

# Density Matrices

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## Abstract

The following report is intended to explain a computational approach to study the eigenvalues behaviour of the Hamiltonian of N interacting particles with spin 1/2 in a one-dimensional lattice.

## 1 Theory

The Hamiltonian of this Ising model is:

$$\mathcal{H} = \sum_i^N \sigma_z^i + \lambda \sum_i^{N-1} \sigma_x^i \sigma_x^{i+1}$$

We note that the operators written in the previous equation can be fully written as:

$$\mathcal{H} = \sigma_z^1 \otimes \mathbb{1}^2 \otimes \dots \otimes \mathbb{1}^N + \dots + \mathbb{1}^1 \otimes \dots \otimes \mathbb{1}^{N-1} \otimes \sigma_z^N + \lambda \cdot (\sigma_x^1 \otimes \sigma_x^2 \otimes \dots \otimes \mathbb{1}^N + \mathbb{1}^1 \otimes \dots \otimes \sigma_x^{N-1} \otimes \sigma_x^N)$$

Indeed this fully expanded form respects the dimensionality of our Hamiltonian which is  $2^N$ . As we can see the system qubits are subject to nearest neighbor interaction in a one-dimensional lattice.

We proceed in computing such Hamiltonian diagonalize it to take a look at the behaviour of its eigenvalues.

## 2 Code Development

First thing one should do it to calculate the hamiltonian of the system. As stated before, the crucial point is that each term has to be calculated as a tensor product of N operators, yielding  $2^N \times 2^N$  matrices.

### 2.1 Tensor product routine

Here we show the implementation of the generic tensor product between two operators.

```
1 function tensor_product(A, B) result(M)
2   type(cmatrix) :: A, B, M
3   integer :: ii, jj, kk, qq
4
5   call allocate_cmatrix(M, A%dim(1)*B%dim(1), A%dim(1)*B%dim(1))
6   do ii=1, B%dim(1)
7     do jj=1, B%dim(2)
8       do kk=1, A%dim(1)
9         do qq=1, A%dim(2)
10            M%elem(kk+(ii-1)*A%dim(1), qq+(jj-1)*A%dim(2)) = B%elem(ii, jj)*A%elem(kk, qq)
11        end do
12      end do
13    end do
14  end do
```

```
15 end function
```

Then the generic tensor product was used to construct the two types of operators we need, the external field interaction and the pair interaction one.

## 2.2 External field operators

```
1  function field_interaction_op(mat, index, N) result(self)
2      type(cmatrix) :: mat, self, idn, temp
3      integer :: index, ii, N
4
5      ! Generate identity matrix
6      call allocate_cmatrix(idn, mat%dim(1), mat%dim(2))
7      idn%elem=0.
8      do ii=1, mat%dim(1)
9          idn%elem(ii, ii) = 1.
10     end do
11
12     ! Construct the actual operator
13     call allocate_cmatrix(self, mat%dim(1), mat%dim(2))
14
15     if (index==1) then
16         self%elem = mat%elem
17     else
18         self%elem = idn%elem
19     end if
20
21     ! Perform tensor product
22     do ii=2, N
23         if (ii==index) then
24             temp = tensor_product(self, mat)
25         else
26             temp = tensor_product(self, idn)
27         end if
28
29         call deallocate_cmatrix(self)
30         call allocate_cmatrix(self, mat%dim(1)**ii, mat%dim(2)**ii)
31
32         self%elem = temp%elem
33         call deallocate_cmatrix(temp)
34     end do
35 end function
```

This function constructs the  $2^N$  size external field operator by performing the tensor products among the identities and the particle Pauli matrix in position defined by the value of **index**.

## 2.3 Pair interaction

The following routine computes the pair interaction operator with a similar approach.

```
1  function pair_interaction_op(mat, index1, index2, N) result(pair)
2      type(cmatrix) :: mat, pair, idn, temp
3      integer :: index1, index2, ii, N
4
5      ! Generate identity matrix
6      call allocate_cmatrix(idn, mat%dim(1), mat%dim(2))
7      idn%elem=0.
8      do ii=1, mat%dim(1)
9          idn%elem(ii, ii) = 1.
10     end do
11
12     call allocate_cmatrix(pair, mat%dim(1), mat%dim(2))
```

```

13
14     if (index1==1 .or. index2==1) then
15         pair%elem = mat%elem
16     else
17         pair%elem = idn%elem
18     end if
19
20     ! Perform tensor product
21     do ii=2, N
22         if (ii==index1 .or. ii==index2) then
23             temp = tensor_product(pair, mat)
24         else
25             temp = tensor_product(pair, idn)
26         end if
27
28         call deallocate_cmatrix(pair)
29         call allocate_cmatrix(pair, mat%dim(1)**ii, mat%dim(2)**ii)
30
31         pair%elem = temp%elem
32         call deallocate_cmatrix(temp)
33     end do
34 end function

```

## 2.4 Main program

In the following we report the main program.

```

1 PROGRAM main
2
3     use ising
4
5     implicit none
6
7     type(cmatrix) :: pauli_x, pauli_z, H, temp
8     double precision :: lambda
9     integer :: N, ii, jj, istat, l_resolution
10
11     ! Inputs!!!!!!
12     print*, "Enter the number of qbits (INTEGER NUMBER): "
13     read(*,*) N
14     lambda = 0.
15     l_resolution = 20
16
17     call allocate_cmatrix(pauli_x, 2, 2)
18     call allocate_cmatrix(pauli_z, 2, 2)
19
20     ! Initialize Pauli matrices
21     pauli_x%elem(1,1)=(0.,0.)
22     pauli_x%elem(1,2)=(1.,0.)
23     pauli_x%elem(2,1)=(1.,0.)
24     pauli_x%elem(2,2)=(0.,0.)
25
26     pauli_z%elem(1,1)=(1.,0.)
27     pauli_z%elem(1,2)=(0.,0.)
28     pauli_z%elem(2,1)=(0.,0.)
29     pauli_z%elem(2,2)=(-1.,0.)
30
31     open(unit=50, file="l_eigenvalues.txt", status="REPLACE")
32
33     do jj=1, l_resolution+1
34
35         print*, "Iteration with N=", N, "lambda=", lambda
36
37         ! Hamiltonian construction
38         call allocate_cmatrix(H, 2**N, 2**N, .TRUE.)

```

```

39      H%elem = 0.
40
41      do ii=1, N
42          temp = field_interaction_op(pauli_z, ii, N)
43
44          H%elem = H%elem + temp%elem
45          call deallocate_cmatrix(temp)
46      end do
47
48      do ii=1, N-1
49          temp = pair_interaction_op(pauli_x, ii, ii+1, N)
50
51          H%elem = H%elem + lambda*temp%elem
52          call deallocate_cmatrix(temp)
53      end do
54
55      ! CHECK HERMITIANITY
56      !H%adj = .adj.H
57      !call check_hermitianity(H)
58
59      call compute_eigenvals(H, H%eigenvals, H%eigenvects)
60
61      ! write to text file
62      write(50,*, iostat=istat) lambda, (H%eigenvals(ii), ii=1, 4)
63      if (istat /= 0) then
64          print*, "WARNING: —> Error in writing, shutting down..."
65          stop
66      end if
67
68      ! update lambda
69      lambda = lambda + 3./(FLOAT(l_resolution))
70      ! deallocate the old hamiltonian
71      call deallocate_cmatrix(H, .TRUE.)
72
73  end do
74
75  call deallocate_cmatrix(pauli_x)
76  call deallocate_cmatrix(pauli_z)
77
78  END PROGRAM

```

### 3 Results

The eigenvalues computation has been performed for several values of  $N$  taking 20 points for each of them spanning the interval  $[0, 3]$  for the values of  $\lambda$ . The values of the first 4 energy levels is stored in a .txt file at each iteration and in the following we report their behaviour.

The maximum number of particles which can be stored in memory is  $N = 15$  corresponding to a matrix of dimension  $32768 \times 32768$ .

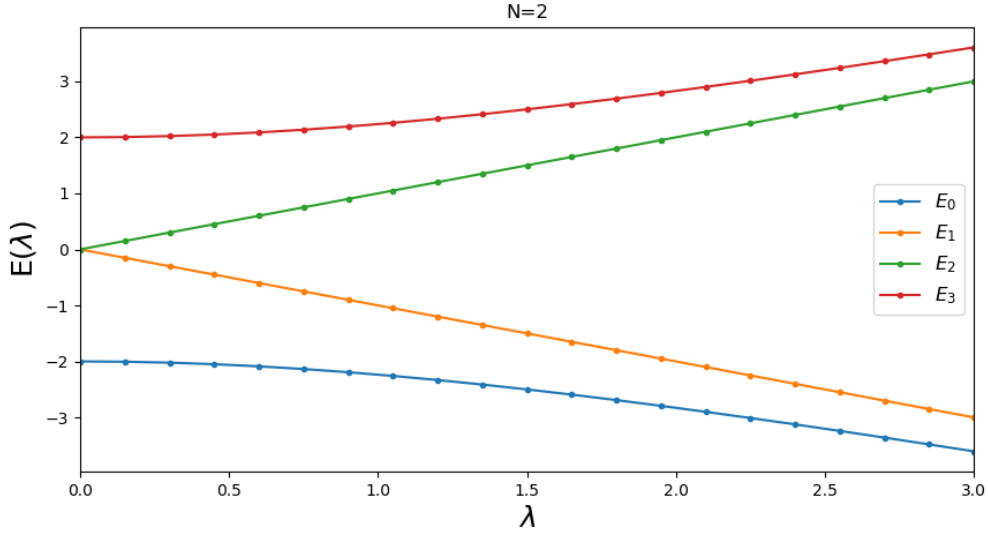


Figure 1: First 4 eigenvalues as a function of  $\lambda$

Here we can see that for  $\lambda = 0$  the system can assume three possible configuration. Indeed, the ground state has energy -2 corresponding to both spin down configuration while the highest one corresponding to both spins up has energy +2. The middle eigenvalues are degenerate which underlines the symmetry of the non-interacting system.

The insertion of the pair interaction splits the energy levels and removes the degeneracy.

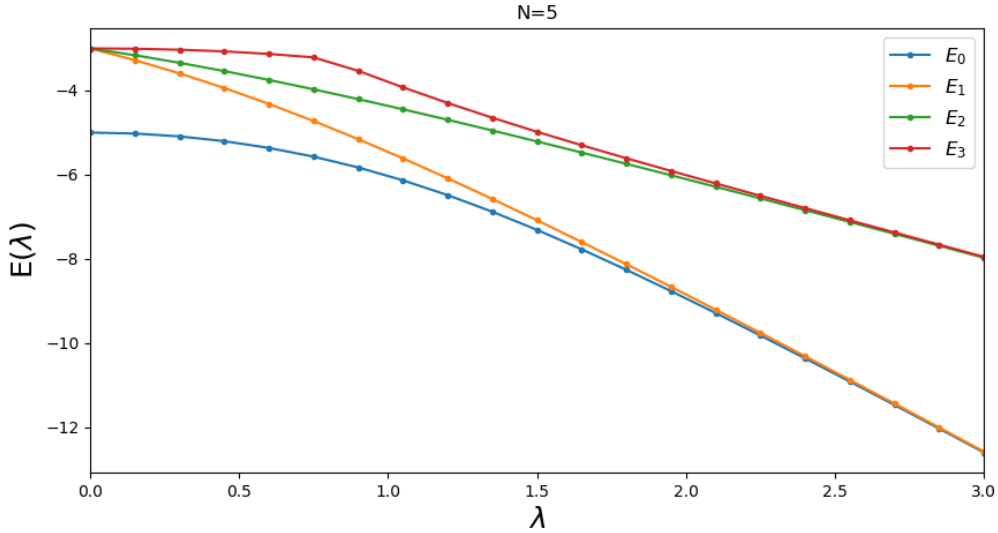


Figure 2: First 4 eigenvalues as a function of  $\lambda$

Here we can see a different behaviour. The ground state has energy equal to -N as expected (for  $\lambda = 0$ ), however the degeneracy here is restored and all energy levels assume a linear behaviour after a certain value of  $\lambda$ . A similar trend is shown for higher values of  $N$ .

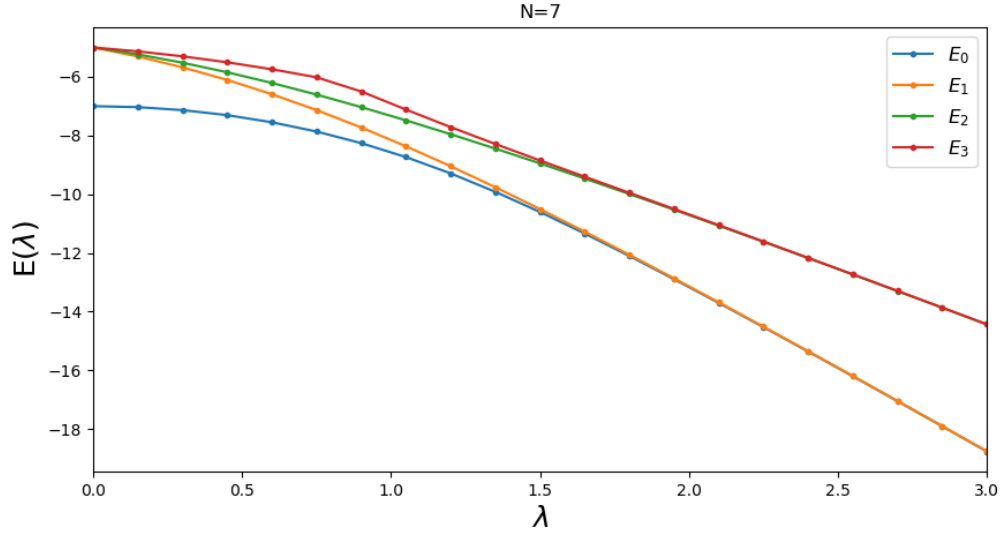


Figure 3: First 4 eigenvalues as a function of  $\lambda$

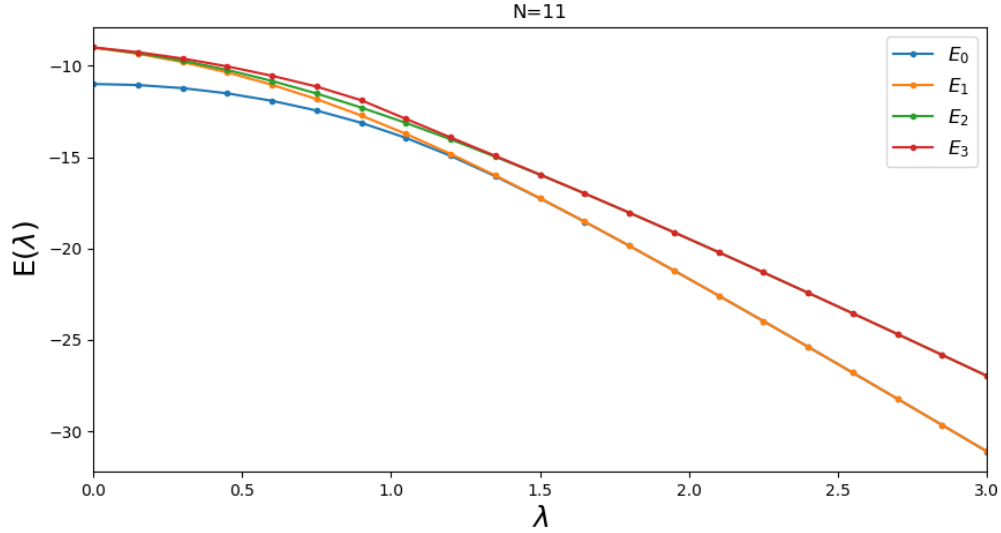


Figure 4: First 4 eigenvalues as a function of  $\lambda$

We conclude that for the case in which  $\lambda = 0$  the energy levels fit the possible configurations of the system. For growing values of  $\lambda$  the eigenvalues show a strange behaviour which might be due to a phase transition of the system when a certain threshold is reached, in fact the behaviour becomes linear. However, the change of the actual threshold depending on the value of  $N$  is probably due to the computational discretization since it should not depend on the number of particles considered.

## 4 Self-evaluation

The code implemented shows very big computational limitations of the method since the average number of particles which can be simulated is very low ( $\simeq 12$  depending on the available memory size). The shifting threshold of the lambda value needs some further theoretical analysis.