

Cluster algorithm for the Ising model

Define bond index corresponding to pair of interacting spins

bond $b = 1, 2, \dots, N_b$, interacting spins $\sigma_{i(b)}, \sigma_{j(b)}$

Number of bonds $N_b = dN$ for a d-dimensional cubic lattice

Write the energy of the Ising ferromagnet as

$$E = -|J| \sum_{b=1}^{N_b} [\sigma_{i(b)} \sigma_{j(b)} + 1] = - \sum_{b=1}^{N_b} E_b$$

Write the partition function as

$$Z = \sum_{\sigma} e^{-E(\sigma)/T} = \sum_{\sigma} \prod_{b=1}^{N_b} e^{E_b/T} = \sum_{\sigma} \prod_{b=1}^{N_b} [1 + (e^{E_b/T} - 1)]$$

Define bond functions with arguments 0,1 (bond variable):

$$\begin{aligned} F_b(0) &= 1 \\ F_b(1) &= e^{E_b/T} - 1 \end{aligned} \quad Z = \sum_{\sigma} \prod_{b=1}^{N_b} [F_b(0) + F_b(1)]$$

Introduce **bond variables**

$$\tau_b = 0, 1, \quad \tau = \{\tau_1, \tau_2, \dots, \tau_{N_b}\}$$

Partition function can be written as **sum over spins and bonds**

$$Z = \sum_{\sigma} \prod_{b=1}^{N_b} [F_b(0) + F_b(1)] = \sum_{\sigma} \sum_{\tau} \prod_{b=1}^{N_b} F_b(\tau_b)$$

The functions F_b depend on the spins:

$$F_b(0) = 1$$

$$F_b(1) = e^{E_b/T} - 1 = \begin{cases} e^{2|J|/T} - 1, & \text{if } \sigma_{i(b)} = \sigma_{j(b)} \\ 0, & \text{if } \sigma_{i(b)} \neq \sigma_{j(b)} \end{cases}$$

$\tau_b = 1$ allowed only between parallel spins

Probabilities: For everything else fixed, probability for a given b

$$P(\tau_b) = \frac{F(\tau_b)}{F(0) + F(1)} = \frac{F(\tau_b)}{e^{2|J|/T}}$$

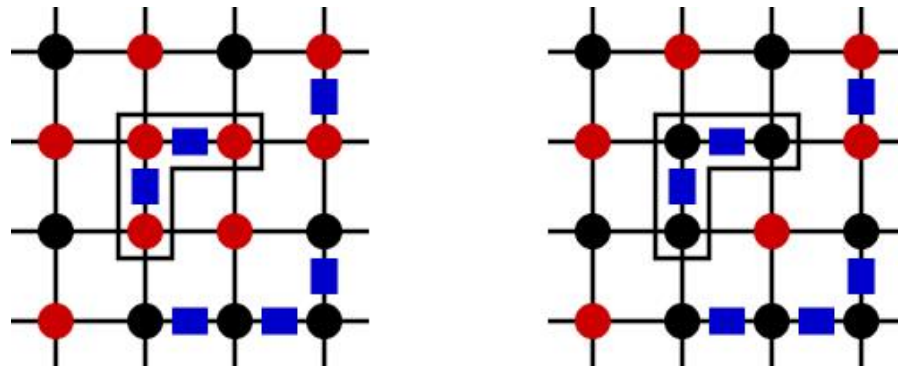
If **parallel spins on bond b** , probabilities for the bond variable

$$P(\tau_b = 0) = e^{-2|J|/T}, \quad P(\tau_b = 1) = 1 - e^{-2|J|/T}$$

If **anti-parallel spins on bond b**

$$P(\tau_b = 0) = 1, \quad P(\tau_b = 1) = 0$$

For a fixed bond configuration, **spins forming clusters** (spins connected by “filled” bonds) **can be flipped** and then give a configuration (term) with the same weight in Z ($F_b=1$ for all bonds between clusters, F_b unchanged inside cluster).



$N(\tau_b = 1) =$ No. of filled bonds

$$W = (e^{2|J|/T} - 1)^{N(\tau_b=1)}$$

(unchanged after flip)

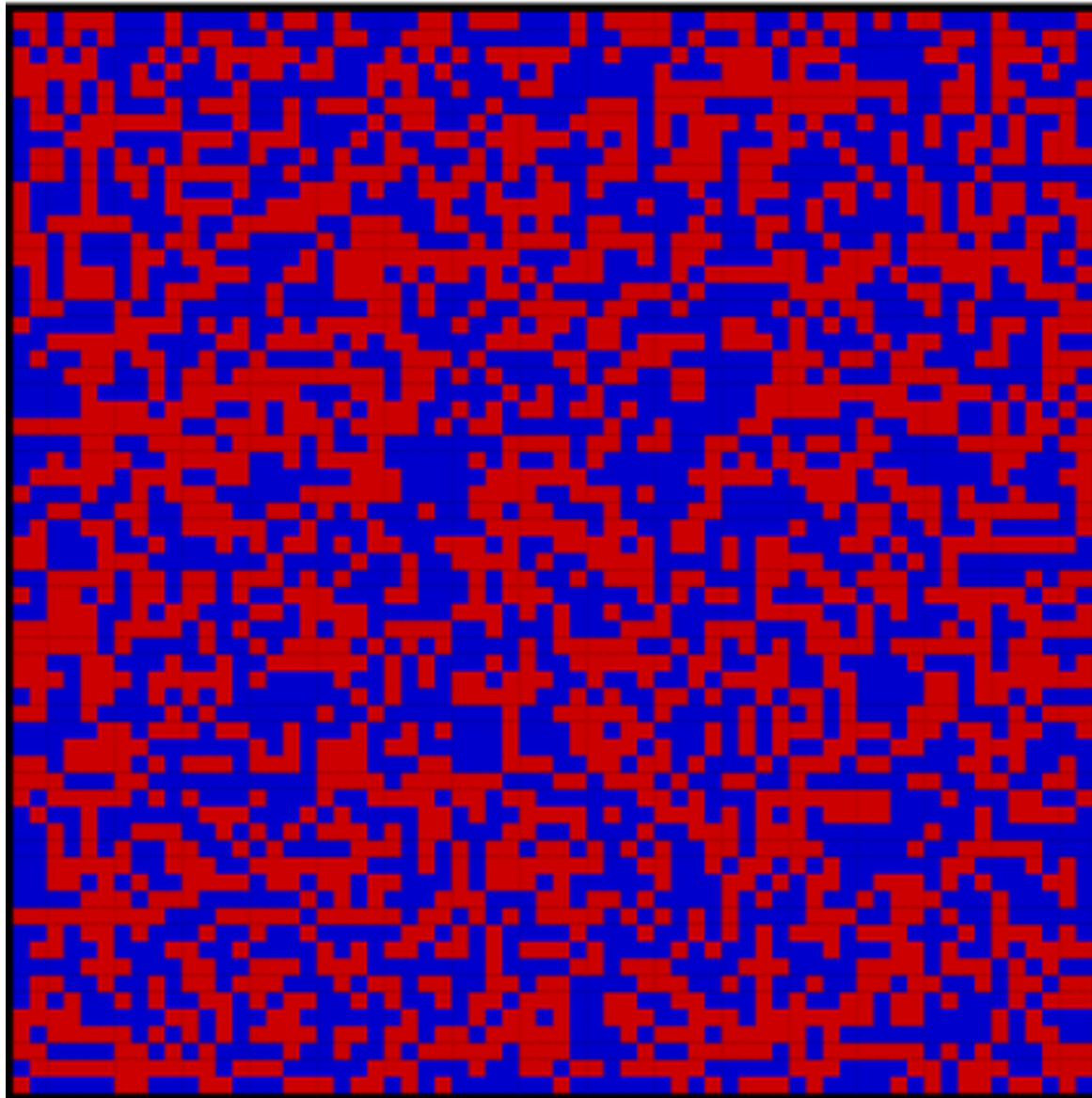
Spins not connected to any filled bonds are single-spin clusters

Swendsen-Wang algorithm

- Start from spin configuration
- Generate bond configuration
- Identify clusters of spins connected by bonds
- Flip each cluster with probability 1/2
- Generate new bonds with the current spins, etc

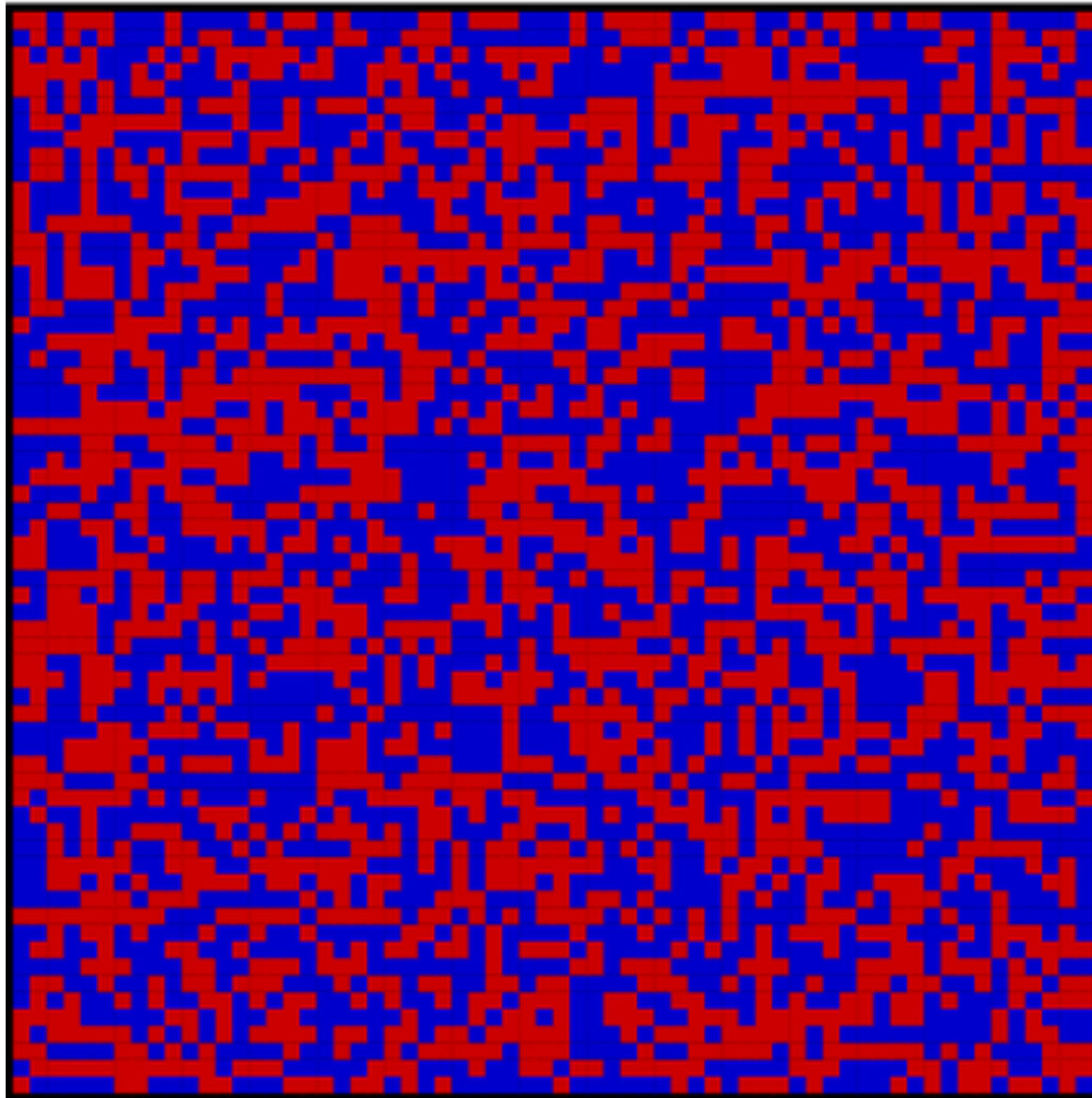
$T = 3.00$

1



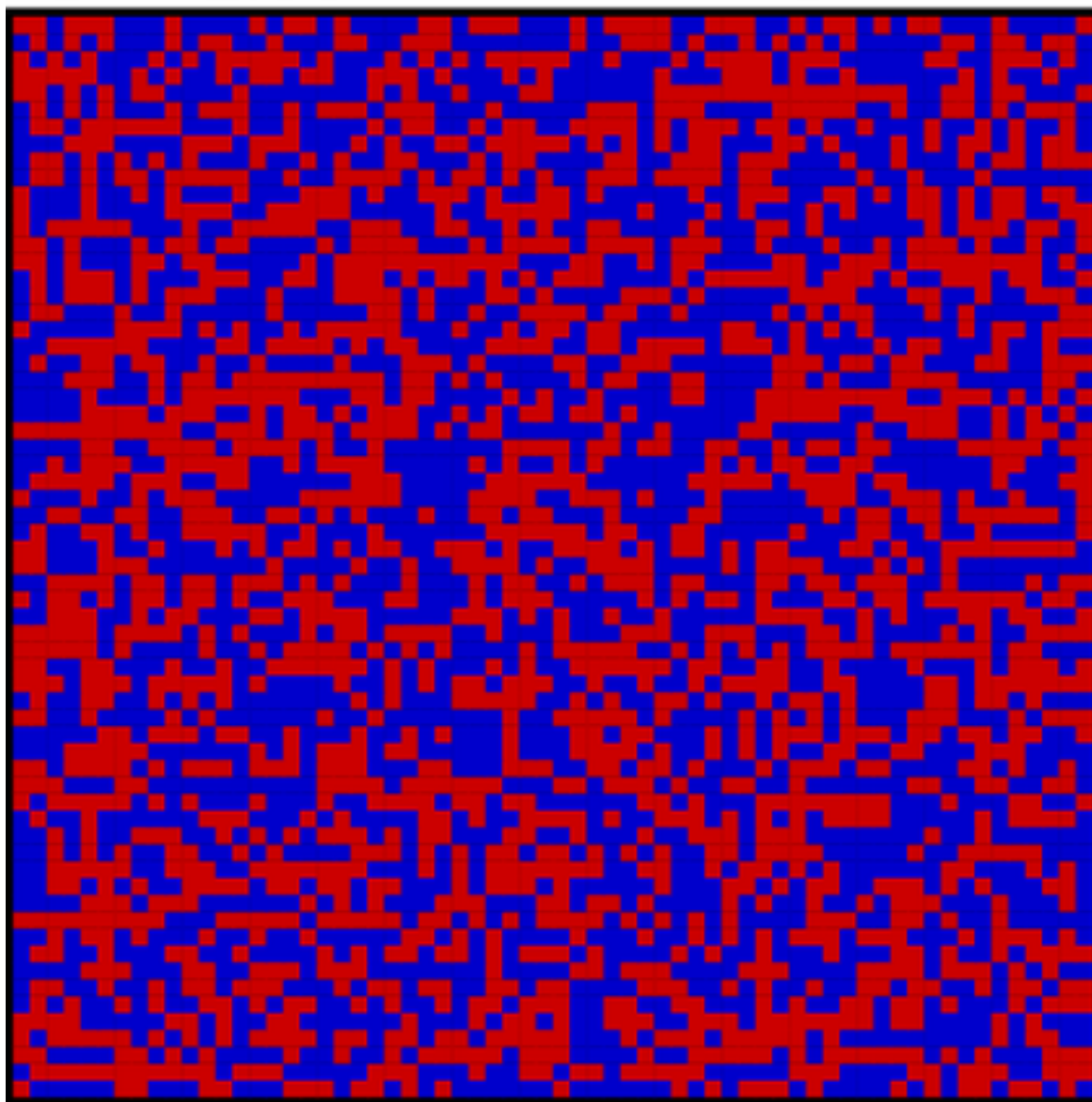
$T = 2.30$

1



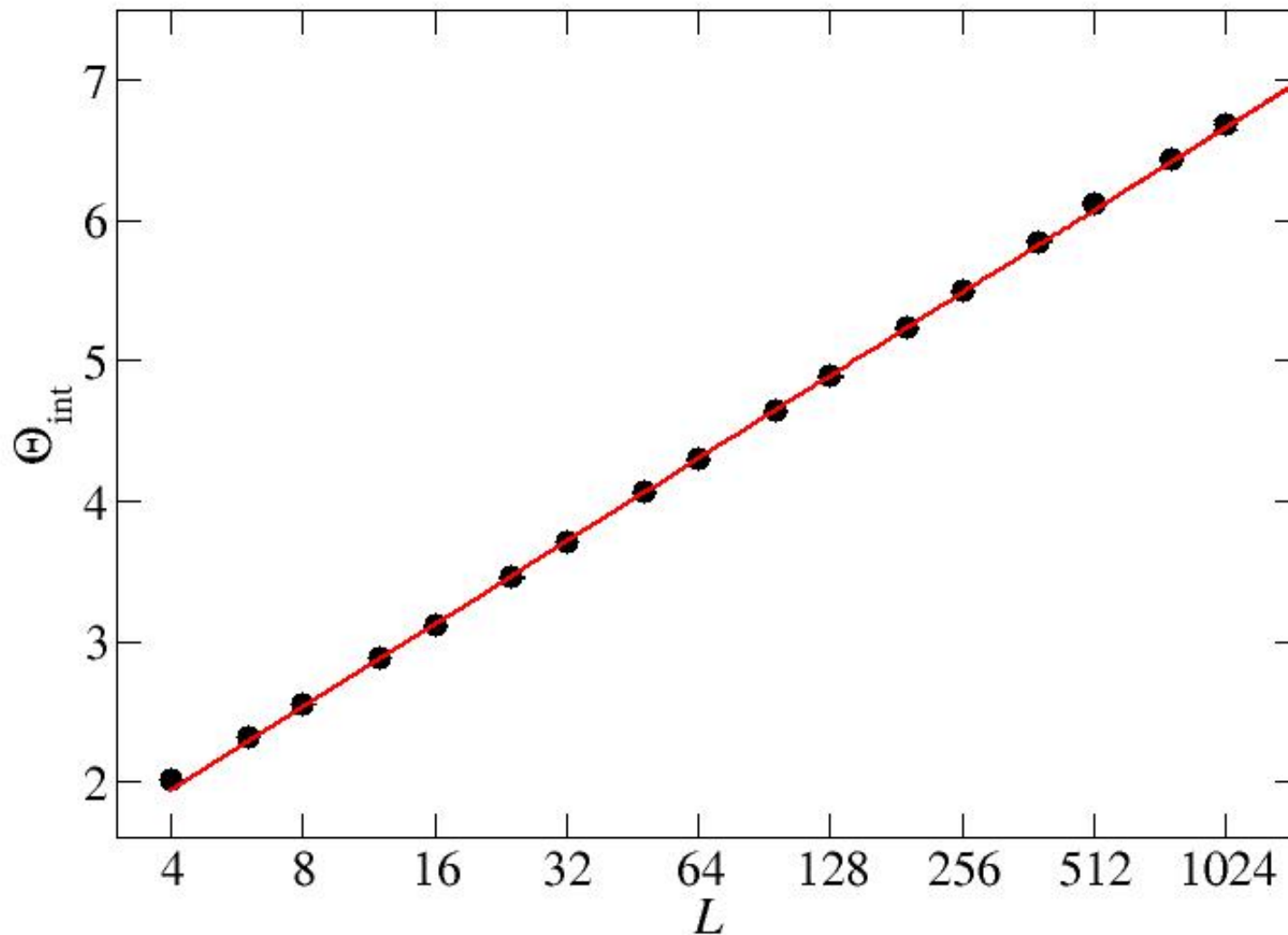
$T = 2.00$

1



Integrated autocorrelation times

- $z=0$ for Swendsen-Wang in two dimensions?
- log-divergence of autocorrelation time?
- More likely $z \sim 0.3$ (hard to distinguish L^z and \log if z small)



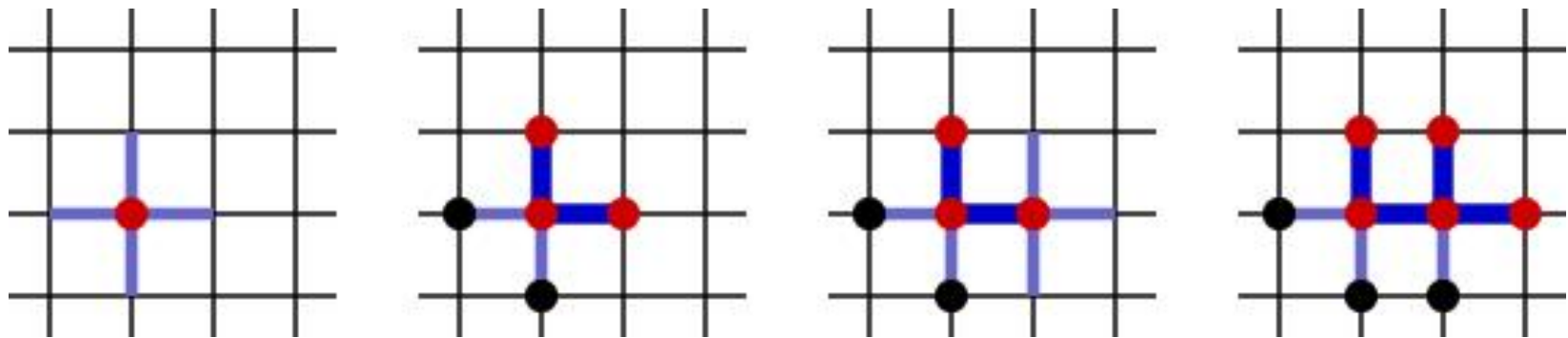
Cluster finding/flipping

Clusters can be constructed and flipped in the same process

➤ Decide whether or not to flip (50% probability) before starting

Store array with flags for spins visited

- Start with spin that has not been visited; seed of cluster
- Add connected (by filled bonds) neighbors to cluster
- Examine the non-visited neighbors of the new spins added
- Add connected neighbors to cluster
- Until no more spins in the cluster with non-visited neighbors



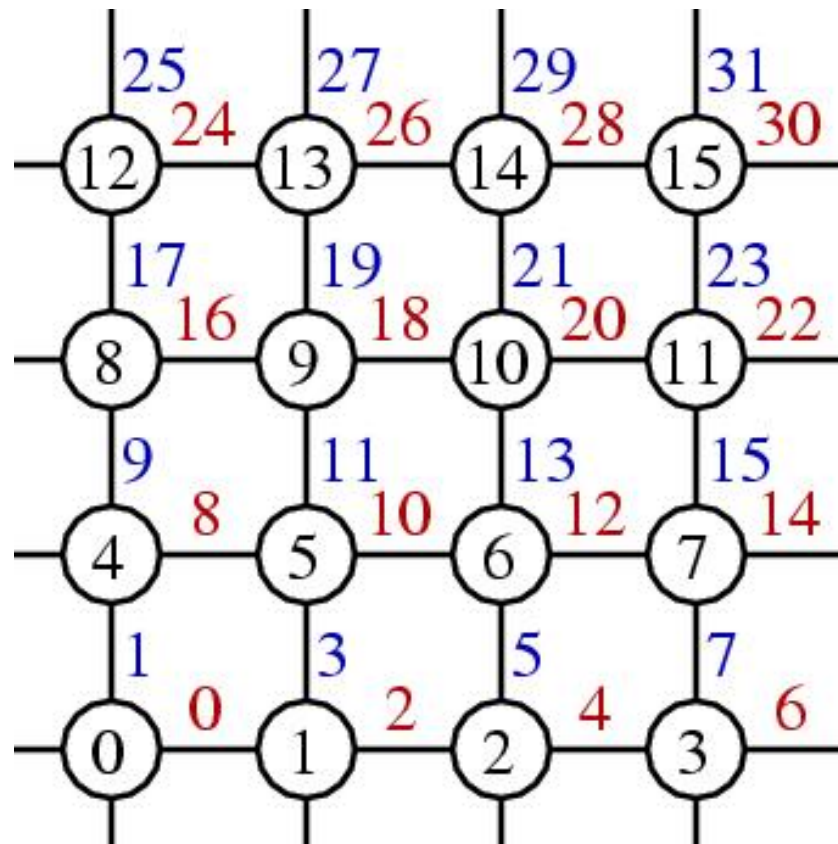
Use stack to store spins with neighbors to be examined

Programming the Swendsen-Wang algorithm

To construct clusters, we need arrays containing

- Neighbors of given site s : `neighbor(i, s)`
- Two spins connected by given bond b : `bondspin(i, b)`
- Bonds connected to given spin s : `spinbond(i, s)`

Labeling of spins and bonds; example in 2D



Storing spin and bond variables in one-dimensional vectors

`spin(0:n-1), bond(0:d*n-1)`

Construction of lattice arrays in 2D

subroutine lattice

```
do s0=0,n-1
  x0=mod(s0,lx)
  y0=s0/lx
  x1=mod(x0+1,lx)
  x2=mod(x0-1+lx,lx)
  y1=mod(y0+1,ly)
  y2=mod(y0-1+ly,ly)
  s1=x1+y0*lx
  s2=x0+y1*lx
  s3=x2+y0*lx
  s4=x0+y2*lx
```

```
  neighbor(1,s0)=s1
  neighbor(2,s0)=s2
  neighbor(3,s0)=s3
  neighbor(4,s0)=s4
  bondspin(1,2*s0)=s0
  bondspin(2,2*s0)=s1
  bondspin(1,2*s0+1)=s0
  bondspin(2,2*s0+1)=s2
  spinbond(1,s0)=2*s0
  spinbond(2,s0)=2*s0+1
  spinbond(3,s1)=2*s0
  spinbond(4,s2)=2*s0+1
end do
```

Main program

```
bprob=1.d0-exp(-2.d0/temp)
do i=1,steps/4
    call castbonds
    call flipclusters
enddo
do j=1,bins
    call resetbindata
    do i=1,steps
        call castbonds
        call flipclusters
        call measure
    enddo
    call writebindata(n,steps)
enddo
```

Generating bond configuration

subroutine castbonds

```
do b=0,2*n-1
  if (spin(bondspin(1,b))==spin(bondspin(2,b))) then
    if (ran()<=bprob) then
      bond(b)=.true.
    else
      bond(b)=.false.
    endif
  else
    bond(b)=.false.
  endif
enddo
```

Construct/flip clusters

notvisited(s) = .true. for spins not yet visited

notvisited(s) = .false. for spin that have been visited

subroutine flipclusters

```
notvisited(:)=.true.
```

```
cseed=0
```

```
1 if (ran())<0.5d0) then
```

```
    flipclus=.true.
```

```
else
```

```
    flipclus=.false.
```

```
endif
```

```
notvisited(cseed)=.false.
```

```
if (flipclus) spin(cseed)=-spin(cseed)
```

```
nstack=1
```

```
stack(1)=cseed
```

```
.....
```

```

do
  if (nstack==0) exit
  s0=stack(nstack)
  nstack=nstack-1
  do i=1,nbors
    s1=neighbor(i,s0)
    if (bond(spinbond(i,s0)).and.notvisited(s1)) then
      notvisited(s1)=.false.
      if (flipclus) spin(s1)=-spin(s1)
      nstack=nstack+1
      stack(nstack)=s1
    endif
  enddo
enddo

do i=cseed+1,n-1      ! find starting spin
  if (notvisited(i)) then ! for the next cluster
    cseed=i
    goto 1
  endif
enddo

```