# Quantum Physics: Illustration of Multidimensional Green Functions Using Julia Language

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# Abstract

In this article, the numerical level representation of imaginary time Green's functions based on a low rank decomposition of the discrete Lehmann spectral representation (DLR) using an effective spectral density has been presented with illustrative efficiency. The DLR basis consists of a collection of exponentials chosen by interpolation decomposition to ensure stable and efficient recovery of imaginary time Green functions or Matsubara frequency samples (Kaye et al., 2022). This implementation to fit behavior of a low-temperature spinless free fermionics-electron gas quantum system requires much fewer degrees of freedom for the standard discretizations. The basic functions of DLR are explicit; carefully chosen to ensure a stable and accurate

approach, simplifying standard operations. Importantly, the function can be explicitly transformed to the Matsubara frequency domain or obtained directly by interpolation on a Matsubara frequency grid.

Keywords: Green function, DLR, Matsubara frequency, Quantum system, Electron gas, fermionics.

# **1. INTRODUCTION**

Lately, an evident cooperation between mathematicians and physicists has intensified to levels never seen before, in similarities of interaction equivalent to the time of Einstein. This cooperation and enthusiasm have focused on sustainable contributions to the development of unified theories that reconcile two great physical ideas of the twentieth century, specifically to the topics of studies in relativity and quantum field theory, underlying all observed forces and elementary particles.

Obviously, this contribution shows the study of the part concerning quantum theory, whose benefit in understanding has been related in an essential way with the implementation of the new and emerging mathematical machinery; at this point, it refers to the implementation of the Julia and Python programming languages for the implicit understanding of mathematical and physical aspects. While their separate motivations and powerful technologies remain, they have surprisingly revitalized and transformed each other, so in both realms they can be combined to address profound applications of these programming languages across a wide range of physical theories, from elementary particles to cosmology. (Besard et al., 2017) (Tosta et al., 2019)

In this vein, this article addresses the illustration by means of the programming software Julia lying in evaluating the Green's function of a single-level quantum system full of spinless fermionic particles, assuming that such a system could exchange particles and energy with the environment, so that its equilibrium state is a large canonical set. The following illustration is based on the Green function of a gas with free electrons (Ar. Abanov et al., 2022) (By Tullio, et al., 2019); and finally, the Green function of a free spin Fermi gas in a square lattice is calculated. (Kaye et al., 2022)

Incondensed matter physics, the Matsubara Green function technique is a powerful tool for studying the physics of many bodies in strongly correlated systems. In practical calculations, the data of Green's function is stored in the computer's memory. When the Green function is represented in the (Chikano et al., 2019) Matsubara frequency domain  $G(i\omega_n)$ , it exhibits a power law decay at high frequencies. Therefore, the number of Matsubara frequencies required to represent grows rapidly with decreasing temperature. Especially when the Green

function has other indices such as spin, orbit and wavenumber, the data becomes hugeG( $i\omega_n$ )G( $i\omega_n$ )at low temperatures. Therefore, there is a great demand for a compact representation of the imaginary time dependence of Green's function on practical calculations. (Chikano et al., 2019)

In essence, this Green function allows descriptions to be made between two or more events in spacetime. Since the advantage is focused on the use of the specific package in Julia (GreenFunc.jl), which has allowed the definition between three feasible alternatives for the construction of temporary meshes (MeshArray), essential to perform the approach in the implementation of the Green's function of a body.

# 2. Materials and Methods

This scientific article has been developed using the documentary methodology at the descriptive level on the Green's function of imaginary time based on a low-range decomposition of the discrete Lehmann spectral representation (DLR) using an effective spectral methodical bibliographic selection was density. Therefore, the implemented with the systematic review of articles that develop scientific contributions on the aforementioned line of research, the above with support in scientific publications through the use of metaanalysis in reliable sources, such as: Medline, Scopus, Springer, Elsevier ; assuming as a reference criterion for selection of articles, the relevance in scientific contribution of the last 20 years for publications, through critical extraction and content analysis of the information obtained, in order to illustrate the reliability in the empirical implementation through the implementation of algorithms in Julia.

## 3. Theoretical aspects

Lehmann discrete presentation (DLR) in the Matsubara frequency domain

A DLR can be transformed to the Matsubara frequency with analytic domain. According to Kaye et al. (2022), is established based on the following equation, such that:

$$k(iv_n,\omega) = \int_0^1 k(\tau,\omega) e^{-iv_n^{\tau}} d\tau = \frac{1}{(\omega+iv_n)}$$
(1)

Con Matsubara frequency points:

 $i\omega_n = \begin{cases} i(2n+1)\pi \text{ para funciones fermiónicas de Green} \\ i2n\pi \text{ para las funciones bosónicas de Green} \end{cases}$ 

Being an expansion of DLR, the following representation:

$$G(\tau) = \sum_{l=1}^{r} k(\tau, \omega_l) \hat{g}_l \tag{2}$$

Thus, the Matsubara frequency domain is transformed as:

$$G(i\omega_n) = \sum_{l=1}^r k(i\nu_n, \omega_l)\hat{g}_l \tag{3}$$

Transformation between imaginary time and Matsubara frequency domains

The DLR coefficients for the representation of a given Green's function in imaginary time and the Matsubara frequency domains are the same; where it simply takes the Fourier transform of the DLR in imaginary time using explicitly (1) to obtain the DLR in Matsubara frequency and inverts the transform explicitly to go in the opposite direction. Thus, having obtained DLR coefficients for a Green function, the representation can be evaluated in any domain. (Kaye et al., 2022)

# 4. Illustration through Julia Language

4.1. Illustration of the Green's function of a level

The first step in the illustration must be to define the structure of the data using MeshArray to present the Green function of a quantum system of a singlelevel full of spinless fermionic particles. (Beenakker et al., 2004; Gigena et al., 2020; Tosta et al., 2019) With a priori conjecture that the system could exchange particles and energy with the environment, so that its equilibrium state is a largecanonical conjunct (Ar. Abanov et al., 2022; Gigena, et al., 2021; Wenhu et al., 2017). The Green function of a particle hasa simple form in the Matsubara frequency representation: (Schüler and Pavlyukh, 2018)

$$G(i\omega_n) = \frac{1}{(i\omega_n - E)} \tag{4}$$

Where:E it is the level of energy. Then, for illustrative purposes, they are generated and manipulated with the following programming code (See Figure 1) to execute Green's function

# Figure 1. Definition of the structure of the data matrix and definition of the Green function.

# using GreenFunc β = 100.0; E = 1.0 # inverse temperature and the level energy ω<sub>n</sub>\_mesh = MeshGrids.ImFreq(100.0, FERMION; Euv = 100E) # UV energy cutoff is 100 times larger than the level energy Gn = MeshArray(ω<sub>n</sub>\_mesh; dtype=ComplexF64); # Green's function defined on the ω<sub>n</sub>\_mesh for (n, ω<sub>h</sub>) in enumerate(Gn.mesh[1]) Gn[n] = 1/(ω<sub>n</sub>\*im - E) end

Green's function numerically describes the correlations between two or more spacetime events. The space-time continuum needs to be discretized into spatial and temporal meshes. This example demonstrates how to define a Green function of a body in a temporal mesh. The package provides three types of temporal meshes: imaginary time grid, Matsubara frequency grid, and (Chikano et al., 2018; By Tullio, 2021) Lehmann discrete representation grid (DLR). The latter provides a generic compressed representation for Green functions (how to use DLR will be shown later ). As a result, the ImTime, ImFreq, and DLRFreq methods can be created. So it is required to specify the reverse temperature, whether the particle is fermion or boson (defined using the Fermion or Boson constant). Internally, a set of non-uniform grid points optimized for the given reverse temperature and cut-off energy with the given parameters will be created.

Once the meshes are created, you can define a MeshArray function on top of them to represent the Green Gn function. It should be noted that one can through MeshArray taker a set of meshes and initialize a multidimensional matrix, where eachmesh corresponds to a dimension of the matrix. The MeshArray data type is specified by the argument using the optional keyword dtype, which is set to Float64 by default. You can access meshes (stored as a tuple) with Gn.mesh and array data with Gn.data.

By default, Gn.data is left undefined if you do not specify it in the programming line. To initialize it, you can use the optional keyword argument data or use the iterating interface of the meshes and the MeshArray.





4.2. Illustration of Green's function for free electron gas

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In this case study, we show how to create a Green function of a gas of free electrons. Unlike the spinless fermionic particle, the electron is a particle of spin 1/2, so it has two internal states. In free space it has a kinetic energy (By Tullio, et al., 2019):

$$\epsilon_q = q^2 - E \tag{5}$$

Drive is used 
$$m_e = \frac{1}{2}$$
 )

Green's function, in the frequency space of Matsubara, is given by the following equation:

$$G_n = G_{\sigma_1,\sigma_2}(q,i\omega_n) = \frac{1}{i\omega_n - \epsilon_q}$$
(6)

Donde denotes the spins of the incoming and outgoing electron in the propagator.  $\sigma_{i}$ The Matsubara frequency grid in the first illustration is shown (See Figure 1). It shows how the CompositeGrids package should be used to generate the momentum grids and how to handle the multiple internal states andmeshes generated by the MeshArray function.

# Figure 3. Green's function of a discrete internal state free electron gas 2x2



Various types of grids can be generated with the CompositeGrids package. This SimpleGrid module provides several basic grids, such as uniform grids and logarithmically dense grids. The method implementation (Uniform) generates a linearly spaced 1D grid. It is necessary to specify the number of points in the N grid and the contour points [min, max]. Also, arbitrary numbers can be combined with the SimpleGrid module for sub-grids with a user-specified pattern definedby a grid panel file.

By using MeshArray, it can take any iterable object as one of its meshes. Therefore, for discrete internal states such as spins, one can simply use 1:2, which is a UnitRange{Int64}object.

4.3. Illustration of the Green function for a Hubbard network

This illustration begins, on how to generate a multidimensional Green function in a Brillouin Zone mesh. (Rubtsov et al., 2008). The Green's function of a spinless free Fermi gas in a square lattice is calculated.

It has atight junction dispersion (Essler et al., 2005):

$$\epsilon_q = -2t(\cos(q_x) + \cos(q_y)) \tag{7}$$

Lwhat gives:

$$G_n(q,\omega_n) = \frac{1}{i\omega_n - \epsilon_q} \tag{8}$$

The impulse is defined in the first Brillouin zone captured by a 2D k-mesh.

The dimension of these matrices defined as 2D, becomes manageable by the speed of Julia to simulate systems with fixed number of particles in the corresponding sube space, which must allow to reach dimensions much higher than defining an entire space. (Kaye et al., 2022)

#### Figure 4. Multidimensional Green function in a Brillouin Zone mesh

```
using GreenFunc
using GreenFunc: BrillouinZoneMeshes
DIM, nk = 2, 8
latvec = [1.0 0.0; 0.0 1.0] .* 2π
bzmesh = BrillouinZoneMeshes.BaseMesh.UniformMesh{DIM, nk}([0.0, 0.0], latvec)
w_mesh = ImFreq(10.0, FERMION)
g_freq = MeshArray(bzmesh, w_mesh; dtype=ComplexF64)
t = 1.0
for ind in eachindex(g_freq)
    q = g_freq.mesh[1][ind[1]]
    w_n = g_freq.mesh[2][ind[2]]
    g_freq[ind] = 1/(w_n*im - (-2*t*sum(cos.(q))))
end
```

For lattice systems with multidimensional Brillouin zone, momentum grids are generated internally with the BrillouinZoneMeshes.jl package. Here a UniformMesh{DIM,N}(origin, latvec) generates a linearly spaced momentum mesh in the first Brillouin zone defined by the origin and the given lattice vectors.

4.4. Illustration on the Fourier transform of the Green function with discrete Lehmann representation (DLR)

The compatible form based on the discrete representation of Lehmann (DLR) is developed in the Lehmann.jl package. , which provides a compact representation for the Green functions of a field . (Kaye et al., 2022)

At this point, we start from the numerical definition for temperature and a T level of precision, cassuming a generic Green function with only: basic functions labeled by a set of grid points of real frequency.  $\log(1/_T)\log(1/_{\epsilon})$ 

The above, to execute the fast Fourier transform and interpolation between imaginary time with Matsubara frequency representations (Using the Composite Grids.jl package.) with a  $\cos tO\left(log(1/_T)log(1/_{\epsilon})\right)$ .

In these terms, we proceed to illustrate in figure 4, how the Fourier transform based on DLR GreenFunc.jl can be realized between imaginary time and Matsubara frequency domains from one side to the other through the DLR representation. (Kaye et al., 2022)

Figure 5. DLR-based Fourier transform between imaginary time and Matsubara frequency domains



According to the command routine defined in Figure 5, we have proceeded to specify the parameters of the system: Tinverse emperature and the energy level, the length of the chain (See Figure 5)

Figure 6: The real (top panel) and imaginary (bottom panel) part of the larger Green function for  $\theta = \pi$  (left panel) and  $\theta = \pi/2$  (right panel).



The Green function at imaginary time, after the Fourier transform, must be consistent with the following analytic solution:

$$G_r = -\frac{e^{-r\epsilon_q}}{\left(1 + e^{-\beta\epsilon_q}\right)} \tag{9}$$

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For any Green function that has at least one imaginary-temporal mesh cell (ImTime, ImFreq, and DLRFreq), a set of operations ( to\_dlr, to\_imfreqy to\_imtime) is provided to connect the DLR space with theimaginary time and the Matsubara frequency space. By default, all these functions find in the dimension of the imaginary-temporal mesh within the meshes of Green functions and perform the transformation with respect to it. Alternatively, you can specify the dimension with the optional keyword argument dim. Even, care must be taken thatthe original version of DLRonly works with the Green's function of a single body.

Once a G\_dlr spectral density is obtained in DLR space, functions (to\_imfreq or to\_imtime) that employ methods can be used to reconstruct the Green's function in the corresponding space. By default, to\_imfreq and to\_imtime uses an optimized grid of imaginary time or Matsubara frequency of the DLR. (Kaye et al., 2022)An imaginary time target or Matsubara frequency grid can be assigned if necessary.

Combining to\_dlr, to\_imfreqy, to\_imtime must allowto go, both interpolation and Fourier transform. Since the spectral density G\_dlr, it can be reused whenever you tend to change the grid points of the Green function (usually through interpolation that loses more precision than the DLR transformation), it is recommended that you always keep the objects G\_dlr. In the case of not needingr the DLR Green intermediate function, the (Shinaoka et al. 2017.)operator can be used as |>shownin Figure 4 to make the Fourier transform directlybetween ImFreq and ImTime.

# 5. Discussion

The development of open source libraries has promoted, in recent years, many ideas and have establishedsolid foundations for future lines of research where the use of these computational tools prevails that emerges in a more democratic and efficient science. However, there are still many unexplored areas that would benefit fromsuch developments. Within these, quantum information with free electrons, fermions, Hubbard lattice and application of Fourier transform can be included, as developed in this article.

Additionally, the implementation of the GreenFunc.jl library under the Julia language is relevant since it represents a high-level language with very high speed, which is growing remarkably in the field of scientific computing. In addition, Julia has been chosen because it has a performance 100 times higher than Python in the same task, being also equal (Xiu-Zhe et al., 2020)or easier to read and write.

# 6. Conclusions

The magnetic properties of matter are essentially a consequence of electrons (free or bound), of their magnetic moments, where the study of the magnetic properties of an (ideal) gas of electrons is relevant in this context. Therefore, this article based on representing the operation of the open source library GreenFunc.il developed by different collaborators under the programming language Julia, was very useful as tools of numerical order to own to simulate free electron systems, Fermionics and spinless free Fermi gas systems. In addition, these tools are useful not only in the area of quantum information, but also in condensed matter, nanomaterials and quantum chemistry. Although, it should be noted that there are other fermionic libraries, such as OpenFermion; however, GreenFunc.jl was taken into consideration because it has a primarily orbital-based approach. In this sense, (Jarrod et al., 2020)Fermionic.jl defines fermionic operators for finite dimension as matrices, and states as vectors on which to operate, which is much more suitable for quantum information protocols. However, the greatest advantage of the library is the ability to work in systems(By Tullio, 2021) with fixed particle numbers.

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