

# Quantum Ising Model

## Abstract

In this assignment a quantum system composed by  $N$  particles of spin  $1/2$  in a one-dimensional lattice is considered. This system is described by an Ising Hamiltonian. We are asked to write the matrix representation of the given Hamiltonian and then to diagonalize it, varying  $N$ . At the end the spectrum including the first 5 energy levels ( $k=5$ ) is analyzed.

## Theory

The system composed by  $N$  spin- $1/2$  particles is described by the following Hamiltonian:

$$\hat{H} = \lambda \sum_{i=1}^N \sigma_z^i + \sum_{i=1}^{N-1} \sigma_x^i \sigma_x^{i+1} \quad (1)$$

where the  $\sigma$ s are the Pauli matrices and  $\lambda$  is the interaction strength, considered  $\lambda \in [0,3]$ . The Pauli matrices (in the z-basis) are:

$$\sigma_z = \begin{pmatrix} 1 & 0 \\ 0 & -1 \end{pmatrix} \quad \sigma_x = \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix} \quad (2)$$

To compute the matrix representation of this Hamiltonian, we have to define the Hilbert space  $\mathcal{H} = \bigotimes_{i=1}^N \mathcal{H}_i$  where  $\mathcal{H}_i$  is the Hilbert space of the  $i$ -th site. The dimension of this  $\mathcal{H}$  is  $2^N$ . On the contrary the terms that composed our Hamiltonian are not defined on a space of dimension  $2^N$ , since each Pauli matrix acts on a Hilbert space of dimension 2. Moreover each term acts on its respective subsystem.

The given Hamiltonian can be splitted in

- Diagonal part  $\lambda \sum_{i=1}^N \sigma_z^i$

This term is diagonal in the z-basis and the  $i$ -th term in the sum can be written as

$$\bigotimes_{j=1}^i \mathbb{1}_2 \otimes \sigma_z^i \otimes \bigotimes_{j=i+1}^N \mathbb{1}_2 \quad (3)$$

- Interaction term  $\sum_{i=1}^{N-1} \sigma_x^i \sigma_x^{i+1}$

Each term of the summation is a tensor product of two matrices

$$\sigma_x \otimes \sigma_x = \begin{pmatrix} 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 0 \\ 0 & 1 & 0 & 0 \\ 1 & 0 & 0 & 0 \end{pmatrix} \quad (4)$$

The system is not separable. One can use *Mean-Field* approximation to estimate the energies. It holds:

$$E[\psi_{MF}] = \langle \psi_{MF} | \hat{H} | \psi_{MF} \rangle = \lambda \sum_{j=1}^N \langle \psi_{MF} | \sigma_z^j | \psi_{MF} \rangle + \sum_{j=1}^{N-1} \langle \psi_{MF} | \sigma_x^j | \psi_{MF} \rangle^2 \quad (5)$$

When  $N \rightarrow \infty$

$$e[\psi] = \frac{E[\psi]}{N} \xrightarrow{N \rightarrow \infty} \lambda \langle \psi_{MF} | \sigma_z | \psi_{MF} \rangle + \langle \psi_{MF} | \sigma_x | \psi_{MF} \rangle^2 \quad (6)$$

This quantity has to be minimized to find the ground state of the system. The result is the following:

$$e = \begin{cases} -1 - \frac{\lambda^2}{4} & \lambda \in [-2, 2] \\ -|\lambda| & \lambda \notin [-2, 2] \end{cases} \quad (7)$$

## Code development

Firstly two MODULEs are included

- The usual MODULE 'DEBUGMOD', used also in previous exercises, to debug a generic code
- The 'OPER' MODULE, that contains a function to do the tensor product of the two matrices given as input.

```

1  FUNCTION TENSOR_PROD(m_1, m_2)
2      ! This function takes as input two matrices
3      ! and does the tensor product
4      IMPLICIT NONE
5
6      COMPLEX*16, DIMENSION(:, :) :: m_1, m_2
7      COMPLEX*16, DIMENSION(SIZE(m_1,1)*SIZE(m_2,1), SIZE(m_1,2)*SIZE(m_2,2)) ::
8      TENSOR_PROD
9      INTEGER*8 :: ii, jj, left_r, left_c, right_r, right_c
10
11      left_r = SIZE(m_1,1)
12      left_c = SIZE(m_1,2)
13
14      right_r = SIZE(m_2,1)
15      right_c = SIZE(m_2,2)
16
17      DO ii=0, left_r-1
18          DO jj=0, left_c-1
19              TENSOR_PROD(ii*right_r+1:(ii+1)*right_r, jj*right_c+1:(jj+1)*right_c) =
20              m_1(ii+1, jj+1)*m_2(:, :)
21          END DO
22      END DO
23
24      RETURN
25  END FUNCTION TENSOR_PROD

```

Listing 1: Function to perform the tensor product

Moreover, at each run the program asks the user the number of particles  $N$  and the dimension  $d$  of the subsystems. The aforementioned MODULE 'DEBUGMOD', activated if the logical flag 'debug\_flag' is set to TRUE, is used to check if the inserted quantities are positive, otherwise a warning message is printed.

```

1  CALL DEBUG(debug_flag, d, d < 0, 'Insert a positive dimension')
2  CALL DEBUG(debug_flag, N, N < 0, 'Insert a positive number of particle')

```

Listing 2: DEBUG check

In the main PROGRAM, called Ex9, the Hamiltonian is evaluated considering separately the two parts, the diagonal part, called  $H_{\text{nonint}}$  in the code, and the interaction term, called  $H_{\text{int}}$ . Both are initialized as matrices of dimension  $d^N \times d^N$ . The first part, since it includes a diagonal matrix, is simply evaluated as a vector, then shaped in matrix form. The interesting part concerns the computation of the interaction term, in which we have to evaluate  $N-1$  tensor products. Recall that the first one is easy to evaluate, it is the one in the **Theory** section. As the listing 3 shows, a 'container matrix', allocated with the same dimension of  $H_{\text{int}}$  is used to perform the computation, that includes the previous defined function TENSOR\_PROD.

```

1  ! interaction terms (that are N-1)
2  DO ii=1, N-1
3
4      container = 0
5
6      DO jj=1, N
7
8          IF (jj.EQ.1) THEN
9
10             IF (((N+1-jj).EQ.ii).OR.((N+1-jj).EQ.(ii+1))) THEN
11                 container(1:d**(jj), 1:d**(jj)) = sigma_x(:, :)
12             ELSE
13                 container(1:d**(jj), 1:d**(jj)) = id_2(:, :)
14             END IF
15         ELSE
16             ELSE
17         END DO
18     END DO

```

```

19      IF ((N+1-jj).EQ.ii).OR.((N+1-jj).EQ.(ii+1)) THEN
20          container(1:d**(jj),1:d**(jj)) = TENSOR_PROD(sigma_x, container(1:d**(
                jj-1),1:d**(jj-1) ))
21
22      ELSE
23          container(1:d**(jj),1:d**(jj)) = TENSOR_PROD(id_2, container(1:d**(jj
                -1),1:d**(jj-1) ))
24
25      END IF
26  END IF
27  END DO
28
29  H_int(:, :) = H_int(:, :) + container(:, :) ! Update the interaction term

```

Listing 3: Evaluation of the interaction term

I have chosen to perform 15 iterations (15 values of  $\lambda$ ), with  $\lambda$  calculated according to the following rule

$$\lambda = \frac{3}{14} * i \quad (8)$$

in a loop with  $i = 0, 14$ . Recall that  $\lambda \in [0, 3]$ .

The whole Hamiltonian is then diagonalized, using ZHEEV subroutine provided by LAPACK. The documentation can be found at the following link <sup>1</sup>. At the end a matrix of dimension 15x6 is printed on a file, called `lambda_eigenvalues.txt`. In the first column it contains the values of  $\lambda$  and in the other 5 columns the corresponding eigenvalues, so we have the first 5 energy levels. The results are plotted through the GNUPLLOT script 'plot.gnu', for different values of  $N$ . The plots are shown in the following section.

## Results

The maximum value for the number of particles  $N_{max}$  that can be reached is  $N=12$ . For higher numbers the terminal gives a memory error, the system is not able to allocate the objects. This is linked to the RAM available in my laptop.

In the following, the graphs of the first 5 energy levels ( $k=5$ ) vs  $\lambda$  are shown. The dimension of the subsystems,  $d$ , is fixed to 2 while  $N$  varies. In the plots also the theoretical values, obtained from equation (7) are shown. To compare the solutions given by the program with the theoretical ones, the eigenvalues are divided by  $N$ , so in the y axis there is  $E/N$ . However for  $\lambda = 0$  would be more correct normalize with respect to  $N - 1$ , since there are only  $N - 1$  tensor products. This detail can be neglected if we consider that the theoretical result is obtained in the thermodynamic limit,  $N \rightarrow \infty$ . For  $N = 2$  the 5th energy level is zero as expected, since we have only two particles.

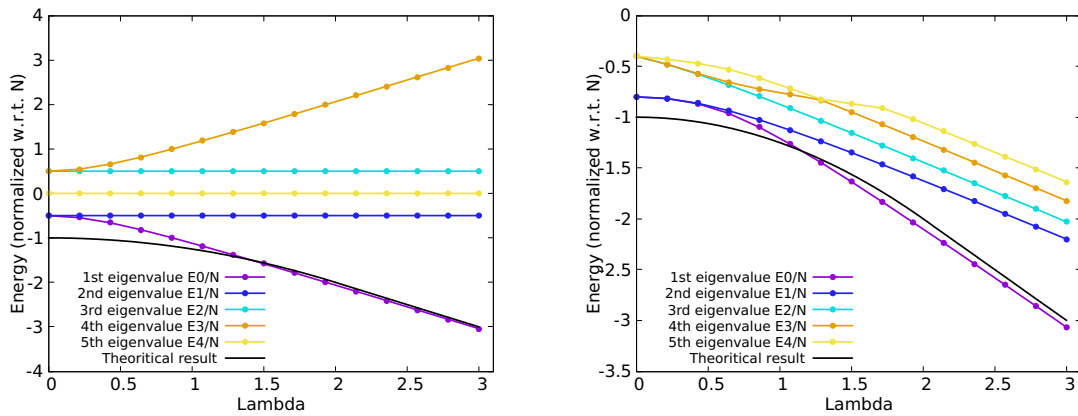


Figure 1: Plot of the first 5 energy levels vs  $\lambda$  with the theoretical result, for  $N=2$  (left) and  $N=5$  (right).

<sup>1</sup>[http://www.netlib.org/lapack/explore-html/df/d9a/group\\_\\_complex16\\_h\\_eeigen\\_gaf23fb5b3ae38072ef4890ba43d5cfea2.html#gaf23fb5b3ae38072ef4890ba43d5cfea2](http://www.netlib.org/lapack/explore-html/df/d9a/group__complex16_h_eeigen_gaf23fb5b3ae38072ef4890ba43d5cfea2.html#gaf23fb5b3ae38072ef4890ba43d5cfea2)

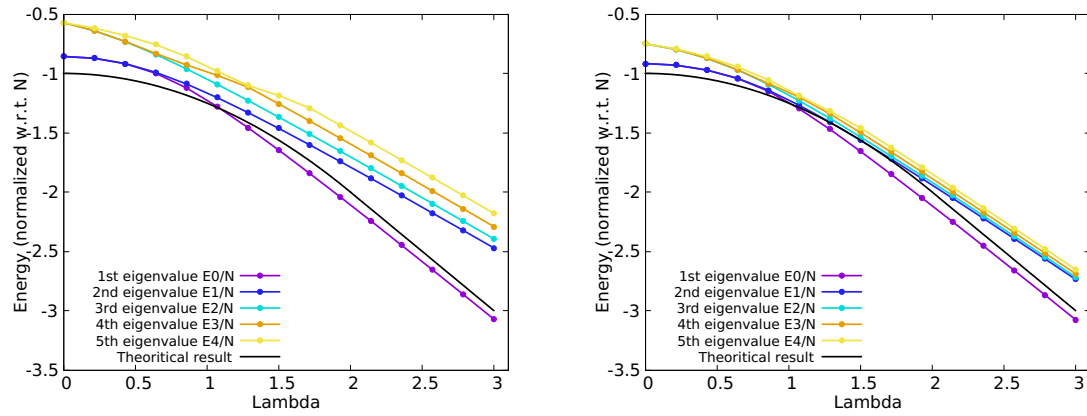


Figure 2: Plot of the first 5 energy levels vs  $\lambda$  with the theoretical result, for  $N=7$  (left) and  $N_{max} = 12$

One can note that the eigenvalues have a negative sign. This fact has no physical meaning since energy is defined up to a constant. At the ground state, corresponding to  $\lambda = 0$ , all the figures show a double degeneration. Physically  $\lambda$  represent the external field and if it is absent along the z-axis, the spins are aligned according to the x-axis. Moreover, at a certain point, close to  $\lambda = 1$ , the second eigenvalue (blue curve) tends to move away from the first one (purple curve) and cluster with the others. Indeed, for values of  $\lambda > 1$  the theory states there is a quantum phase transition, while the *Mean Field* result predicts that this phase transition happens when  $\lambda = 2$ . Ideally, as  $N$  increases, the spectrum tends to become continuous.

## Self-Evaluation

In this exercise I learned how to treat a composite quantum system described by an Ising Hamiltonian. Moreover I made a sense on how Hamiltonian's features reflect on the spectrum. In particular that when we look at the spectrum in function of  $\lambda$  a quantum phase transition happens. The work could be improved, maybe using a subroutine or something *ad hoc* ('built in') to perform the tensor product.