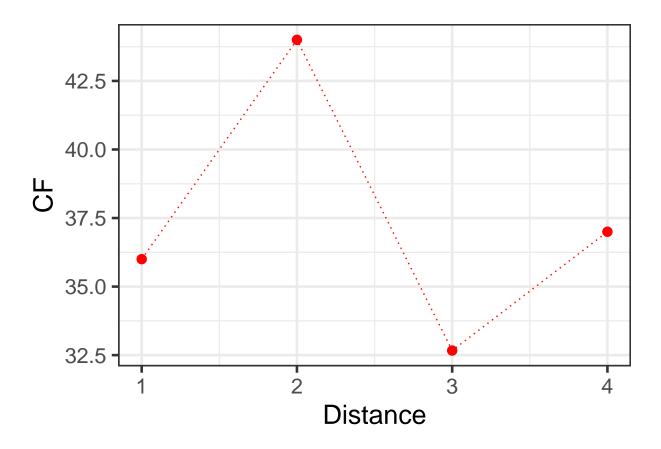




Calculation and plot of the correlation function uf the 4-near-neighbor

```
ffn<-as.double(0)
sfn<-as.double(0)
tfn<-as.double(0)
fofn<-as.double(0)</pre>
for (i in 1:dimension) {
  for (j in 1:dimension) {
    i_right= ((i) %% dimension)+1
    i_left= ((i-2) %% dimension)+1
    j_down = ((j-2) \% dimension) + 1
    j_{p} = ((j) \% \text{ dimension}) + 1
i_rright= ((i+1) %% dimension)+1
i_{left} = ((i-3) \% dimension)+1
j_ddown= ((j-3) \% dimension)+1
j_up=((j+1) \%\% dimension)+1
i_rrright= ((i+2) %% dimension)+1
i_llleft= ((i-4) \% dimension)+1
```

```
j_dddown = ((j-4) \% dimension) + 1
j_uuup= ((j+2) %% dimension)+1
i_rrrright= ((i+3) %% dimension)+1
i_lllleft= ((i-5) %% dimension)+1
j_ddddown= ((j-5) \% dimension)+1
j_uuuup= ((j+3) %% dimension)+1
ffn<-ffn+(lattice[i,j]*lattice[i_right,j]+lattice[i,j]*lattice[i_left,j]+lattice[i,j]*lattice[i,j_up]+l
sfn<-sfn+(lattice[i,j]*lattice[i_rright,j]+lattice[i,j]*lattice[i,j]+lattice[i,j]*lattice[i,j]ddo
         +lattice[i,j]*lattice[i_right,j_down] + lattice[i,j]*lattice[i_right,j_up]+lattice[i,j]*lattic
tfn<-tfn+(lattice[i,j]*lattice[i_rrright,j]+lattice[i,j]*lattice[i_llleft,j]+lattice[i,j]*lattice[i,j]
fofn<-fofn+(lattice[i,j]*lattice[i_rrrright,j]+lattice[i,j]*lattice[i_lllleft,j]+lattice[i,j]*lattice[i
          +lattice[i,j]*lattice[i_right,j_uuup]+lattice[i,j]*lattice[i_rright,j_uup]+lattice[i,j]*latti
          +lattice[i,j]*lattice[i_rrright,j_down]+lattice[i,j]*lattice[i_rright,j_ddown]+lattice[i,j]*l
          +lattice[i,j]*lattice[i_llleft,j_down]+lattice[i,j]*lattice[i_lleft,j_ddown]+lattice[i,j]*lat
          +lattice[i,j]*lattice[i_llleft,j_up]+lattice[i,j]*lattice[i_lleft,j_uup]+lattice[i,j]*lattice
          )/16
 }
}
ffn
## [1] 36
sfn
## [1] 44
## [1] 32.66667
fofn
## [1] 37
order_parameter<-data.frame("Distance"=c(1,2,3,4), "CF"=c(ffn,sfn,tfn,fofn))
#fit<-lm(log(CF) ~ Distance, data= order_parameter)</pre>
#summary(fit)
ggplot(data= order_parameter,mapping = aes(x = Distance, y = CF))+geom_line(linetype="dotted",colour="r
```



### Save the results

```
save(Ising_lattice_FINAL,file="J-1_60_2500_T=16_lattice.rda")
save(energy_history,file="J-1_60_2500_T=16_energy.rda")
```