PX 915: Variational Quantum Monte Carlo - LATIN GroupB

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Introduction

This software will compute and visualise the ground state energy of: H, H^{-1} , H_2^+ , H_2 , He^{+1} and He. This will be done through the use of the variational quantum Monte Carlo (VQMC) method. The main output result will be the minimum energy of the system and the resulting wavefunction.

The expected groundstates are:

With the exception of user input and results visualization which are done via Python, the code is written entirely in Fortran. To boost efficiency, parallelization has been implemented through OpenMP with regards to Latin hypercube sampling and Markov chain Monte Carlo integration.

Along with the software documentation, this site provides a Tutorial for installing and running this software and interpreting the results produced. Additionally, the general theory applied in these simulations are explained on the following pages:

- · Variational Quantum Monte Carlo
- Monte Carlo Integration
- · Latin Hypercube
- · Optimisation for a large parameter search-space

1.0.1 Github Repository

The code may be accessed and downloaded from GitHub.

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1.0.1.1 Fortran Packages Required

LAPack

1.0.1.2 Python Packages Required

- Numpy
- Matlplotlib
- Tkinter (for the GUI input interface)
- Netcdf

1.0.2 Authors

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Tutorial

This section describes everything needed to set up the code and run the code for simple systems contained in the tutorial.

- · Installing/Running the code
- Problem 1: Single atom and electron using Slater-type Orbitals
- · Problem 2: Single atom and electron using Gaussian-type Orbitals
- Problem 3: Two atoms and a single electron
- · Analyzing the results
- · User options beyond the tutorial
- · Future extensions

2.1 Installing/Running the code

This code is compiled and ran in the terminal. YOu can build the code by running the following command for the bash script:

./build_latin_driver.sh

After that has successfully compiled, you can now run the following command code to execute the bash program:

./run_latin_driver.sh

Then the following interface will appear as shown in the figure below. This interface contains all of the variables which the user can change to define the system they want to look at. The interface already contains default values for the variables which the user can keep or change if they wish.

In order to then run the code, the user just needs to change the varibales they wish to change and then click close. This will start running the code with the progress and results displayed in the terminal. When the code has finished running, the output plots will automatically be generated and show each plot in a different pop-up window.

To complete another run of the code, make sure that all the ouputting windows containing the plots are closed, and then re-run the ./run_latin_driver.sh command. There is no need to recompile the code.

In the case that the code fails to run or has crashed after this step, you can easily exit the software by either closing the terminal or using Ctrl+c.

In order to demonstrate the varying functionality of the code, 4 problems have been defined in the subsections below for the user to try. There maybe slight differences in the quoted results due to the sampling and approximate numerical nature of the code, but none of the examples should obtain results which stray far from the results quoted here.

To Improve the accuracy of any the simulations, try increasing the number of trials and the number of steps in the MCMC runs. For 2 electron problems try increasing the number of Jastrow terms from 7 to 9.

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2.1.1 Problem 1: Single atom and electron using Slater-type Orbitals

This part of the tutorial contains the most basic system consisting of 1 atom (nuclei) and 1 electron which represents a Hydrogen atom, and is described using Slater-type orbitals. In this example, the Slater-type orbitals provides the analytical result.

All the user has to do is close the user input window as this simulation run uses the default values already provided.

Once the user input window has been closed, the following outputs are printed in the terminal:

- · The user defined input values are printed for reference
- Each latin hypercube trial and its corresponding energy result is printed

If the code has ran with no errors or crashes, the following will be printed everytime:

- · The best latin hypercube trial
- · The minimum energy found in both Hartree and eV units
- The best parameters (this is the optimal degrees of freedom found)
- Comparison of output density statement
- · Success in writing output files results.nc4 and xyz.txt
- · Total cpu runtime
- · Total real runtime
- · Upload of result.nc4 successfully
- · Print of what is contained in the result.nc4 file
- · The number of electrons, atoms

The output plotting script will automatically run, producing the following contour plot of the electron probability density.

The minimum energy obtained for this system is -13.6 eV and -0.499 Hartree energy. The optimal degrees of freedom obtained is -1.42 and 0.997.

The code should take no longer than 3 seconds to run and complete.

2.1.2 Problem 2: Single atom and electron using Gaussian-type Orbitals

This problem is the same set up as the previous problem, however the user instead chooses Gaussian-type orbitals instead of Slater-type orbitals to describe the Hydrogen atom. Also, as the Gaussian-type orbitals only give an approximate result, the total number of steps for MCMC run is increased from 10000000 to 100000000.

This simulation results in the following contour plot as shown in the figure below for the electron probability density.

The energy obtained for this run is -11.8 eV and -0.434 Hartree energy. The energy results for this run may vary as it is an approximate result but the result the user obatins should not stray far from this value due to the increased MCMC steps.

This result is not far from the analytical result

Due to the higher number of MCMC steps defined, this code will take slightly longer than the run completed in Problem 1. The code should not take longer 30 seconds.

2.1.3 Problem 3: Two atoms and a single electron

This problem investigates two atoms (or nuclei) and a single electron system. This corresponds to the H2+ ion.

The output of this system not only produces a contour plot of the electron probability density, but also allows for the evaluation of energy for varying bond lengths.

To first obtain the contour plot, the user uses the same procedure as previously defined in running the scripts, keeping all of the defualt values except the number of atoms is being changed from 1 to 2. Slater-type orbitals are used. The following contour plot should be obtained.

The minimum energy found for this system should be approximately -0.55 Hartree or -15.2 eV.

This code run should take no more than 5 seconds to run.

In order to obtain the energy against varying bond length plot, the user must run the following commands in the terminal:

./build bond driver.sh

Then run

./run bond driver.sh

Which will present the user input interface used previously. The only thing the user needs to change is the number of atoms from 1 to 2. The difference with this run is that the contour plot will not be outputted, only the energy against varying bond length will be plotted. The resulting output plot is shown in the figure below.

In the terminal, when the code has finished running, the minimum energy and its corresponding bond length is outputted. For this example, the bond length with the minimum energy was found to be 2.09 atomic units, with -0.586 Hartree energy.

The bond length driver is currently a proof-of-concept. The parameters for the search over bond length are hard-coded, but can be changed on lines 168-170 of bond_driver.f90 file.

This code run should take no more than 75 seconds to fully run.

If the user wants to revert back to obtaining the contour plots, they will need to repeat the following commands in the terminal:

./build latin driver.sh

./run_latin_driver.sh

2.1.4 Problem 4: Helium+ ion and Helium atom

To simulate a Helium+ ion, 1 atom and 1 electron is simulated but the proton number is changed from 1 to 2, keeping all of the default variables the same for this case.

This results in the following contour plot for the electron density:

The minimum energy obtained is -1.87 Hartree energy or -50.9 eV. This is a good result when compared to expected value of -54.42 eV as the Slater-type orbitals uses hydrogen-like solutions. When using Gaussian-like orbitals, the resulting minimum energy found is -11.6 eV which does not agree well with the expected value.

For the Helium atom, the same procedure is done however the number of electrons is changed from 1 to 2 and the number of protons is changed from 1 to 2 from the default values.

The resulting minimum energy for the Helium atom for Slater-type orbitals was found to be -77.9 eV which is close to the expected value of -79.02 eV. When using Gaussian-like orbitals, the resulting minimum energy was found to be -69.5 eV which is slightly below the expected value, however as it only gives an approximate result, increasing the number of MCMC steps and latin hypercube trials should improve its accuracy.

For the 2 electron case, the contour plot for the resulting electron probability density will be outputted, however the results are wrong and should be ignored.

Using the default number of MCMC steps and latin hypercube trials, the runs should take no more 30 seconds to run each.

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2.1.5 User options beyond the tutorial

The user can change the following variables if they want to look at 1 atom only:

- · Number of electrons
- · Number of atoms
- · Number of trials for latin hypercube search
- · Number of MCMC steps
- Optional user inputs (either Slater-type or Gaussian-type orbitals)

To investigate 2 atoms, all of the variables defined in the user input interface are relevant.

2.1.6 Plotting Options

These variables allow the user to change aspects of the resulting output such as the domain size and the resolution.

- · Amount of distance away from atoms to plot
- · Number of points in each direction

Increasing these options will cause the code to take slightly longer to run but will obtain better resolution images as a result.

2.2 Analyzing the results

Results are saved using the subroutine create_netcdf and are automatically plotted using either the plotting.py script or the energy_plotting.py script.

Note the user does not actually need to have python or a python IDE open in order for the plotting to appear as it does so automatically through a pop up window. The user also has the option to save the resulting image by clicking the save button with is the button on the far right at the bottom of the window.

2.2.1 Warnings

If the following warning has appeared in the print statements in the terminal: WARNING: Acceptance rate 0 at: 1

The user can ignore this as the code will still run and produce an output. This error relates to an unsuitable initial condition, but unless this error appears later than step 1 then there is no problem, and the MCMC has corrected itself.

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2.3 Advanced Options

2.3.1 How to add a basis set

It is relatively easy to add a basis set to the program. Two new functions defining the corresponding single electron wavefunction and reduced hamiltonian must be added to basis_functions.f90, following the format of wave_function_slater_1s() and reduced_hamiltonian_slater_1s(). Pure subfunctions similar to centered_slater_1s_laplacian() can be added to component_functions.f90.

An integer code for the basis must be added to constants.f90. A corresponding check must be added to the case selection on basis_functions::basis_type in the initialisation routine (currently line 198 in basis_functions.f90). This must point the function pointers wave_function_single and reduced_hamiltonian to the new functions.

2.4 Future extensions

The following additions and extensions may be added to the code.

- · Diffusion Monte Carlo
- · Other elements

8 Tutorial

Variational Quantum Monte Carlo

This page provides a brief overview of the theory behind the variational quantum Monte Carlo method. The mathematics used in the software are then described in more detail such that a user may better understand how the functions and variables utilized within are related.

3.1 VQMC in a Nutshell

The variational quantum Monte Carlo method (VQMC) is a computational method for approximating the ground state energy of a system. More often than not, the time-independent Schrödinger equation of a system defined by the Hamiltonian \hat{H} may not be solved to determine the system's ground state energy E_{gs} . The variational principle from quantum mechanics provides that for any normalized function Ψ , we have

$$E_{qs} \le \langle \Psi | \hat{H} | \Psi \rangle \equiv \langle \hat{H} \rangle,$$
 (3.1)

i.e., the expected value of \hat{H} with an arbitrary Ψ will most likely overestimate E_{gs} , giving an upper bound for the ground state energy ?. It follows that E_{gs} may be estimated through testing trial functions across combinations of parameter values and selecting as the approximate ground state wave function the one parameterized with the values that minimize $\langle \hat{H} \rangle$.

The expected value of \hat{H} is given by the following integral

$$\begin{array}{l} \mathbf{1} \; \langle \hat{H} \rangle = \langle \Psi | \hat{H} | \Psi \rangle \\ = \int \Psi^* \hat{H} \Psi d\mathbf{r}_i, \end{array}$$

where \mathbf{r}_i are the positions of the electrons that Ψ depends on. Accordingly, the VQMC method derives its name from using Monte Carlo Integration techniques in evaluating this integral.

3.2 Software Specific Details

This software calculates the ground state energy of the H_2^+ ion and H_2 molecule using VQMC. The Hamiltonian is given by

$$2\hat{H}(\{\mathbf{r}_i\}, \{\mathbf{R}_I\})\Psi(\{\mathbf{r}_i\}) \equiv \left(-\frac{1}{2}\sum_i \nabla_i^2 + \sum_{i>j} \frac{1}{r_{ij}} - \sum_I \sum_i \frac{Z_I}{r_{iI}} + \sum_{I>J} \frac{Z_IZ_J}{r_{IJ}}\right)\Psi = E\Psi, \tag{3.2}$$

where the Born-Oppenheimer approximation is assumed and the units are given in Hartree atomic units. The problem specifies N_n nuclei of atomic number Z_I at coordinates \mathbf{R}_I and N electrons at coordinates \mathbf{r}_i where $r_{ij} = |\mathbf{r}_i - \mathbf{r}_j|$, $r_{iI} = |\mathbf{r}_i - \mathbf{R}_I|$ and $r_{IJ} = |\mathbf{r}_I - \mathbf{r}_J|$.

To apply a Monte Carlo integration method, specifically Markov chain Monte Carlo (MCMC) for this software, the integral given in equation (1) is rewritten as

$$3\langle \hat{H}_L \rangle_{|\Psi|^2} = \frac{\int |\Psi|^2 (\hat{H}\Psi)/\Psi d\{\mathbf{r}_i\}}{\int |\Psi|^2 d\mathbf{r}_i},\tag{3.3}$$

where $\hat{H}_L = \hat{H}\Psi/\Psi$ is the localized Hamiltonian.

3.2.1 Basis Set Construction

For computational feasibility, trial wave functions parametrized by a reasonably small number of coefficients should be constructed. The number of coefficients also defines the degrees of freedom of the system which is not to be confused with the dimension of the MCMC sample space of 3N.

The basis set $\{\phi_k\}_{k=1}^M$ may be chosen from numerous types of functions. This software utilizes atomic orbitals, e.g., Gaussians, Gaussians with additional properties or Hydrogen-like orbitals, that are centered on $\mathbf{0}$. A set $\{\phi_k^I(\mathbf{r}) = \phi_k(\mathbf{r} - \mathbf{R}_I)\}_{k=1}^M$ centered on each atom is then created followed by taking a union over all atoms and renumbering them to get the total basis set:

$$\{\varphi_k(\mathbf{r})\}_{k=1}^{N_n M} = \bigcup_I \{\phi_k^I(\mathbf{r})\}. \tag{3.4}$$

In the software, M is the parameter n_basis_functions_per_atom. For both slater-type basis functions and Gaussians there are 2 parameters per basis function, a linear multiplier and a length scale.

The basis sets in the code have the form, for an atom at the origin, with r the radial distance, α the length scale parameter and c the linear parameter:

Slater-1s:

$$\phi(\mathbf{r}) = c(\alpha^3/\pi)^{1/2} \exp(-\alpha r) \tag{3.5}$$

Sto-3g:

$$\phi(\mathbf{r}) = c(2\alpha/\pi)^{3/4} \exp(-\alpha r^2) \tag{3.6}$$

Single electron wave functions are obtained through summing the basis set in its entirety

$$\psi_i(\mathbf{r}) = \sum_{k=1}^{N_I M} c_{ik} \varphi_k(\mathbf{r}). \tag{3.7}$$

Using this as the trial wave function, i.e., $\Psi=\psi_1$, with MCMC algorithms and optimization schemes results in $2*N_n\times M$ degrees of freedom. As this is also a linear combination, the linearity of \hat{H} and analytic derivatives of the basis set may be used to speed up the calculation of

$$H\psi_1(\mathbf{r}) = \sum_k c_{ik} H\varphi_k(\mathbf{r}), \tag{3.8}$$

where $H\varphi_k(\mathbf{r})$ can be analytically precomputed for hydrogen-like orbitals or Gaussians.

For systems with more than one electron (N>1), the Slater determinant with Jastrow factor will be taken:

$$\Psi(\{\mathbf{r}_i\}) = e^{J(\{\mathbf{r}_i\})} D(\{\psi_i\}, \{\mathbf{r}_i\}), \tag{3.9}$$

$$D(\{\psi_i\}, \{\mathbf{r}_i\}) = \psi_1(\mathbf{r}_1)\psi_2(\mathbf{r}_1)\cdots\psi_N(\mathbf{r}_1)\psi_1(\mathbf{r}_2)\psi_2(\mathbf{r}_2)\cdots\psi_N(\mathbf{r}_2) \vdots \dot{\psi}_1(\mathbf{r}_N)\psi_2(\mathbf{r}_N)\cdots\psi_N(\mathbf{r}_N).$$
(3.10)

When utilized in full, the number of degrees of freedom (DOF) would be $2*M\times N_n\times N+N_J$ where N_J is the DOF in J. However, this can be significantly reduced by assuming that a single electron state $\{\psi_i\}$ is sufficient for the calculation, assuming the first 2 electron states differ only by spin: $\psi_1(\mathbf{r},\uparrow)=\psi_1(\mathbf{r})|\uparrow\rangle$, and $\psi_2=\psi_1|\downarrow\rangle$. Then this gives for 2 electrons:

$$D(\{\psi_i\}, \{\mathbf{r}_i\}) = \psi_1(\mathbf{r}_1)\psi_2(\mathbf{r}_2) - \psi_1(\mathbf{r}_2)\psi_2(\mathbf{r}_1) = \psi_1(\mathbf{r}_1)\psi_1(\mathbf{r}_2)(|\uparrow\rangle|\downarrow\rangle - |\downarrow\rangle|\uparrow\rangle) = \psi_1(\mathbf{r}_1)\psi_1(\mathbf{r}_2). \tag{3.11}$$

.

This is the expression used in the program and the number of degrees of freedom is only $2*M \times N_n + N_J$. While this significantly simplifies calculations, it means states where 2 electrons are in different states will not be found.

3.2.2 Jastrow Factor

The choice of Jastrow factor is never trivial. The CASINO code suggests using the DTN factor as one possibility ?. However, these are designed specifically for periodic systems which is not characteristic of the systems here. Adopting that of Boys and Handy [3,4] would be more suitable:

$$J(\{\mathbf{r}_i\}) = \sum_{I} \sum_{i < j} U_{Iij},$$
(3.12)

$$U_{Iij} = \sum_{k} \Delta(m_{kI}, n_{kI}) c_{kI} (\bar{r}_{iI}^{m_{kI}} \bar{r}_{jI}^{n_{kI}} + \bar{r}_{jI}^{m_{kI}} \bar{r}_{iI}^{n_{kI}}) \bar{r}_{ij}^{o_{kI}},$$
(3.13)

$$\bar{r}_{iI} = \frac{b_I r_{iI}}{1 + b_I r_{iI}},\tag{3.14}$$

$$\bar{r}_{ij} = \frac{d_I r_{ij}}{1 + d_I r_{ij}},$$
 (3.15)

$$\Delta(m,n) = 1 - 0.5\delta_{mn},\tag{3.16}$$

where (m,n,o) is a triple of integers, and including more increases the complexity of J. Furthermore, there are various cusp conditions that must be satisfied ?, which fixes the choice of these integers. The inverse length scales are assumed to be the same for all atoms, $b_I = b$, $d_I = d$, and we fix them rather than use them as dofs. This is also done with the dofs $c_{kI} = c_k$, so that N_J is the number of terms in the k sum in U_{Iij} .

Monte Carlo Integration

Monte Carlo (MC) integration is a class of numerical integration techniques having a stochastic-probabilistic nature as opposed to deterministic techniques such as Gaussian quadrature and trapezoidal integration ?. In general, the MC integration involves taking a simple region that encloses the region of integration, followed by generating random points from the simple region and counting the number of 'hits' or points that are from the integration region . Then in the 2D case, the integral would be evaluated by multiplying the fraction of points that are hits to the total area of the simple region. Thus, as more random points are generated, the integral will converge to the actual value.

This software utilizes the Markov chain Monte Carlo technique (MCMC), specifically Metropolis-Hastings method (see mcmc). Under the Metropolis algorithm, a Markov chain is generated from a proposed density function and moves are accepted/rejected based on a set rule or probability, leading to a probability distribution or final value ?. If $\mathcal{P}_i^{(n)}$ defines the probability of being in state i at step n then the algorithm is as follows:

- The next state j is sampled with probability $F_{i o j}$
- State j is accepted with probability $A_{i o j}$ whereby it is used as the next sample
- State j is rejected with probability $1-A_{i\to j}$ whereby state i is used as the next sample

With more samples, the properties of F and A become known, leading to $\mathcal{P}_i^{(n\to\infty)}\to p_i$ and thus, the method converges to the true distribution or desired value regardless of the initial state.

Latin Hypercube

When conducting a search for the optimal parameters, it is easy for the search space dimensions to grow geometrically large. Latin hypercube sampling is a method that creates random sets of parameters that sufficiently cover the search space through

- ullet Subdividing or stratifying each dimension of the search space into N equal regions
- ullet Selecting N points from the search space such that when they're projected onto any dimension, a region in that dimension has only a single point

As explained in **?**, this idea can be applied to a hypercube by first defining a set $\mathbf{X}=(X_1,X_2,\ldots,X_p)$ of p independent random variables. Dividing the domain of each X_j into N intervals allows N samples to be generated and creating N^p intervals. N+1 edges then define these intervals

$$\{F_j^{-1}(0), F_j^{-1}(\frac{2}{N}), \dots, F_j^{-1}(\frac{N-1}{N}), F_j^{-1}(N)\}.$$
 (5.1)

In order to generate a random set of parameters, a permutation matrix Π with size $N \times p$ and elements π_{ij} is defined whereby there are p different columns of randomly selected permutations of the integers $1, 2, \ldots, N$. The ith sample of dimension j may then be produced through evaluating

$$x_{ij} = F_j^{-1}(\frac{1}{N}(\pi_{ij} - 1 + u_{ij})), \tag{5.2}$$

where $u_{ij} \sim U(0,1)$, making the *i*th sample of **X**, $\mathbf{x}_i = (x_{i1}, \dots, x_{iN})$?.

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Optimisation for a large parameter search-space

6.1 Gaussian Process

Given that MCMC evaluations for a given set of points in parameter space can quickly become expensive, we are motivated to use a surrogate model that can be used when searching for the best possible set of parameters to trial. Here we present an approach, as detailed by Wang et al?, used to perform a Bayesian global optimisation.

We start by defining our prior distribution on our ground state calculation (as found using MCMC) as a Gaussian process:

$$1f(X) \sim \mathcal{GP}(\mu^{(0)}, \Sigma^{(0)}) \tag{6.1}$$

Where X is of set of points in parameter space, μ is our mean function which is represented as a constant, and Σ defines our covariance matrix which is induced by a Gaussian kernel. The posterior mean and covariance matrix are updated for a set of new points $x^{(1:n)}$ via:

$$2\mu^{(n)} = \mu^{(0)} + K(X, x^{(1:n)})K(x^{(1:n)}, x^{(1:n)})^{-1}(y^{(1:n)} - \mu(x^{(1:n)}))$$
(6.2)

$$3\Sigma^{(n)} = K(X,X) - K(X,x^{(1:n)})K(x^{(1:n)},x^{(1:n)})^{-1}K(x^{(1:n)},X)$$
(6.3)

Where $y^{(1:n)}$ is the value of the function being optimised at a given set of parameters, $\mu(x^{(1:n)})$ is obtained from the prior mean function across the new set, and the function K is computing the covariance (also Gaussian kernel) between each entry in X and $x^{(1:n)}$.

6.2 Optimisation of parameters

Given we have constructed a surrogate model we may evaluate a large set of test points through the expected improvement q-EI:

$$4q\text{-EI} = \mathbb{E}[\max_{i=0,...q} e_i[m(X) + C(X)Z]]$$
 (6.4)

Where e_i is a unit vector which acts as a selector across the other vectors m(X) and C(X)Z. The vector m(X) evaluates the difference between the previous best result and the posterior mean, Z is a vector containing samples

from a standard normal random vector, and C(X) contains the negative of the Cholesky decomposition of posterior covariance matrix. For the zeroth thread (i=0) both m(X) and C(X) are returned as 0. The stochastic gradient estimator of the expected improvement can then be constructed as:

$$5g(X,Z) = \{ \nabla h(X,Z), if \nabla h(X,Z) exists 0, otherwise \}$$
 (6.5)

where:

$$6h(X,Z) = \max_{i=0,\dots,q} e_i[m(X) + C(X)Z]$$
(6.6)

Following the algorithms outlined by S. P. Smith ? on the backward differentiation of Cholesky dependent functions one may find the derivatives to C(X) in the above with respect to each parameter. Differentiation over each parameter also needs to be computed for m(X) seperately and added into get the stochastic gradient estimator. From this we may evaluate a gradient estimate at point X_t as:

$$7G(X_t) = \frac{1}{M} \sum_{m=1}^{M} g(X_t, Z_{t,m})$$
(6.7)

Where M is a number of samples the stochastic gradient estimator is averaged over. From this we generate the next set of points in parameter space to test as:

$$8X_{t+1} = H\Pi[X_t + \epsilon_t G(X_t)] \tag{6.8}$$

Where $H\Pi$ defines the projection (back) into the allowed parameter space and ϵ_t defines a step size for the points in parameter to space to wander. The step size decrease as the simulation goes on.

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20 Acknowledgements

Modules Index

8.1 Modules List

Here is a list of all modules with brief descriptions:

basis_functions	
Wavefunction, hamiltonian and basis set choice	??
biased_optim	
Biased optimization subroutines and functions	??
calculations	
Function completing calculations of either the wavefunction or electron density (depending on the system) at a set of coordinates [x,y,0] on a grid of equally spaced points on a xy grid	??
component_functions	??
Basic subfunctions This module contains basic functions used in basis_functions.f90	
electron_density_functions Electron density function	??
energy_plotting	r
Script outputs the energy against the bond length	??
gp_surrogate	• •
Gaussian process surrogate submodules and functions	??
gradient estimator	•
Subroutines for obtaining a gradient estimation through Cholesky decomposition	??
init_params	
Python functions and scripts to obtain user input import sympy as sym	??
log_rho_mod	
Driver for testng the biased optimization routines	??
mcmc	
Functions and subroutines for implementing Markov chain Monte Carlo	??
param_search	
Functions/subroutines associated with building/initialisation the parameter search space and finding the best parameters from a given MCMC run	??
plotting	
Main plotting script which outputs the contour plots for the wavefunction or electron probability density	??
priors	
Functions for obtaining the prior mean and its derivative	??
read_data	
Subroutines to read files and transfer user inputs into fortran	??
Definitions of shared constants used throughout the software	22

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stoch_grad	
Optimization modules	 ??
write_file	
Contains all the subroutines related to writing results to file	22

Data Type Index

9.1 Data Types List

Here are the data types with brief descriptions:

biased_optim::bi_op_init
gp_surrogate::cov_kernal_dx_1_interface
gp_surrogate::cov_kernal_interface
gp_surrogate::cov_kernal_xx_dx_interface
gp_surrogate::gp_init
General initialisation function, see gp_init_gausscov
gp_surrogate::gp_k_post
Function for postieror covairance kernal use in format x_1, x_2, x_1 dim, x_2 dim for $cov(x_1, x_2)$
use in format x, x_dim for $cov(x,x)$
mcmc::log_rho_interface
gp_surrogate::mean_func_interface
gp_surrogate::mean_func_interface_dx
basis_functions::wave_function_interface

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File Index

10.1 File List

Here is a list of all files with brief descriptions:

basis_functions.f90	
Functions that define the Hamiltonian that specifies the problem and the basis set being used .	??
Biased_Optim.f90	
Biased optimization subroutines and functions	??
Biased_Optim_example_driver.f90	
Driver for testng the biased optimization routines	??
bond_driver.f90	
Driver for running multiple simulations to optimise bond length	??
calc.f90	
Function completing calculations of either the wavefunction or electron density (depending on the system) at a set of coordinates [x,y,0] on a grid of equally spaced points on a xy grid	??
component_functions.f90	
Basic subfunctions used throughout the simulation	??
constants.f90	
Fortran shared constants definitions	??
ed_test.f90	
Driver for testing electron density function	??
electron_density.f90	
Electron density function	??
energy_plotting.py	
Script to output the energy against the bond length	??
GP_surrogate.f90	
Gaussian process surrogate subroutines and functions	??
GP_surrogate_test_driver.f90	
Driver for testing the Gaussian process surrogate	??
gradient_estimator.f90	
Subroutines for obtaining a gradient estimation through Cholesky decomposition	??
init_params.py	
Python code to obtain user input through GUI or command line	??
latin_driver.f90	
Simulation driver for latin hypercube sampling	??
main_driver.f90	
Main driver script for simulation	??
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Module Documentation

11.1 basis_functions Module Reference

Wavefunction, hamiltonian and basis set choice.

Data Types

· interface wave function interface

Functions/Subroutines

- subroutine initialise_basis (n_electrons_in, n_basis_functions_per_atom_in, n_atoms_in, atom_coords_in, n_Jastrow_in, fd_length_in, Jastrow_b_length_in, Jastrow_d_length_in, proton_numbers_in, basis_type_in)

 Initialisation routine.
- · subroutine deinitialise basis

Dinitialisation routine.

• real(dp) function wave_function_slater_1s (position, dof_coefficients)

Single Electron wavefunction: slater 1s basis.

real(dp) function reduced_hamiltonian_slater_1s (position, dof_coefficients)

Single Electron Reduced Hamiltonian: slater 1s basis.

• real(dp) function discrete_laplacian_reduced (position, h, dofs)

Finite Difference Reduced Laplacian Computes finite difference approximation to the reduced laplacian \$(\nabla^2\psi)/\psi\$.

• real(dp) function wave_function_2_electrons (position, dof_coefficients)

Wavefunction for 2 electrons.

• real(dp) function reduced_hamiltonian_2_electrons (position, dof_coefficients)

Reduced Hamiltonian for 2 electrons.

subroutine mno_allocate (n_terms)

Allocate parameters for Jastrow factor.

• real(dp) function log_density (position, dof_coefficients)

Log of the Probability Density.

• real(dp) function wave_function_sto3g (position, dof_coefficients)

Single Electron wavefunction: gaussian sto3g basis.

• real(dp) function reduced_hamiltonian_sto3g (position, dof_coefficients)

Single Electron Reduced Hamiltonian: gaussian sto3g basis.

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Variables

- procedure(wave_function_interface), pointer wave_function
- procedure(wave_function_interface), pointer reduced_hamiltonian
- logical, protected initialised = .false.
- integer, protected n_electrons
- integer, protected n_basis_functions_per_atom
- integer, protected n_atoms
- real(dp), dimension(:,:), allocatable, protected atom_coords
- integer, protected n jastrow dofs
- real(dp), protected fd_h
- real(dp), protected b length
- real(dp), protected d_length
- real(dp), dimension(:), allocatable, protected proton_numbers
- · integer, protected basis_type
- integer, protected number dofs
- integer, protected n_space_dims
- real(dp), dimension(:,:), allocatable, protected dof_bounds
- integer, protected n_dofs_per_atom
- integer, protected n_dofs_no_jastrow
- integer, dimension(:,:), allocatable, protected mno_parameters
- procedure(wave_function_interface), pointer wave_function_single

11.1.1 Detailed Description

Wavefunction, hamiltonian and basis set choice.

This module contains functions that define the hamiltonian that specifies the problem and the basis set being used. Makes significant use of module variables defined in an initialisation subroutine. This allocates 2 function pointers using wave_function_interface

- wave_function
- · reduced hamiltonian

Parameters

position	a real(dp) array of electron coordinates	
dof_coefficients	ents a real(dp) array of degree of freedom (dof) parameters These are the only functions	
	that should be used outside of the module.	

11.1.2 Function/Subroutine Documentation

11.1.2.1 deinitialise_basis()

 $\verb|subroutine| basis_functions:: deinitialise_basis|$

Dinitialisation routine.

MUST be run at the end of main program to deallocate module variables.

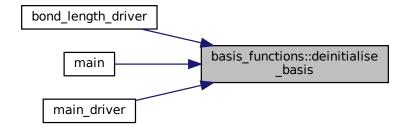
Definition at line 267 of file basis_functions.f90.

```
implicit none
if (initialised) deallocate(dof_bounds,atom_coords,proton_numbers)
if (allocate(mno_parameters)) deallocate(mno_parameters)
initialised = .false.
```

References atom_coords, dof_bounds, initialised, mno_parameters, and proton_numbers.

Referenced by bond_length_driver(), main(), and main_driver().

Here is the caller graph for this function:



11.1.2.2 discrete_laplacian_reduced()

Finite Difference Reduced Laplacian Computes finite difference approximation to the reduced laplacian (α^2) is (α^2) .

Uses that $f''(x)/f(x) = ((f(x+h)+f(x-h))/f(x)-2)/(h^2)+O(h^2)$ (*)

Parameters

ir	position	Space coordinate of electrons
ir	n h	Finite difference lengthscale
ir	dofs	Values of the dofs

Definition at line 368 of file basis_functions.f90.

```
368
369 implicit none
370 real(dp) :: discrete_Laplacian_reduced
```

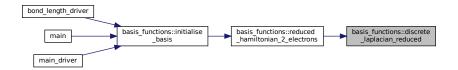
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```
real(dp), dimension(:), intent(in) :: position
374
        real(dp), intent(in) :: h
376
        real(dp), dimension(:), intent(in) :: dofs
377
        integer :: i ! Loop variable
378
        real(dp), dimension(:,:), allocatable:: delta! temporary array for vector displacements
379
380
        ! Initialise and bounds tests
381
        if (.not.(initialised)) then
382
          print *, "Error, basis not initialised"
383
          stop
384
        end if
385
        if (size(position).ne.n_space_dims) then
386
          print *, "Error, wrong space dimension, got", size(position), "wanted", n_space_dims
387
          stop
388
        end i
        if (size(dofs).ne.number_dofs) then
  print *, "Error, wrong number of dofs, got", size(dofs), "wanted", number_dofs
389
390
391
          stop
392
        end if
393
394
        ! Create matrix of cartesian basis vectors of length h. Set as 0 initially, h added during main loop
395
        allocate(delta(n_space_dims,n_space_dims))
396
        delta = 0.0_dp ! Matrix assignment
397
        discrete_laplacian_reduced = 0.0_dp
398
        do i = 1, n_space_dims ! Loop over space dimensions
          delta(i,i) = h
399
400
          discrete_laplacian_reduced = discrete_laplacian_reduced &
401
          ! Following (*), sum of (f(x+h)+f(x-h)) in all space dimensions
402
          + wave_function(position + delta(:,i), dofs) + wave_function(position - delta(:,i), dofs)
403
        end do
        ! Following (\star), divide by f(x), and subtract 2 for each space dimension
404
405
        discrete_laplacian_reduced = discrete_laplacian_reduced/wave_function(position ,dofs) -
       2*n_space_dims
406
        ! Following (\star), divide by h^2
407
        discrete_laplacian_reduced = discrete_laplacian_reduced/(h**2)
408
409
        ! deallocate temporary array
        deallocate (delta)
```

References initialised, n space dims, number dofs, and wave function.

Referenced by reduced_hamiltonian_2_electrons().

Here is the caller graph for this function:



11.1.2.3 initialise_basis()

```
subroutine basis_functions::initialise_basis (
    integer, intent(in) n_electrons_in,
    integer, intent(in) n_basis_functions_per_atom_in,
    integer, intent(in) n_atoms_in,
    real(dp), dimension(:,:), intent(in) atom_coords_in,
    integer, intent(in), optional n_Jastrow_in,
    real(dp), intent(in), optional fd_length_in,
    real(dp), intent(in), optional Jastrow_b_length_in,
    real(dp), intent(in), optional Jastrow_d_length_in,
```

```
real(dp), dimension(:), intent(in), optional proton_numbers_in,
integer, intent(in), optional basis_type_in )
```

Initialisation routine.

Must be run at the start of the main program, after user input. This defines the problem and selects the basis being used. It allocates module variables and procedure pointers.

Parameters

in	n_electrons_in	Number of electrons
in	n_basis_functions_per_atom←	Number of linear terms in the single-electron wavefunction per atom
	_in	
in	n_atoms_in	Number of atoms
in	atom_coords_in	Coordinates of the atoms. Shape (3,n_atoms)
in	n_jastrow_in	Number of dofs in the Jastrow (interaction) term
in	fd_length_in	Lengthscale of the finite difference code
in	jastrow_b_length_in	Inverse lengthscale of nuclear-electron interaction
in	jastrow_d_length_in	Inverse lengthscale of electron-electron interaction
in	proton_numbers_in	Proton Numbers of atoms
in	basis_type_in	integer code for type of basis. Codes are listed in shared_constants.f90

Definition at line 69 of file basis_functions.f90.

```
implicit none
70
       ! Required Parameters
72
       integer, intent(in) :: n_electrons_in
       integer, intent(in) :: n_basis_functions_per_atom_in
       integer, intent(in) :: n_atoms_in
       real(dp), dimension(:,:), intent(in) :: atom_coords_in
79
       ! Optional Paramters
81
       integer, optional, intent(in) :: n_Jastrow_in
       real(dp), optional, intent(in) :: fd_length_in
real(dp), optional, intent(in) :: Jastrow_b_length_in
real(dp), optional, intent(in) :: Jastrow_d_length_in
83
85
89
       real(dp), dimension(:), optional, intent(in) :: proton_numbers_in
91
       integer, optional, intent(in) :: basis_type_in
92
       ! Internal Variables
       integer :: i ! Loop variable
93
94
       integer :: n_dofs_per_basis_function ! number of dofs per linear term of the wavefunction. Always 2
       for slater and Gaussian
95
96
       ! Check not already initialised
97
       if (initialised) then
       print *, "Error, cannot initialise basis twice"
98
99
         stop
100
        end if
101
102
        if (n_atoms_in <= 0) then</pre>
103
         print*, "Error, number of atoms must be positive"
104
          stop
105
        end if
106
        if ((n_atoms_in .ne. 1).and.(n_atoms_in .ne. 2)) then
        print*, "Error, only 1 or 2 atoms supported"
107
108
          stop
109
        end if
110
        n_atoms = n_atoms_in
111
        ! Check and allocate the atom coordinates
112
113
        if (size(atom_coords_in,2) .ne. n_atoms_in ) then
114
         print*, "Error, wrong number of atoms"
115
116
        end if
117
        if (size(atom coords in.1) .ne. 3 ) then
118
         print*, "Error, wrong dimension of atom coordinates"
119
          stop
120
121
        allocate(atom_coords(3, size(atom_coords_in, 2)))
122
        atom_coords = atom_coords_in
123
124
        ! Check and assign other required inputs
125
        if (n_basis_functions_per_atom_in <= 0) then</pre>
126
          print*, "Error, number of basis functions per atom must be positive"
```

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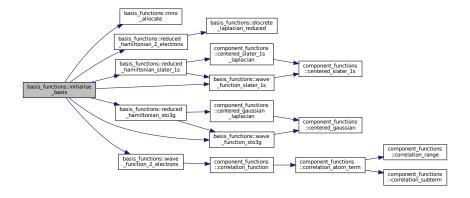
```
127
          stop
128
129
        n_basis_functions_per_atom = n_basis_functions_per_atom_in
130
        if ((n_electrons_in .ne. 1).and.(n_electrons_in .ne. 2)) then
    print*,"Error, number of electrons must be 1 or 2"
131
132
133
134
135
        n_electrons = n_electrons_in
136
        n_space_dims = 3*n_electrons
137
138
139
140
141
        ! Check and assign optional paramters
142
        if (present(n_jastrow_in)) ther
143
          n_jastrow_dofs = n_jastrow_in
        else
144
145
         n_jastrow_dofs = 7 ! Default Value
146
        end if
147
148
        if (present(fd_length_in)) then
149
         if (fd_length_in>0.00009) then
            fd_h = fd_length_in
150
151
          else
152
           print*, "Error, finite difference length must be at least 0.0001"
153
154
          end if
155
        else
          fd_h = 0.01_dp ! Default Value
156
157
        end if
158
159
        if (present(jastrow_b_length_in)) then
160
             (jastrow_b_length_in>0.05) then
161
            b_length = jastrow_b_length_in
162
          else
163
            print*, "Error, Jastrow b length must be positive"
164
            stop
165
          end if
166
167
          b_length = 1.0_dp ! Default value
168
        end if
169
170
        if (present(jastrow_d_length_in)) then
171
         if (jastrow_d_length_in>0.05) then
172
            d_length = jastrow_d_length_in
173
          else
174
           print*, "Error, Jastrow d length must be positive"
175
            stop
176
          end if
177
        else
178
          d_length = 1.0_dp ! Default value
179
180
        allocate(proton_numbers(n_atoms))
181
        if (present(proton_numbers_in)) then
182
          if (size(proton_numbers_in) == n_atoms) then
            proton_numbers = proton_numbers_in
183
184
185
           print*, "Error, mismatch in number of atoms and proton numbers"
186
187
          end if
188
        else
189
         proton_numbers = 1.0_dp ! Default value is hydrogen
190
191
192
        if (present (basis_type_in)) then
193
          basis_type = basis_type_in
194
        else
195
         basis_type = slater_1s_code !Default basis set
196
197
198
        ! Assign individual electron wavefunction with input basis set
199
        select case(basis_type)
200
        case (slater_1s_code)
          wave_function_single => wave_function_slater_1s
201
202
          reduced_hamiltonian => reduced_hamiltonian_slater_1s
203
        case (sto_3g_code)
204
         wave_function_single => wave_function_sto3g
205
          reduced_hamiltonian => reduced_hamiltonian_sto3g
206
        case default
         print *, "Basis type not recognised"
207
208
          stop
209
        end select
210
211
        ! Set number of dofs per basis function. This may change for future choices of basis sets
212
        n\_dofs\_per\_basis\_function = 2
213
        n_dofs_per_atom = n_dofs_per_basis_function * n_basis_functions_per_atom
```

```
214
                    n_dofs_no_jastrow = n_dofs_per_atom * n_atoms
215
216
                     ! Assignments for one electron, slater type orbital
217
                     \quad \  \  \text{if (n\_electrons\_in .eq. 1) then} \\
218
219
                          number dofs = n dofs per atom * n atoms
220
221
                          allocate(dof_bounds(number_dofs,2))
222
223
                          ! Assign dof bounds for single electron part
224
                          ! Ordering here is for 2 dofs per basis function, in pairs, first linear dof then width dof
225
                          \label{eq:continuous_per_atom*n_atoms} \ ! \ Loop \ over \ pairs \ of \ dofs
                                     \frac{1}{1.5} \frac{1.5}{1.5} \frac{1.5
226
227
228
229
230
                          ! Assign wave_function pointer. Ham pointer already assigned
231
                          wave_function => wave_function_single
232
233
234
                      ! Assignments for 2 electrons, slater type orbital
235
                     if (n_electrons_in .eq. 2) then
236
                          ! Allocate the mno parameters that determine the form of Jastrow \operatorname{\mathsf{term}}
237
238
                          call mno_allocate(n_jastrow_dofs)
239
240
                          number_dofs = n_dofs_per_atom * n_atoms + n_jastrow_dofs
241
2.42
                          allocate(dof_bounds(number_dofs,2))
243
244
                          ! Assign dof bounds
245
                           ! Ordering here is for 2 dofs per basis function, first linear cooef then width coeff
246
                          do i = 1, n_basis_functions_per_atom*n_atoms ! Loop over pairs of dofs
247
                                    dof_bounds(2*i-1,:)=[-1.5_dp,1.5_dp] ! Linear coeffs bounds -1.5 to 1.5
248
                                    dof_bounds(2*i,:) = [0.1_dp, 1.5_dp]
                                                                                                                                ! width positive, up to 1.5
249
250
                          if (n_jastrow_dofs.ne.0) then
251
                               do i = n_dofs_per_atom*n_atoms+1, number_dofs
252
                                    dof_bounds(i,:) = [-1.5_dp, 1.5_dp] ! Jastrow dofs bounds -1.5 to 1.5
253
254
                          end if
255
                          ! Assign the procedure pointers
256
                          wave function => wave function 2 electrons
257
                         reduced_hamiltonian => reduced_hamiltonian_2_electrons
258
259
260
                     ! Set initialised flag, which is tested in the routines
2.61
                    initialised = .true.
```

References atom_coords, b_length, basis_type, d_length, dof_bounds, fd_h, initialised, mno_allocate(), n_atoms, n_basis_functions_per_atom, n_dofs_no_jastrow, n_dofs_per_atom, n_electrons, n_jastrow_dofs, n_space_dims, number_dofs, proton_numbers, reduced_hamiltonian, reduced_hamiltonian_2_electrons(), reduced_hamiltonian \leftarrow _slater_1s(), reduced_hamiltonian_sto3g(), shared_constants::slater_1s_code, shared_constants::sto_3g_code, wave_function, wave_function_2_electrons(), wave_function_single, wave_function_slater_1s(), and wave_ \leftarrow function_sto3g().

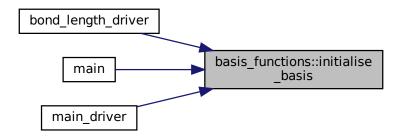
Referenced by bond_length_driver(), main(), and main_driver().

Here is the call graph for this function:



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Here is the caller graph for this function:



11.1.2.4 log_density()

Log of the Probability Density.

For the MCMC integration.

Parameters

in	position	Space coordinate of electrons
in	dof_coefficients	Values of the dofs

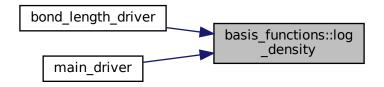
Definition at line 540 of file basis_functions.f90.

```
implicit none
file real(dp) :: log_density
freal(dp), dimension(:), intent(in) :: position
freal(dp), dimension(:), intent(in) :: dof_coefficients
freal(dp) : log_density = 2*log(abs(wave_function(position,dof_coefficients)))
freal(dp) :: log_density = 2*log(abs(wave_function(position,dof_coefficients)))
```

References wave_function.

Referenced by bond_length_driver(), and main_driver().

Here is the caller graph for this function:



11.1.2.5 mno_allocate()

Allocate parameters for Jastrow factor.

Allocates the paramters that determine type of Jastrow function. Sizes 0,3,7,9 supported. Functions are from Schmidt and Moskowitz 1990

Parameters

in n_terms | Number of terms in Jastrow correlation function

Definition at line 497 of file basis functions.f90.

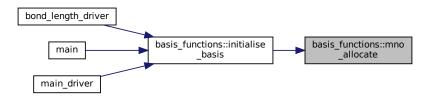
```
implicit none
499
        integer,intent(in) :: n_terms
500
        select case (n_terms)
501
          case (0)
502
            n_{jastrow_dofs} = 0
503
          case (3)
504
            allocate(mno_parameters(3,3))
            mno_parameters(:,1) = [0,0,1]
mno_parameters(:,2) = [0,0,2]
505
506
507
            mno_parameters(:,3) = [2,0,0]
508
            n_{jastrow_dofs} = 3
509
          case (7)
           allocate(mno_parameters(3,7))
510
511
            mno_parameters(:,1) = [0,0,1]
512
            mno\_parameters(:,2) = [0,0,2]
513
            mno\_parameters(:,3) = [0,0,3]
           mno_parameters(:,4) = [0,0,4]
514
            mno_parameters(:,5) = [2,0,0]
515
            mno_parameters(:,6) = [3,0,0]
516
            mno_parameters(:,7) = [4,0,0]
517
            n_jastrow_dofs =
519
          case (9)
520
            allocate(mno_parameters(3,9))
521
            mno\_parameters(:,1) = [0,0,1]
            mno_parameters(:,2) = [0,0,2]
522
            mno_parameters(:,3) = [0,0,3]
524
            mno_parameters(:,4) = [0,0,4]
525
            mno_parameters(:,5) = [2,0,0]
            mno_parameters(:,6) = [3,0,0]
526
            mno_parameters(:,7) = [4,0,0]
527
528
            mno_parameters(:,8) = [2,2,0]
529
            mno_parameters(:,9) = [2,0,2]
            n_jastrow_dofs = 9
```

```
531 case default
532 print *, "Jastrow term of size:", n_terms, "not supported"
533 stop
534 end select
```

References mno_parameters, and n_jastrow_dofs.

Referenced by initialise basis().

Here is the caller graph for this function:



11.1.2.6 reduced hamiltonian 2 electrons()

Reduced Hamiltonian for 2 electrons.

Computes the reduced Hamiltonian \$(H\psi)\psi\$ for 2 electrons. Uses discrete_Laplacian_reduced in this module.

Parameters

i	n	position	Space coordinate of electrons
i	n	dof_coefficients	Values of the dofs

Definition at line 454 of file basis_functions.f90.

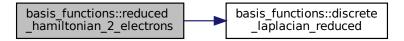
```
454
        implicit none
455
        real(dp) :: reduced_hamiltonian_2_electrons
        real(dp), dimension(:), intent(in) :: position real(dp), dimension(:), intent(in) :: dof_coefficients
457
459
460
        integer :: j ! Loop variable
461
        ! Initialise and bounds tests
        if (.not.(initialised)) then
462
463
          print *, "Error, basis not initialised"
464
          stop
465
466
        if (size(position).ne.n_space_dims) then
          print *, "Error, wrong space dimension, got", size(position), "wanted", n_space_dims
467
468
          stop
469
470
        if (size(dof_coefficients).ne.number_dofs) then
471
          print *, "Error, wrong number of dofs, got", size(dof_coefficients), "wanted", number_dofs
472
          stop
473
        end if
474
475
        ! Reduced Kinetic energy and electron-electron reduced potential energy
        ! $-0.5 \quad 2\psi$ +1/r, r distance between electrons
```

```
reduced\_hamiltonian\_2\_electrons = -0.5\_dp*discrete\_laplacian\_reduced (position, fd\_h, fd
478
                                                 + 1.0_dp /norm2(position(1:3)-position(4:6))
479
                                      ! Reduced electron-nuclear potential energy, -1/r, r distance from electron to atom
480
                                     do j = 1, n_atoms ! Loop over atoms
  reduced_hamiltonian_2_electrons = reduced_hamiltonian_2_electrons &
481
482
483
                                                                  -proton_numbers(j) /norm2(position(1:3)-atom_coords(:,j))&
484
                                                                    -proton_numbers(j) /norm2(position(4:6)-atom_coords(:,j))
485
486
487
                                      if (n atoms ==2) then
488
                                              reduced_hamiltonian_2_electrons = reduced_hamiltonian_2_electrons &
489
                                                +proton_numbers(1)*proton_numbers(2) /norm2(atom_coords(:,1)-atom_coords(:,2))
490
```

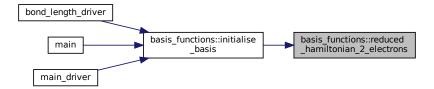
References atom_coords, discrete_laplacian_reduced(), fd_h, initialised, n_atoms, n_space_dims, number_dofs, and proton_numbers.

Referenced by initialise_basis().

Here is the call graph for this function:



Here is the caller graph for this function:



11.1.2.7 reduced hamiltonian slater_1s()

Single Electron Reduced Hamiltonian: slater 1s basis.

Reduced Hamiltonian \$(H\psi)/\psi\$ for 1 electron, with slater 1s type orbital Uses centered_slater_1s_laplacian in component_functions.f90 Used only for 1 electron problems.

Parameters

in	position	Space coordinate of electrons
in	dof_coefficients	Values of the dofs

loop over atoms

loop over linear terms in wavefunction

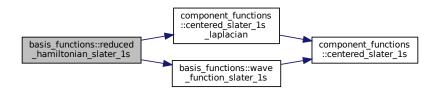
Definition at line 315 of file basis functions.f90.

```
315
        implicit none
316
        real(dp) :: reduced_hamiltonian_slater_1s
        real(dp), dimension(:), intent(in) :: position real(dp), dimension(:), intent(in) :: dof_coefficients
318
320
321
        integer :: i, j ! Loop variables
322
323
        ! Initialise and bounds tests
        if (.not.(initialised)) then
324
325
          print *, "Error, basis not initialised"
326
327
328
        if (size(position).ne.n_space_dims) then
          print *, "Error, wrong space dimension, got", size(position), "wanted", n_space_dims
329
330
          stop
331
        end if
332
        if (size(dof_coefficients).ne.number_dofs) then
333
          print *, "Error, wrong number of dofs, got", size(dof_coefficients), "wanted", number_dofs
          stop
334
335
        end if
336
337
        reduced_hamiltonian_slater_1s = 0.0_dp
        ! Kinetic energy term $-0.5\nabla^2\psi$
338
339
        ! This wavefunction is linear, and it is easy to compute this analytically
340
        do j = 0, n_atoms-1
341
          do i= 1,n_basis_functions_per_atom
            reduced_hamiltonian_slater_1s = reduced_hamiltonian_slater_1s & -0.5_dp * dof_coefficients( 2*i-1 +j*n_dofs_per_atom) & ! linear coefficient dof
342
343
344
                 *centered_slater_1s_laplacian(position-atom_coords(:,j+1), & ! position relative to atom
345
                   dof\_coefficients(2*i+j*n\_dofs\_per\_atom))! lengthscale dof
346
          end do
347
        end do
348
        ! Divide by the wavefunction to get reduced laplacian (-0.5\hbar^2)/\
        reduced_hamiltonian_slater_1s =
349
       reduced_hamiltonian_slater_1s/wave_function_slater_1s(position,dof_coefficients)
350
        ! Potential energy, already reduced, so no wavefunction in this do j = 1, n_atoms ! loop over atoms
351
352
        reduced hamiltonian slater 1s = reduced hamiltonian slater 1s &
353
354
         -proton_numbers(j) /norm2(position-atom_coords(:,j)) ! -1/r, r distance from electron to atom
355
356
357
        if (n_atoms ==2) then
358
          reduced_hamiltonian_slater_1s = reduced_hamiltonian_slater_1s &
359
          + proton\_numbers (1) * proton\_numbers (2) / norm2 (atom\_coords (:, 1) - atom\_coords (:, 2)) \\
360
        end if
```

References atom_coords, component_functions::centered_slater_1s_laplacian(), initialised, n_atoms, n_basis __functions_per_atom, n_dofs_per_atom, n_space_dims, number_dofs, proton_numbers, and wave_function_ _ slater 1s().

Referenced by initialise basis().

Here is the call graph for this function:



Here is the caller graph for this function:



11.1.2.8 reduced hamiltonian sto3g()

Single Electron Reduced Hamiltonian: gaussian sto3g basis.

Reduced Hamiltonian \$(H\psi)/\psi\$ for 1 electron, with basic gaussian sto3g type orbital Uses centered_gaussian ← _laplacian in component_functions.f90 Used only for 1 electron problems.

Parameters

in	position	Space coordinate of electrons
in	dof_coefficients	Values of the dofs

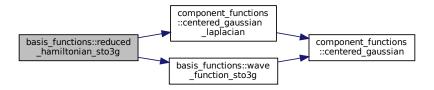
Definition at line 594 of file basis functions.f90.

```
implicit none
595
         real(dp) :: reduced_hamiltonian_sto3g
597
        \verb"real(dp)", & \verb"dimension(:)", & \verb"intent(in)" :: position"
599
        real(dp), dimension(:), intent(in) :: dof\_coefficients
600
        integer :: i, j ! Loop variables
601
         ! Initialise and bounds tests
603
        if (.not.(initialised)) ther
604
          print *, "Error, basis not initialised"
605
           stop
606
        end if
607
        if (size(position).ne.n space dims) then
608
          print *, "Error, wrong space dimension, got", size(position), "wanted", n_space_dims
609
610
        if (size(dof_coefficients).ne.number_dofs) then
   print *, "Error, wrong number of dofs, got", size(dof_coefficients), "wanted", number_dofs
611
612
613
          stop
614
        end if
615
616
         reduced_hamiltonian_sto3g = 0.0_dp
         ! Kinetic energy term $-0.5\nabla^2\psi$
617
        ! This wavefunction is linear, and it is easy to compute this analytically do j = 0, n_atoms-1 ! loop over atoms
618
619
620
          do i= 1,n_basis_functions_per_atom ! loop over linear terms in wavefunction
621
             reduced_hamiltonian_sto3g = reduced_hamiltonian_sto3g &
622
                -0.5_dp * dof_coefficients( 2*i-1 +j*n_dofs_per_atom) & ! linear coefficient dof
623
                 *centered\_gaussian\_laplacian(position-atom\_coords(:,j+1), \ \& \ ! \ position \ relative \ to \ atom
62.4
                    {\tt dof\_coefficients(\ 2*i\ +j*n\_dofs\_per\_atom\ )\ )\ !\ lengthscale\ dof}
625
          end do
626
         ! Divide by the wavefunction to get reduced laplacian (-0.5\hbar^2)/psi$
```

```
628
        reduced_hamiltonian_sto3g = reduced_hamiltonian_sto3g/wave_function_sto3g(position,dof_coefficients)
629
630
        ! Potential energy, already reduced, so no wavefunction in this
631
        do j = 0, n_atoms-1 ! loop over atoms
          reduced_hamiltonian_sto3g = reduced_hamiltonian_sto3g &
632
633
          -1.0_dp /norm2(position-atom_coords(:,j+1)) !-1/r, r distance from electron to atom
634
635
636
        if (n_atoms ==2) then
637
          reduced_hamiltonian_sto3g = reduced_hamiltonian_sto3g &
638
          + \verb|proton_numbers(1) * \verb|proton_numbers(2)| / \verb|norm2(atom_coords(:,1) - atom_coords(:,2))| \\
639
640
```

Referenced by initialise_basis().

Here is the call graph for this function:



Here is the caller graph for this function:



11.1.2.9 wave_function_2_electrons()

Wavefunction for 2 electrons.

Uses subprocedure correlation function in component functions.f90 Uses the function pointer wave function single

Parameters

in	position	Space coordinate of electrons
in	dof_coefficients	Values of the dofs

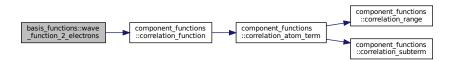
Definition at line 417 of file basis_functions.f90.

```
implicit none
418
                                     real(dp) :: wave function 2 electrons
                                    real(dp), dimension(:), intent(in) :: position real(dp), dimension(:), intent(in) :: dof_coefficients
420
422
                                       ! Initialise and bounds tests
423
424
                                      if (.not.(initialised)) then
425
                                             print *, "Error, basis not initialised"
426
                                             stop
427
                                     end i
428
                                    if (size(position).ne.n_space_dims) then
429
                                             print *, "Error, wrong space dimension, got", size(position), "wanted", n_space_dims
430
431
                                     end i:
432
                                    if (size(dof coefficients).ne.number dofs) then
433
                                          print *, "Error, wrong number of dofs, got", size(dof_coefficients), "wanted", number_dofs
434
                                             stop
435
436
437
                                    ! Slater determinant (trivial for 2 electron spin up/down pair)
438
                                    ! position(1:3) is coords of first electron, (4:6) is the second. dof(:n_no_jastrow) are the
                                relevant dofs
439
                                    wave_function_2_electrons =
                                wave\_function\_single \, (position \, (1:3) \, , \\ dof\_coefficients \, (:n\_dofs\_no\_jastrow) \, ) \, \& \, (in\_dofs\_no\_jastrow) \, (in\_dofs\_no\_jastrow) \, ) \, \& \, (i
440
                                     * wave_function_single(position(4:6),dof_coefficients(:n_dofs_no_jastrow))
441
442
                                    ! Multiply by correlation function. This is the Jastrow term. dof(n_dofs_no_Jastrow+1:) are relevant
                                terms
443
                                      if (n_jastrow_dofs.ne.0) then
444
                                     wave_function_2_electrons = &
445
                                              correlation\_function (atom\_coords, position, mno\_parameters, dof\_coefficients (n\_dofs\_no\_jastrow+1:), \& atom\_coords, position, mno\_parameters, dof\_coefficients (n\_dofs\_no\_jastrow+1:), & atom\_coords, dof_coefficients (n\_dofs\_no\_jastrow+1:), & atom\_coords, dof_coefficients (n\_dofs\_no\_jastrow+1:), & atom\_coefficients (n\_dof
446
                                             b_length,d_length) *wave_function_2_electrons
447
```

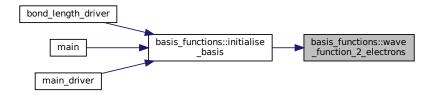
References atom_coords, b_length, component_functions::correlation_function(), d_length, initialised, mno_\circ} parameters, n_dofs_no_jastrow, n_jastrow_dofs, n_space_dims, number_dofs, and wave_function_single.

Referenced by initialise_basis().

Here is the call graph for this function:



Here is the caller graph for this function:



11.1.2.10 wave_function_slater_1s()

Single Electron wavefunction: slater 1s basis.

Uses centered_slater_1s in component_functions.f90

Parameters

in	position	Space coordinate of electron
in	dof_coefficients	Values of the dofs

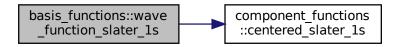
Definition at line 276 of file basis_functions.f90.

```
276
277
          implicit none
          real(dp) :: wave_function_slater_1s
279
          \mbox{real(dp), dimension(:), intent(in) :: position}
         real(dp), dimension(:), intent(in) :: dof_coefficients
integer :: i, j ! loop variables
281
282
          ! Initialise and bounds tests
          if (.not.(initialised)) then
285
           print *, "Error, basis not initialised"
286
            stop
287
          end if
288
         if (size(position).ne.3) then
           print *, "Error, wrong space dimension, got", size(position), "wanted 3"
289
290
291
         if (size(dof_coefficients).ne.n_dofs_no_jastrow) then
    print *, "Error, wrong number of dofs, got", size(dof_coefficients), "wanted", n_dofs_no_jastrow
292
293
294
            stop
295
296
297
          ! Wavefunction is sum over linear terms with 2 dofs each - a linear coefficient and a lengthscale
298
          wave_function_slater_1s = 0.0_dp
         do j = 0, n_atoms-1 ! loop over atoms
299
            do i= 1, n_basis_functions_per_atom ! loop over linear terms in wavefunction
300
              wave_function_slater_ls = wave_function_slater_ls + & dof_coefficients( 2*i-1 + j*n_dofs_per_atom )& ! linear coefficient dof
301
302
                   *centered_slater_1s(position-atom_coords(:,j+1), & ! position relative to atom dof_coefficients(2*i + j*n_dofs_per_atom )) ! lengthscale dof
303
304
305
            end do
306
          end do
307
```

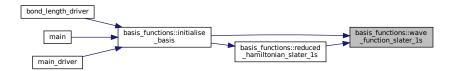
References atom_coords, component_functions::centered_slater_1s(), initialised, n_atoms, n_basis_functions_\(\sigma\) per_atom, n_dofs_no_jastrow, and n_dofs_per_atom.

Referenced by initialise_basis(), and reduced_hamiltonian_slater_1s().

Here is the call graph for this function:



Here is the caller graph for this function:



11.1.2.11 wave_function_sto3g()

Single Electron wavefunction: gaussian sto3g basis.

Uses centered_gaussian in component_functions.f90

Parameters

in	position	Space coordinate of electron
in	dof_coefficients	Values of the dofs

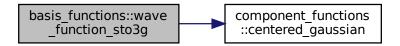
Definition at line 554 of file basis_functions.f90.

```
554
         implicit none
555
         real(dp) :: wave_function_sto3g
         real(dp), dimension(:), intent(in) :: position real(dp), dimension(:), intent(in) :: dof_coefficients
557
559
560
         integer :: i, j ! loop variables
! Initialise and bounds tests
561
562
         if (.not.(initialised)) then
563
564
           print *, "Error, basis not initialised"
565
            stop
566
567
         if (size(position).ne.3) then
568
            print *, "Error, wrong space dimension, got", size(position), "wanted 3"
569
            stop
570
         end i
571
         if (size(dof_coefficients).ne.n_dofs_no_jastrow) then
572
            print *, "Error, wrong number of dofs, got", size(dof_coefficients), "wanted", n_dofs_no_jastrow
573
574
            stop
         end if
575
576
         ! Wavefunction is sum over linear terms with 2 dofs each - a linear coefficient and a lengthscale
         wave_function_sto3g = 0.0_dp
do j = 0, n_atoms-1 ! loop over atoms
578
579
            do i= 1, n_basis_functions_per_atom ! loop over linear terms in wavefunction
              wave_function_sto3g = wave_function_sto3g + &
  dof_coefficients( 2*i-1 + j*n_dofs_per_atom )& ! linear coefficient dof
  *centered_gaussian(position-atom_coords(:,j+1), & ! position relative to atom
580
581
582
583
                      dof\_coefficients(2*i + j*n\_dofs\_per\_atom))! lengthscale dof
584
            end do
585
         end do
586
```

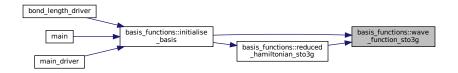
References atom_coords, component_functions::centered_gaussian(), initialised, n_atoms, n_basis_functions_\(\sigma \) per_atom, n_dofs_no_jastrow, and n_dofs_per_atom.

Referenced by initialise_basis(), and reduced_hamiltonian_sto3g().

Here is the call graph for this function:



Here is the caller graph for this function:



11.1.3 Variable Documentation

11.1.3.1 atom_coords

```
real(dp), dimension(:,:), allocatable, protected basis_functions::atom_coords
```

Definition at line 42 of file basis_functions.f90.

```
42 real(dp), protected, allocatable, dimension(:,:) :: atom_coords ! Coordinates of the atoms. Shape (3,n_atoms)
```

Referenced by deinitialise_basis(), initialise_basis(), reduced_hamiltonian_2_electrons(), reduced_hamiltonian_ \leftarrow slater_1s(), reduced_hamiltonian_sto3g(), wave_function_2_electrons(), wave_function_slater_1s(), and wave_ \leftarrow function_sto3g().

11.1.3.2 b_length

```
real(dp), protected basis_functions::b_length
```

Definition at line 45 of file basis_functions.f90.

```
real(dp), protected :: b_length ! Inverse lengthscale of nuclear-electron interaction
```

Referenced by initialise_basis(), and wave_function_2_electrons().

11.1.3.3 basis_type

integer, protected basis_functions::basis_type

Definition at line 48 of file basis functions.f90.

48 integer, protected :: basis_type ! integer code for type of basis. In shared_constants module

Referenced by initialise_basis().

11.1.3.4 d_length

```
real(dp), protected basis_functions::d_length
```

Definition at line 46 of file basis functions.f90.

46 real(dp), protected :: d_length ! Inverse lengthscale of electron-electron interaction

Referenced by initialise_basis(), and wave_function_2_electrons().

11.1.3.5 dof_bounds

```
real(dp), dimension(:,:), allocatable, protected basis_functions::dof_bounds
```

Definition at line 52 of file basis_functions.f90.

52 real(dp), allocatable, dimension(:,:), protected :: dof_bounds ! Default bounds for the possible dof

Referenced by bond_length_driver(), deinitialise_basis(), stoch_grad::grad_accent(), initialise_basis(), main(), main_driver(), and stoch_grad::stoch_grad_init().

11.1.3.6 fd_h

```
real(dp), protected basis_functions::fd_h
```

Definition at line 44 of file basis_functions.f90.

14 real(dp), protected :: fd_h ! Lengthscale of the finite difference code

Referenced by initialise_basis(), and reduced_hamiltonian_2_electrons().

11.1.3.7 initialised

logical, protected basis_functions::initialised = .false.

Definition at line 36 of file basis functions.f90.

36 logical, protected :: initialised = .false. ! Flag set by initialisation routine, checked by other routines

Referenced by deinitialise_basis(), discrete_laplacian_reduced(), initialise_basis(), reduced_hamiltonian_2_ \leftarrow electrons(), reduced_hamiltonian_slater_1s(), reduced_hamiltonian_sto3g(), wave_function_2_electrons(), wave \leftarrow _function_slater_1s(), and wave_function_sto3g().

11.1.3.8 mno_parameters

```
\verb|integer|, dimension(:,:)|, allocatable|, protected basis_functions::mno_parameters|\\
```

Definition at line 57 of file basis functions.f90.

```
57 integer, protected, allocatable, dimension(:,:) :: mno_parameters ! Parameters that specify the particular choice of Jastrow term
```

Referenced by deinitialise_basis(), mno_allocate(), and wave_function_2_electrons().

11.1.3.9 n_atoms

```
integer, protected basis_functions::n_atoms
```

Definition at line 41 of file basis_functions.f90.

```
41 integer, protected :: n_atoms ! Number of atoms
```

Referenced by initialise_basis(), reduced_hamiltonian_2_electrons(), reduced_hamiltonian_slater_1s(), reduced \(-\text{hamiltonian_sto3g()}, \text{ wave_function_slater_1s()}, \text{ and wave_function_sto3g()}.

11.1.3.10 n_basis_functions_per_atom

```
integer, protected basis_functions::n_basis_functions_per_atom
```

Definition at line 40 of file basis functions.f90.

```
40 integer, protected :: n_basis_functions_per_atom ! Number of linear terms in the single-electron wavefunction per atom
```

Referenced by initialise_basis(), reduced_hamiltonian_slater_1s(), reduced_hamiltonian_sto3g(), wave_function = _slater_1s(), and wave_function_sto3g().

11.1.3.11 n_dofs_no_jastrow

```
integer, protected basis_functions::n_dofs_no_jastrow
```

Definition at line 56 of file basis_functions.f90.

```
56 integer, protected :: n_dofs_no_Jastrow ! Number of dofs without Jastrow term, for convenience
```

Referenced by initialise_basis(), wave_function_2_electrons(), wave_function_slater_1s(), and wave_function_← sto3g().

11.1.3.12 n_dofs_per_atom

integer, protected basis_functions::n_dofs_per_atom

Definition at line 55 of file basis functions.f90.

55 integer, protected :: n_dofs_per_atom ! Number of dofs per atom, for convenience

Referenced by initialise_basis(), reduced_hamiltonian_slater_1s(), reduced_hamiltonian_sto3g(), wave_function ← _slater_1s(), and wave_function_sto3g().

11.1.3.13 n_electrons

integer, protected basis_functions::n_electrons

Definition at line 39 of file basis functions.f90.

39 integer, protected :: n_electrons ! Number of electrons

Referenced by initialise_basis().

11.1.3.14 n_jastrow_dofs

integer, protected basis_functions::n_jastrow_dofs

Definition at line 43 of file basis_functions.f90.

43 integer, protected :: n_Jastrow_dofs ! Number of dofs in the Jastrow (interaction) term

Referenced by initialise_basis(), mno_allocate(), and wave_function_2_electrons().

11.1.3.15 n_space_dims

integer, protected basis_functions::n_space_dims

Definition at line 51 of file basis functions.f90.

51 integer, protected :: n_space_dims ! Number of space dimensions, 3*n_electrons, for convenience

Referenced by bond_length_driver(), discrete_laplacian_reduced(), initialise_basis(), main_driver(), reduced_\lefthamiltonian_2_electrons(), reduced_hamiltonian_slater_1s(), reduced_hamiltonian_sto3g(), wave_function_2_\lefthamiltonian_slater_1s(), and electron density functions::wave function normalisation().

11.1.3.16 number_dofs

integer, protected basis_functions::number_dofs

Definition at line 50 of file basis functions.f90.

50 integer, protected :: number_dofs ! Total number of degrees of freedom (dofs) in the wavefunction

Referenced by bond_length_driver(), discrete_laplacian_reduced(), initialise_basis(), main(), main_driver(), reduced_hamiltonian_2_electrons(), reduced_hamiltonian_slater_1s(), reduced_hamiltonian_sto3g(), and wave_
function 2 electrons().

11.1.3.17 proton numbers

real(dp), dimension(:), allocatable, protected basis_functions::proton_numbers

Definition at line 47 of file basis_functions.f90.

47 real(dp),dimension(:),allocatable, protected :: proton_numbers ! Proton Numbers of atoms

Referenced by deinitialise_basis(), initialise_basis(), reduced_hamiltonian_2_electrons(), reduced_hamiltonian_\circ\installater 1s(), and reduced_hamiltonian_sto3g().

11.1.3.18 reduced_hamiltonian

procedure(wave_function_interface), pointer basis_functions::reduced_hamiltonian

Definition at line 21 of file basis_functions.f90.

21 procedure(wave_function_interface), pointer :: reduced_hamiltonian

Referenced by bond_length_driver(), initialise_basis(), main(), and main_driver().

11.1.3.19 wave function

procedure(wave_function_interface), pointer basis_functions::wave_function

Definition at line 20 of file basis_functions.f90.

20 procedure(wave_function_interface), pointer :: wave_function

Referenced by calculations::calc(), discrete_laplacian_reduced(), electron_density_functions::electron_density(), initialise_basis(), log_density(), log_rho_mod::log_rho(), and electron_density_functions::wave_function_ \leftarrow normalisation().

11.1.3.20 wave_function_single

procedure(wave_function_interface), pointer basis_functions::wave_function_single

Definition at line 60 of file basis functions.f90.

60 procedure(wave_function_interface), pointer :: wave_function_single

Referenced by initialise_basis(), and wave_function_2_electrons().

11.2 biased_optim Module Reference

Biased optimization subroutines and functions.

Data Types

· interface bi_op_init

Functions/Subroutines

- logical function find_restart_file ()
- subroutine bi_op_init_constant_mean (param_init_data, energy_init_data, n_data_in, n_dof_in, ker_var, ker_lengthscale, constant_mean_prior, optim_rate_para, optim_no_samples, n_threads, n_loops_to_do)
- subroutine bi_op_init_arb_mean (param_init_data, energy_init_data, n_data_in, n_dof_in, ker_var, ker_ ⇔ lengthscale, mean_prior_func, mean_prior_dx, optim_rate_para, optim_no_samples, n_threads, n_loops_ ⇔ to_do)
- real(dp) function, dimension(threads, n_dof) bi_op_step (param_update_data, energy_update_data, n_← new_data, threads, seed, n_cycles)

Variables

• logical gp uptodate = .False.

11.2.1 Detailed Description

Biased optimization subroutines and functions.

11.2.2 Function/Subroutine Documentation

11.2.2.1 bi_op_init_arb_mean()

```
subroutine biased_optim::bi_op_init_arb_mean (
               real(dp), dimension(n_data_in, n_dof_in), intent(in) param_init_data,
               real(dp), dimension(n_data_in), intent(in) energy_init_data,
               integer, intent(in) n_data_in,
               integer, intent(in) n_dof_in,
               real(dp), intent(in) ker_var,
               real(dp), intent(in) ker_lengthscale,
               procedure(mean_func_interface) mean_prior_func,
               procedure(mean_func_interface_dx) mean_prior_dx,
               real(dp), intent(in) optim_rate_para,
               integer, intent(in) optim_no_samples,
               integer, intent(in) n_threads,
               integer, intent(inout) n_loops_to_do )
Definition at line 134 of file Biased_Optim.f90.
           implicit none
135
           integer, intent(inout) :: n_loops_to_do
136
           integer, intent(in) :: n_data_in, n_dof_in, optim_no_samples,n_threads
           real(dp), dimension(n_data_in, n_dof_in), intent(in) :: param_init_data
real(dp), dimension(n_data_in), intent(in) :: energy_init_data
137
138
           real(dp), intent(in) :: ker_var, ker_lengthscale, procedure(mean_func_interface) :: mean_prior_func
139
                                                                optim rate para
140
141
           procedure(mean_func_interface_dx) :: mean_prior_dx
142
143
           n_dof = n_dof_in
           gamma = optim_rate_para
144
           no_samples=optim_no_samples
145
147
           call gp_init(mean_prior_func, mean_prior_dx, ker_var, ker_lengthscale, param_init_data,
       energy_init_data,&
148
            n_data_in, n_dof_in, n_threads)
149
           gp_uptodate = .false.
150
151
           current_best_e = minval(energy_init_data)
```

References gp_uptodate.

11.2.2.2 bi op init constant mean()

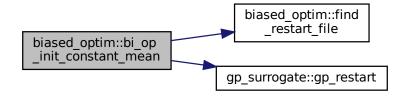
```
subroutine biased_optim::bi_op_init_constant_mean (
             real(dp), dimension(n_data_in, n_dof_in), intent(in) param_init_data,
             real(dp), dimension(n_data_in), intent(in) energy_init_data,
             integer, intent(in) n_data_in,
             integer, intent(in) n_dof_in,
             real(dp), intent(in) ker_var,
             real(dp), intent(in) ker_lengthscale,
             real(dp), intent(in) constant_mean_prior,
             real(dp), intent(in) optim_rate_para,
             integer, intent(in) optim_no_samples,
             integer, intent(in) n_threads,
             integer, intent(inout) n_loops_to_do )
Definition at line 84 of file Biased_Optim.f90.
```

```
implicit none
                 integer, intent(inout) :: n_loops_to_do
86
                 integer, intent(in) :: n_data_in, n_dof_in, optim_no_samples,n_threads
                real(dp), dimension(n_data_in, n_dof_in), intent(in) :: param_init_data
real(dp), dimension(n_data_in), intent(in) :: energy_init_data
real(dp), intent(in) :: ker_var, ker_lengthscale, constant_mean_prior, optim_rate_para
87
88
89
                integer gp_n_data, gp_n_dof, n_cycles
```

```
real(dp) :: kernel_var, kernal_inv_length
           real(dp), dimension(:,:), allocatable :: param_data
93
           real(dp), dimension(:), allocatable :: E_data
94
           real(dp), dimension(:,:), allocatable :: param_pres, param_cov
9.5
           real(dp), dimension(:), allocatable :: data_mean
96
           if (find_restart_file()) then
98
               call read_restart_file_sizes(gp_n_data, gp_n_dof)
99
               allocate(param_data(gp_n_data, gp_n_dof))
100
                allocate(e_data(gp_n_data))
101
                \verb|allocate(param_pres(gp_n_data, gp_n_data))||\\
102
                allocate(param_cov(gp_n_data, gp_n_data))
103
                allocate (data mean (qp n data))
104
                call read_restart_file_data(n_cycles, no_samples, current_best_e,&
105
                constant_mean_value, kernel_var, gamma, kernal_inv_length,&
106
                gp_n_data, e_data, gp_n_data, data_mean, gp_n_data, gp_n_data, param_pres, &
107
                {\tt gp\_n\_data, \; gp\_n\_data, \; param\_pres, \; gp\_n\_data, \; gp\_n\_dof, \; param\_data)}
108
                n_dof = gp_n_dof
109
                call gp_restart(gp_n_data, gp_n_dof,kernel_var, kernal_inv_length,&
111
                param_data, e_data,param_pres, param_cov, data_mean, constant_mean,&
112
                 zero_func, n_threads)
113
                gp\_uptodate = .false.
                current best e = minval(e data)
114
115
                n_loops_to_do=n_loops_to_do-(n_cycles-1)
116
            else
117
                constant_mean_value = constant_mean_prior
                gamma = optim_rate_para
118
119
                no_samples=optim_no_samples
120
                n\_dof = n\_dof\_in
121
122
                call gp_init(constant_mean, zero_func, ker_var, ker_lengthscale, param_init_data,
       energy_init_data, n_data_in,&
                 n_dof_in,n_threads)
123
124
                gp_uptodate = .false.
125
126
                current_best_e = minval(energy_init_data)
127
```

References find_restart_file(), gp_surrogate::gp_restart(), and gp_uptodate.

Here is the call graph for this function:



11.2.2.3 bi_op_step()

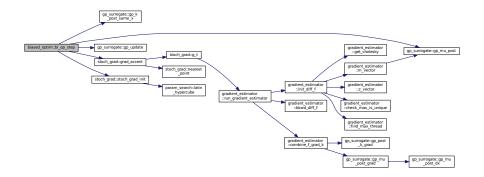
Definition at line 157 of file Biased_Optim.f90.

```
implicit none
158
               integer, intent(in) :: n_new_data, n_cycles
159
               integer, intent(in) :: threads !number of threads/restarts goes here
160
               integer, dimension(:), intent(IN):: seed
               real(dp), dimension(n_new_data, n_dof), intent(in) :: param_update_data real(dp), dimension(n_new_data), intent(in) :: energy_update_data
161
162
               real(dp), dimension(threads, threads, n_dof) :: per_thread_best_loc
163
164
               real(dp), dimension(0:threads) :: m,z
165
               real(dp), dimension(0:threads,0:threads) :: c
               \verb|real(dp), dimension(threads)| :: per\_thread\_best\_qei|\\
166
               real(dp), dimension(threads,n_dof) :: best_locs
real(dp) :: best_E_in_batch
integer :: i, j, best_restart, n_seed, gp_n_data, gp_n_dof
167
168
169
170
               real(dp) :: kernel_var, kernal_inv_length
              real(dp), dimension(:,:), allocatable :: param_data real(dp), dimension(:), allocatable :: E_data real(dp), dimension(:,:), allocatable :: param_pres, param_cov real(dp), dimension(:), allocatable :: data_mean
171
172
173
174
175
176
               if (gp_uptodate) then
177
                    call gp_update(param_update_data, energy_update_data, n_new_data, 'F')
               end if
178
179
180
               !updating best point
181
              best_e_in_batch = minval(energy_update_data)
182
               if (best_e_in_batch < current_best_e) current_best_e=best_e_in_batch</pre>
183
               print*, current_best_e
184
185
               call stoch_grad_init(threads,current_best_e,seed)
186
187
               ! !doing the restart file thing
188
               ! call gp_return_size_data(gp_n_data, gp_n_dof)
189
               ! allocate(param_data(gp_n_data, gp_n_dof))
190
               ! allocate(E_data(gp_n_data))
191
               ! allocate(param_pres(gp_n_data, gp_n_data))
               ! allocate(param_cov(gp_n_data, gp_n_data))
! allocate(data_mean(gp_n_data))
192
193
194
               ! call gp_return_state_data(kernel_var, kernal_inv_length, param_data, E_data,&
195
               ! param_pres, param_cov, data_mean)
196
               ! !assuming calling order of (scalars(rank 0),..., vector_dim, vector(rank 1),...,
        matrix_dim_1, matrix_dim2, matrix(rank 2))
197
               ! call write_restart_file(gp_n_data, gp_n_dof,n_cycles,no_samples, current_best_E,&
! constant_mean_value, gamma, kernel_var, kernal_inv_length, &
! gp_n_data, E_data, gp_n_data, data_mean, gp_n_data, gp_n_data, param_pres, &
198
199
200
               ! gp_n_data, gp_n_data, param_pres, gp_n_data, gp_n_dof, param_data)
201
202
203
               !doing grad_accent, can be parrallel
204
               !$OMP parallel do default(shared) private(i,m,c,z)
               do i=1, threads
205
206
                    !the "no change" state
207
                    z=0.0_dp
208
                    m=0.0_dp
                    \verb|call grad_accent(n_points(i,:,:), threads, \verb|no_samples, gamma, per_thread_best_loc(i,:,:))| \\
209
210
                   m(1:threads) = current_best_e-gp_mu_post(per_thread_best_loc(i,:,:), threads)
call get_cholesky(c, gp_k_post_same_x(per_thread_best_loc(i,:,:), threads))
212
213
                    !c = -get\_cholesky(gp\_k\_post\_same\_x(per\_thread\_best\_loc(i,:,:), threads))
                   do j=1, no_samples
   z(1:threads) = gaussian(threads)
214
215
216
                         per_thread_best_qei(i) = maxval(m + matmul(c, z))
217
                    end do
218
              end do
219
220
221
               best_restart = maxloc(per_thread_best_qei,dim=1)
222
223
               best locs = per thread best loc(best restart,:,:)
225
               gp_uptodate = .true.
226
```

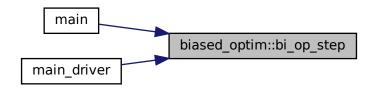
References gp_surrogate::gp_k_post_same_x(), gp_surrogate::gp_mu_post(), gp_surrogate::gp_update(), gp_ \leftarrow uptodate, stoch_grad::grad_accent(), stoch_grad::n_points, and stoch_grad::stoch_grad_init().

Referenced by main(), and main_driver().

Here is the call graph for this function:



Here is the caller graph for this function:



11.2.2.4 find_restart_file()

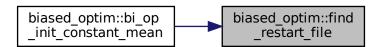
logical function biased_optim::find_restart_file

Definition at line 74 of file Biased_Optim.f90.

```
74 implicit none
75 logical:: retval
76
77 retval=.false.
78
```

Referenced by bi_op_init_constant_mean().

Here is the caller graph for this function:



11.2.3 Variable Documentation

11.2.3.1 gp_uptodate

```
logical biased_optim::gp_uptodate = .False.

Definition at line 15 of file Biased_Optim.f90.
15    logical :: GP_uptodate = .false.

Referenced by bi_op_init_arb_mean(), bi_op_init_constant_mean(), and bi_op_step().
```

11.3 calculations Module Reference

Function completing calculations of either the wavefunction or electron density (depending on the system) at a set of coordinates [x,y,0] on a grid of equally spaced points on a xy grid.

Functions/Subroutines

• real(dp) function, dimension(:), allocatable calc (dof, points, box, n_ele, n_MCMC_steps)

calc function returns the wavefunction or electron density evaluated on a 2D xy plane (taking a slice) depending on the number of electrons in the system.

11.3.1 Detailed Description

Function completing calculations of either the wavefunction or electron density (depending on the system) at a set of coordinates [x,y,0] on a grid of equally spaced points on a xy grid.

11.3.2 Function/Subroutine Documentation

11.3.2.1 calc()

calc function returns the wavefunction or electron density evaluated on a 2D xy plane (taking a slice) depending on the number of electrons in the system.

Sets the z coordinate to 0 as only evaluating on a xy plane.

Parameters

in	points	points is the user defined number of evaluation points for the plotting grid.	
	n_ele	is the number of electrons in the system	
	n_MCMC_steps	is the number of steps needed for the MCMC used for evaluating the electron	
		density for the 2 electron case.	
in	n_ele	points is the user defined number of evaluation points for the plotting grid.	
	n_ele	is the number of electrons in the system	
n_MCMC_steps is the number of steps needed for the MCMC used for eva		is the number of steps needed for the MCMC used for evaluating the electron	
density for the 2 electron case.		density for the 2 electron case.	
in n_mcmc_steps points is the user defined number of evaluation points		points is the user defined number of evaluation points for the plotting grid.	
	n_ele	is the number of electrons in the system	
	n_MCMC_steps	is the number of steps needed for the MCMC used for evaluating the electron	
density for the 2 electron case.		density for the 2 electron case.	
in	box	box is the user defined size of the domain of the system wanting to be looked at.	
in	dof	dof is the optimal degrees of freedom	

Returns

Parameters

Г	/-	
	caic	Ouput array which contains the results of the function

This allocates memory to the array based on the number of grid points defined by the user.

Uses wave_function_normalisation which returns the wave_norm_squared

This is for the 1 electron case, will just calculate and returns the wavefunction. Uses the wave_function function.

Track puts the result in the right place in the resulting output calc array.

Calculating the positions for input and gives coordinates between -box/2 to box/2

Returns the result of the wavefunction evaluated at one coordinate point using wave_function function.

Divides the result by the square root of the results from the wave norm squared result defined earlier.

For the 2 electron case, will calculate and return the electron density. Uses the electron_density function

Calculating the positions for input

Returns the result of the electron density evaluated at one coordinate point using electron_density function.

Divides the result by the results from the wave_norm_squared result defined earlier.

Returns a error print statement if the number of electrons is not defined.

Definition at line 18 of file calc.f90.

```
18
19 IMPLICIT NONE
20 INTEGER, PARAMETER :: dp=kind(1.0d0)
24 INTEGER, INTENT(IN) :: points, n_ele, n_MCMC_steps
26 real(dp),intent(in) :: box
```

```
REAL(dp), DIMENSION(:), INTENT(IN) :: dof
28
        INTEGER :: array_len, track, i,j
31
        REAL(dp) :: a,b
32
        real(dp), dimension(3,2) :: box_in
34
       real(dp) :: wave_norm_squared
REAL(dp), DIMENSION(:), ALLOCATABLE :: calc
36
38
39
         box_in(i,:) = [-box,box]
40
        end do
41
        array_len = (abs(points) + abs(points) + 1)**2
43
        ALLOCATE(calc(array_len))
44
45
47
        wave_norm_squared = wave_function_normalisation(box_in,dof,n_mcmc_steps)
48
49
        IF (n_ele .eq. 1) THEN
51
52
         DO i = -points, points
            DO j = -points, points
              track = track + 1

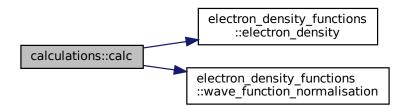
a = (real(i) / (abs(points) + abs(points)))*box

b = (real(j) / (abs(points) + abs(points)))*box
56
58
59
               calc(track) = wave_function([a,b,0.0d0], dof)
            END DO
62
          END DO
65
         calc = calc/sqrt(wave_norm_squared)
66
       ELSE IF (n_ele .eq. 2) THEN
68
69
70
          DO i = -points, points
            DO j = -points, points
              track = track + 1
73
              a = (real(i) / (abs(points) + abs(points)))*box
b = (real(j) / (abs(points) + abs(points)))*box
75
              calc(track) = electron_density([a,b,0.0d0],box_in, dof, n_mcmc_steps )
          calc = calc/wave_norm_squared
82
84
          print*, 'Incorrect number of electrons in output calculation'
8.5
86
```

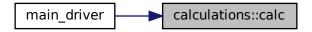
References electron_density_functions::electron_density(), basis_functions::wave_function, and electron_density _ functions::wave_function_normalisation().

Referenced by main_driver().

Here is the call graph for this function:



Here is the caller graph for this function:



11.4 component functions Module Reference

Basic subfunctions This module contains basic functions used in basis functions.f90.

Functions/Subroutines

- real(dp) function centered_gaussian (position, alpha)
 - Gaussian distribution centred at the origin.
- real(dp) function centered_gaussian_laplacian (position, alpha)
 - Analytic Laplacian of Gaussian distribution centred at the origin.
- real(dp) function centered_slater_1s (position, zeta)
 - Slater-1s distribution centred at the origin.
- real(dp) function centered_slater_1s_laplacian (position, zeta)
 - Analytic Laplacian of Slater-1s distribution centred at the origin.
- real(dp) function correlation_range (r, d)
 - Functions that construct the Jastrow interaction function Notation here follows Schmidt and Moskowitz 1990, refered to as SM90.
- real(dp) function correlation_subterm (r_12, r_l1, r_l2, m, n, o)
 - Jastrow subfuction: basic subterm Subterm of the correlation function, one for each Jastrow dof per atom This is the term in the k sum in Schmidt and Moskowitz 1990.
- real(dp) function correlation_atom_term (atom_coord, electron_coords, mno_parameters, c, b, d)
 - Jastrow subfuction: atom subterm Correlation term for each atom.
- real(dp) function correlation_function (atom_coords, electron_coords, mno_parameters, c, b, d)
 - Jastrow correlation fuction Function F from Schmidt and Moskowitz 1990.

11.4.1 Detailed Description

Basic subfunctions This module contains basic functions used in basis_functions.f90.

11.4.2 Function/Subroutine Documentation

11.4.2.1 centered_gaussian()

Gaussian distribution centred at the origin.

Parameters

in	position	Space Coordinate
in	alpha	Length scale

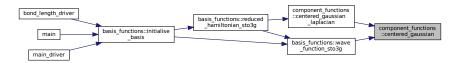
Definition at line 11 of file component_functions.f90.

```
implicit none
real(dp) :: centered_gaussian
real(dp), dimension(3), intent(in) :: position
real(dp), intent(in) :: alpha
centered_gaussian = (2.0_dp * alpha /pi)**(0.75_dp)*exp(-alpha * dot_product(position,position))
```

References shared_constants::pi.

Referenced by centered gaussian laplacian(), and basis functions::wave function sto3g().

Here is the caller graph for this function:



11.4.2.2 centered_gaussian_laplacian()

Analytic Laplacian of Gaussian distribution centred at the origin.

Parameters

in	position	Space Coordinate
in	alpha	Length scale

Definition at line 22 of file component_functions.f90.

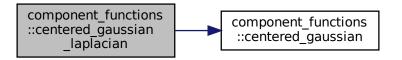
```
implicit none
real(dp) :: centered_gaussian_laplacian
real(dp), dimension(3), intent(in) :: position
real(dp), intent(in) :: alpha

centered_gaussian_laplacian = &
(-6.0_dp*alpha + 4.0_dp*alpha**2*dot_product(position,position))*centered_gaussian(position,alpha)
```

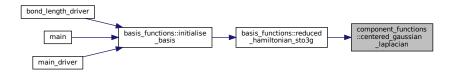
References centered_gaussian().

Referenced by basis_functions::reduced_hamiltonian_sto3g().

Here is the call graph for this function:



Here is the caller graph for this function:



11.4.2.3 centered_slater_1s()

Slater-1s distribution centred at the origin.

Parameters

in	position	Space Coordinate
in	zeta	Length scale

Definition at line 35 of file component functions.f90.

```
implicit none
real(dp) :: centered_slater_1s
real(dp), intent(in) :: position
real(dp), intent(in) :: zeta

centered_slater_1s = ( zeta**3 /pi)**(0.5_dp)*exp(-zeta * norm2(position))
```

References shared_constants::pi.

Referenced by centered_slater_1s_laplacian(), and basis_functions::wave_function_slater_1s().

Here is the caller graph for this function:



11.4.2.4 centered_slater_1s_laplacian()

Analytic Laplacian of Slater-1s distribution centred at the origin.

Parameters

in	position	Space Coordinate
in	zeta	Length scale

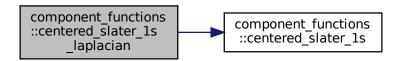
Definition at line 47 of file component_functions.f90.

```
47
48 implicit none
49 real(dp):: centered_slater_1s_laplacian
51 real(dp), dimension(3), intent(in):: position
53 real(dp), intent(in):: zeta
54
55 centered_slater_1s_laplacian = &
56 (-2.0_dp*zeta/norm2(position) + zeta**2)*centered_slater_1s(position, zeta)
```

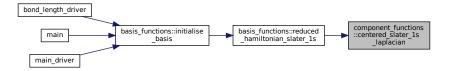
References centered_slater_1s().

Referenced by basis_functions::reduced_hamiltonian_slater_1s().

Here is the call graph for this function:



Here is the caller graph for this function:



11.4.2.5 correlation_atom_term()

Jastrow subfuction: atom subterm Correlation term for each atom.

U_I12 from Schmidt and Moskowitz 1990

Parameters

in	atom_coord	Space coordinates of atom
in	electron_coords	Space positions of electrons
in	mno_parameters	Jastrow interger parameters
in	С	Jastrow dofs
in	Ь	Inverse lengthscale of nuclear-electron interaction
in	d	Inverse lengthscale of electron-electron interaction

Definition at line 105 of file component functions.f90.

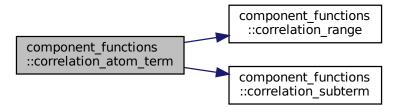
```
105
106
          implicit none
107
         real(dp) :: correlation_atom_term
         real(dp), dimension(3), intent(in) :: atom_coord real(dp), dimension(6), intent(in) :: electron_coords
109
111
113
          integer, dimension(:,:), intent(in) :: mno_parameters
115
          real(dp), dimension(:), intent(in) :: c
         real(dp), intent(in) :: b
real(dp), intent(in) :: d
117
119
120
121
         ! Internal variables
         real(dp) :: r_12 ! Distance between electrons real(dp) :: r_II ! Distance from atom to electron 1 real(dp) :: r_II ! Distance from atom to electron 2
122
123
124
         integer :: k ! Loop variable
125
126
127
          ! Compute distances
128
         r_12 = correlation_range(norm2(electron_coords(1:3)-electron_coords(4:6)),d)
129
          r_i1 = correlation_range(norm2(atom_coord-electron_coords(1:3)),b)
130
         r_i2 = correlation_range(norm2(atom_coord-electron_coords(4:6)),b)
131
132
          ! k sum from Schmidt and Moskowitz 1990 to compute U I12
133
         correlation_atom_term = 0.0_dp
134
         do k = 1, size(mno_parameters,2)
```

```
correlation_atom_term = correlation_atom_term + &
    c(k) *correlation_subterm(r_12,r_i1,r_i2,mno_parameters(1,k),mno_parameters(2,k)&
    ,mno_parameters(3,k))
end do
```

References correlation_range(), and correlation_subterm().

Referenced by correlation function().

Here is the call graph for this function:



Here is the caller graph for this function:



11.4.2.6 correlation_function()

Jastrow correlation fuction Function F from Schmidt and Moskowitz 1990.

Parameters

in	atom_coords	Coordinates of atoms	
in	electron_coords	Coordinates of electrons	
in	mno_parameters	Jastrow interger parameters	
in	С	Jastrow dofs	
in	b	Inverse lengthscale of nuclear-electron interaction	
in	d	Inverse lengthscale of electron-electron interaction	

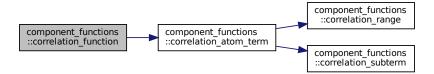
Definition at line 145 of file component_functions.f90.

```
real(dp) :: correlation_function
         real(dp), dimension(:,:), intent(in) :: atom_coords
real(dp), dimension(6), intent(in) :: electron_coords
147
149
         integer, dimension(:,:), intent(in) :: mno_parameters real(dp), <math>dimension(:), intent(in) :: c real(dp), intent(in) :: b
151
153
155
157
         real(dp), intent(in) :: d
158
159
         integer :: i ! Loop variable
160
         correlation_function = 0.0_dp
161
         do i = 1, size(atom_coords, 2) ! sum over atoms
162
163
            correlation_function = correlation_function +&
164
             correlation_atom_term(atom_coords(:,i),electron_coords,mno_parameters,c,b,d)
165
166
          ! Compute exponential
         correlation_function = exp(correlation_function)
167
```

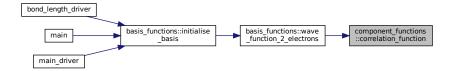
References correlation_atom_term().

Referenced by basis_functions::wave_function_2_electrons().

Here is the call graph for this function:



Here is the caller graph for this function:



11.4.2.7 correlation_range()

Functions that construct the Jastrow interaction function Notation here follows Schmidt and Moskowitz 1990, refered to as SM90.

Jastrow subfuction: correlation range \$\bar{r}\$ function in Schmidt and Moskowitz 1990

Parameters

in	r	distance
in	d	inverse length scale

Definition at line 65 of file component_functions.f90.

```
65   implicit none
66   real(dp) :: correlation_range
68   real(dp), intent(in) :: r
70   real(dp), intent(in) :: d
71
72   correlation_range = d * r/(1+d*r)
```

Referenced by correlation_atom_term().

Here is the caller graph for this function:



11.4.2.8 correlation_subterm()

Jastrow subfuction: basic subterm Subterm of the correlation function, one for each Jastrow dof per atom This is the term in the k sum in Schmidt and Moskowitz 1990.

Parameters

in	<u>r_</u> 12	Distance between electrons	
in	r_i1	Distance from atom to electron 1	
in	r_i2	Distance from atom to electron 2	
in	m	Triple of integer parameters. This is a row of mno_parameters	
in	n	Triple of integer parameters. This is a row of mno_parameters	
in	0	Triple of integer parameters. This is a row of mno_parameters	

Definition at line 79 of file component_functions.f90.

```
79 implicit none
80 real(dp) :: correlation_subterm
82 real(dp), intent(in) :: r_12
84 real(dp), intent(in) :: r_I1
86 real(dp), intent(in) :: r_I2
88 integer,intent(in) :: m, n, o
```

```
90 real(dp) :: delta ! coefficient to match Schmidt and Moskowitz 1990
91
92 ! Value of delta, following Schmidt and Moskowitz 1990
93 if (m==n) then
94 delta = 0.5_dp
95 else
96 delta = 1.0_dp
97 end if
98
99 correlation_subterm = delta * (r_i1**m*r_i2**n+r_i1**n*r_i2**m)*r_12**o
```

Referenced by correlation_atom_term().

Here is the caller graph for this function:



11.5 electron_density_functions Module Reference

Electron density function.

Functions/Subroutines

- real(dp) function electron_density (fixed_position, integral_bounds, dof_coefficients, n_MC_points, seed_in)

 Computes electron density for 2 electron simulations Uses basic Monte Carlo Integration.
- real(dp) function wave_function_normalisation (integral_bounds, dof_coefficients, n_MC_points, seed_in)

 Computes the integral of the wavefunction squared To normalise the wavefunction for outputing Uses basic Monte Carlo Integration.

11.5.1 Detailed Description

Electron density function.

11.5.2 Function/Subroutine Documentation

11.5.2.1 electron_density()

Computes electron density for 2 electron simulations Uses basic Monte Carlo Integration.

Parameters

in	fixed_position	fixed_position Space position of density
in	integral_bounds	integral_bounds bounds of integration box
in	dof_coefficients	dof_coefficients Current dof parameters
in	n_mc_points	n_MC_points Number of Monte Carlo Points
in	seed_in	seed_in input seed

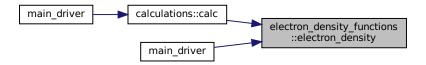
Definition at line 11 of file electron density.f90.

```
real(dp) :: electron_density
real(dp), dimension(3), intent(in) :: fixed_position
13
15
       real(dp), dimension(3,2), intent(in) :: integral_bounds
17
       real(dp), dimension(:), intent(in) :: dof_coefficients
19
       integer, intent(in) :: n_MC_points
2.1
       integer, intent(in),optional :: seed_in
22
       integer, allocatable :: seed(:)
       integer :: i ! loop variables
integer :: n
23
24
25
       real(dp) :: x,y,z,Lx,Ly,Lz
26
       real(dp), dimension(6) :: position_total
if (present(seed_in)) then
27
28
         call random_seed(size=n)
         allocate(seed(n))
29
30
         seed = seed_in
31
         call random_seed(put=seed)
       end if
33
34
       do i=1,3
       if ((integral_bounds(i,2)-integral_bounds(i,1)) <= 0.1) then</pre>
35
        print*, "Error, box too small or bounds incorrect"
36
38
       end do
       position_total(1:3) = 0.0_dp
position_total(4:6) = fixed_position
39
40
       lx = integral_bounds(1,2)-integral_bounds(1,1)
41
       ly = integral_bounds(2,2)-integral_bounds(2,1)
42
       1z = integral_bounds(3,2)-integral_bounds(3,1)
43
44
       !$OMP parallel do default(shared) private(i,x,y,z) firstprivate(position_total)
       reduction(+:electron_density)
45
       do i=1,n_mc_points
46
         call random_number(x)
         call random_number(y)
47
48
         call random_number(z)
49
         x = lx * x + integral\_bounds(1,1)
50
         y = ly*y + integral\_bounds(2,1)
         z = 1z*z + integral\_bounds(3,1)
51
52
         position\_total(4:6) = [x,y,z]
         electron_density = electron_density+wave_function(position_total,dof_coefficients)**2
53
54
       end do
       electron_density = 2*lx*ly*lz*electron_density/n_mc_points
       if (allocated(seed)) deallocate(seed)
```

References basis functions::wave function.

Referenced by calculations::calc(), and main_driver().

Here is the caller graph for this function:



11.5.2.2 wave_function_normalisation()

Computes the integral of the wavefunction squared To normalise the wavefunction for outputing Uses basic Monte Carlo Integration.

Parameters

in	integral_bounds	bounds of integration box
in	dof_coefficients	Current dof parameters
in	n_mc_points	Number of Monte Carlo Points
in	seed_in	input seed

Definition at line 63 of file electron_density.f90.

```
real(dp) :: wave_function_normalisation
       real(dp), dimension(3,2), intent(in) :: integral\_bounds
65
       real(dp), dimension(:), intent(in) :: dof_coefficients
integer, intent(in) :: n_MC_points
integer, intent(in),optional :: seed_in
67
69
72
       integer, allocatable :: seed(:)
73
       integer :: i ! loop variables
       integer :: n
real(dp) :: x,y,z,Lx,Ly,Lz
74
75
76
       real(dp), dimension(:),allocatable :: position_total
       if (present(seed_in)) then
        call random_seed(size=n)
79
         allocate(seed(n))
80
         seed = seed_in
81
         call random_seed(put=seed)
82
       end if
83
       do i=1,3
85
       if ((integral_bounds(i,2)-integral_bounds(i,1)) <= 0.1) then
86
         print*, "Error, box too small or bounds incorrect"
87
       end if
88
       end do
       allocate(position_total(n_space_dims))
89
       lx = integral_bounds(1,2)-integral_bounds(1,1)
       ly = integral_bounds(2,2)-integral_bounds(2,1)
91
92
       lz = integral_bounds(3,2)-integral_bounds(3,1)
       !$OMP parallel do default(shared) private(i,x,y,z) firstprivate(position_total) reduction(+:wave_function_normalisation)
93
94
       do i=1,n_mc_points
95
       call random_number(x)
         call random_number(y)
97
         call random_number(z)
98
         x = lx*x + integral\_bounds(1,1)
99
         y = ly*y + integral\_bounds(2,1)

z = lz*z + integral\_bounds(3,1)
100
101
          position\_total(1:3) = [x,y,z]
          if (n_space_dims == 6) then
102
103
            call random_number(x)
104
            call random_number(y)
105
            call random_number(z)
106
            x = 1x * x + integral\_bounds(1,1)
            y = ly*y + integral_bounds(2,1)
107
             z = 1z*z + integral\_bounds(3,1)
108
109
            position_total(4:6) = [x,y,z]
110
111
          wave_function_normalisation = wave_function_normalisation&
112
             +wave_function(position_total,dof_coefficients) **2
113
        end do
114
        wave\_function\_normalisation = 1x*1y*1z*wave\_function\_normalisation/n\_mc\_points
        if (n_space_dims == 6) ther
116
          wave_function_normalisation = lx*ly*lz*wave_function_normalisation
117
        end i
         if (allocated(seed)) deallocate(seed)
118
119
        deallocate (position_total)
```

References basis_functions::n_space_dims, and basis_functions::wave_function.

Referenced by calculations::calc().

Here is the caller graph for this function:



11.6 energy_plotting Namespace Reference

Script outputs the energy against the bond length.

Variables

- data = np.loadtxt('energies.txt')
 Loading in the data from the energies.txt.
- bond_length = data[:,0]
- energy = data[:,1]

11.6.1 Detailed Description

Script outputs the energy against the bond length.

11.6.2 Variable Documentation

11.6.2.1 bond_length

```
energy_plotting.bond_length = data[:,0]
```

Parameters

bond_length | contains all the bond lengths evaluated

Definition at line 14 of file energy_plotting.py.

11.6.2.2 data

energy_plotting.data = np.loadtxt('energies.txt')

Loading in the data from the energies.txt.

Parameters

data contains the bond lengths and energy conatined in the energies.txt file

Definition at line 10 of file energy_plotting.py.

11.6.2.3 energy

```
energy_plotting.energy = data[:,1]
```

Parameters

energy conatins the energy results evaluated at their corresponding bond_lengths

Definition at line 16 of file energy_plotting.py.

11.7 gp_surrogate Module Reference

Gaussian process surrogate submodules and functions.

Data Types

- interface cov_kernal_dx_1_interface
- interface cov_kernal_interface
- interface cov_kernal_xx_dx_interface
- interface gp_init

general initialisation function, see gp_init_gausscov

interface gp_k_post

function for postieror covairance kernal use in format x_1 , x_2 , x_1 dim, x_2 dim for $cov(x_1,x_2)$ use in format x, x_2 dim for cov(x,x)

- interface mean_func_interface
- interface mean_func_interface_dx

Functions/Subroutines

• subroutine gp_init_gausscov (mean_prior, mean_prior_dx, ker_var, ker_length, param_data_in, E_data_in, n_data_in, n_dof_in, n_threads_in)

intialises with a gaussian covariance

- subroutine gp_init_arbcov (mean_prior, cov_prior, param_data_in, E_data_in, n_data_in, n_dof_in)
 - do not use, don't have a function for the dervatives of the kernal/mean
- real(dp) function, dimension(x_dim) gp_mu_post (x, x_dim)

posterior mean

```
    real(dp) function gp_mu_post_dx (x, dim)
```

derivative of the posterior mean, wrt dimension dim

• real(dp) function, dimension(x_dim, n_dof) gp_mu_post_grad (x, x_dim, only)

derivative of the posterior mean, needed for stoch_grad

real(dp) function, dimension(x dim, x dim) gp k post same x (x, x dim)

specific function for cov(x,x), see $gp_k post$

• real(dp) function, dimension(x1_dim, x2_dim) gp_k_post_diff_x (x1, x2, x1_dim, x2_dim)

specific function for $cov(x_1,x_2)$, see gp_k_{post}

subroutine gp_post_k_grad (X, x_dim, out)

grad of the posterior covariance, evaluated at X of size x_dim,n_dof, needed for stoch_grad

subroutine gp_update (param_data_in_top, E_data_in_top, n_top, Algo_choice)

update routine for adding data to gp

subroutine gp_debug_print_state ()

prints all scalar stae variables, size of all array state variables, and min and max stored energy

subroutine gp_exit ()

deallocates state variables

• subroutine gp_min_stored (min_params, min_E)

for finding minimum of the energy and associated parameter space point, from stored data

subroutine gp return size data (n data out, n dof out)

returns the integers that control the size of the state variables

• subroutine gp_return_state_data (kernel_var_out, kernal_inv_length_out, param_data_out, E_data_out, param_pres_out, param_cov_out, data_mean_out)

for acessing a copy of the state variables, they are returned to the intent(out) parameter with the corresponding name

• subroutine gp_restart (n_data_in, n_dof_in, kernel_var_in, kernal_inv_length_in, param_data_in, E_data_in, param_pres_in, param_cov_in, data_mean_in, mean_prior, mean_prior_dx, n_threads_in)

sets a state from inputed data, intended for use with restart files.

Variables

procedure(mean_func_interface_dx), pointer mu_prior_dx => null()

11.7.1 Detailed Description

Gaussian process surrogate submodules and functions.

11.7.2 Function/Subroutine Documentation

11.7.2.1 gp_debug_print_state()

```
subroutine gp_surrogate::gp_debug_print_state
```

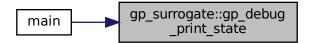
prints all scalar stae variables, size of all array state variables, and min and max stored energy

Definition at line 639 of file GP_surrogate.f90.

```
639
640
                              implicit none
                           print*, "init=", init
print*, "n_data=", n_data
print*, "n_dof=", n_dof
print*, "kernel_var=", kernel_var
print*, "kernal_inv_length=", kernal_inv_length
print*, "shape of param_data=", shape(param_data)
print*, "shape of E_data=", shape(e_data)
print*, "shape of param_pres=", shape(param_pres)
print*, "shape of param_cov=", shape(param_cov)
print*, "shape of data_mean=", shape(data_mean)
print*, "min energy", minval(e_data)
641
642
644
645
646
647
648
649
650
                             print*, "min energy", minval(e_data)
print*, "max energy", maxval(e_data)
651
652
653
```

Referenced by main().

Here is the caller graph for this function:



11.7.2.2 gp_exit()

```
subroutine gp_surrogate::gp_exit
```

deallocates state variables

Definition at line 658 of file GP_surrogate.f90.

```
implicit none
implicit none

deallocating state variables
deallocate(param_data,e_data,param_pres, param_cov,data_mean)

deallocating pointers
nullify(mu_prior,mu_prior_dx ,k_prior ,k_prior_dx_l_i ,k_prior_xx_dx_i ,gp_k_post_xx_d_x_i)

deallocating pointers
nullify(mu_prior,mu_prior_dx ,k_prior_dx_l_i ,k_prior_xx_dx_i ,gp_k_post_xx_d_x_i)
```

References mu prior dx.

Referenced by main().

Here is the caller graph for this function:



11.7.2.3 gp_init_arbcov()

do not use, don't have a function for the dervatives of the kernal/mean

Definition at line 194 of file GP_surrogate.f90.

```
194
             implicit none
195
             procedure (mean_func_interface) :: mean_prior
196
             procedure(cov_kernal_interface) :: cov_prior
197
             integer, intent(in) :: n_data_in, n_dof_in
198
             real(dp), dimension(n_data_in,n_dof_in), intent(in) :: param_data_in
199
             real(dp), dimension(n_data_in), intent(in) :: E_data_in
200
             !work and ipiv are needed for lapack call, have no useful info
201
            integer :: i, j
202
203
             !setting priors
204
             mu_prior => mean_prior
             k_prior => cov_prior
205
206
207
            !setting data
208
            n_data = n_data_in
209
            n_dof = n_dof_in
210
             allocate(param_data(n_data,n_dof))
211
            allocate(e_data(n_data))
212
             e_data = e_data_in
            param_data = param_data_in
213
214
215
216
            allocate(param_cov(n_data,n_data))
217
            allocate(param_pres(n_data, n_data))
218
             !finds covarience for new data
219
220
            do i=1, n data
                do j=1,i
221
222
                     !is symmteric, this reduces calls
                     param_cov(i,j) = k_prior(param_data(i,:), param_data(j,:))
param_cov(j,i) = param_cov(i,j)
223
224
                 end do
225
226
            end do
228
             !compute inverse of cov (precsion)
229
            param_pres = param_cov
230
             call svd_inverse(param_pres, n_data)
2.31
232
            allocate(data mean(n data))
233
             !updating the prior mean list
            do i=1,n_data
235
                 data_mean(i) = mu_prior(param_data(i,:))
236
            end do
237
            init = .true.
238
239
```

11.7.2.4 gp_init_gausscov()

intialises with a gaussian covariance

Definition at line 133 of file GP surrogate.f90.

```
implicit none
134
            procedure(mean_func_interface) :: mean_prior
135
            procedure(mean_func_interface_dx) :: mean_prior_dx
            integer, intent(in) :: n_data_in, n_dof_in,n_threads_in
real(dp), intent(in) :: ker_var, ker_length
136
137
138
            real(dp), dimension(n_data_in,n_dof_in), intent(in) :: param_data_in
139
            real(dp), dimension(n_data_in), intent(in) :: E_data_in
           integer :: i,j
140
141
142
           n_threads=n_threads_in
143
144
            !setting prior parameters
145
            kernel_var = ker_var
146
            kernal_inv_length = 1.0_dp/ker_length
147
            !setting priors
148
           mu_prior => mean_prior
            k_prior => gaussian_kernel
149
150
151
            !derivatives of priors, needed for SGA step later
152
            mu_prior_dx => mean_prior_dx
153
            k_prior_dx_1_i => gaussian_kernel_dx_1_i
            154
155
      support is expanded) code to get the 0
156
157
            !setting data
           n_data = n_data_in
158
159
            n\_dof = n\_dof\_in
160
           allocate(param_data(n_data,n_dof))
161
           allocate (e data (n data))
162
            e_data = e_data_in
163
           param_data = param_data_in
164
165
166
           allocate(param_cov(n_data,n_data))
167
           allocate(param_pres(n_data, n_data))
168
169
            !finds covarience for new data
170
            do i=1,n_data
171
                do j=1,i
172
                    !is symmteric, this reduces calls
                    param_cov(i,j) = k_prior(param_data(i,:), param_data(j,:))
param_cov(j,i) = param_cov(i,j)
173
174
175
                end do
176
           end do
177
178
           !compute inverse of cov (precsion)
179
           param_pres = param_cov
180
           call svd_inverse(param_pres, n_data)
181
           allocate(data_mean(n_data))
183
            !updating the prior mean list
           do i=1, n_data
184
185
                data_mean(i) = mu_prior(param_data(i,:))
186
           end do
187
188
           init = .true.
189
```

References mu_prior_dx.

11.7.2.5 gp_k_post_diff_x()

specific function for cov(x_1,x_2), see gp_k_post

Definition at line 356 of file GP surrogate.f90.

```
implicit none
357
             integer, intent(in) :: x1_dim, x2_dim
358
             real(dp), dimension(x1_dim, n_dof), intent(in) :: x1 !param space point
             real(dp), dimension(x2_dim,n_dof), intent(in) :: x2 !param space point
real(dp), dimension(x1_dim,x2_dim) :: out, x1_cov_x2
359
360
361
             real(dp), dimension(n_data,x2_dim) :: data_cov_x2
362
             real(dp), dimension(x1_dim,n_data) :: x1_cov_data
363
             integer :: i,j
364
             if (.not. init) then
365
                 print*,'not intialised'
366
367
                 stop
368
369
370
             do i=1, x2_dim
371
                 do j=1,n_data
372
                      data_cov_x2(j,i) = k_prior(x2(i,:), param_data(j,:))
373
                 end do
374
             end do
375
376
             do i=1, x1_dim
377
                 do j=1,n_data
                      x1\_cov\_data(i,j) = k\_prior(param\_data(j,:),x1(i,:))
378
379
                 end do
380
             end do
381
382
             do i=1, x1_dim
383
                 do j=1, x2\_dim
                     x1_{cov_x2(i,j)} = k_{prior(x1(i,:), x2(j,:))}
384
                 end do
385
386
             end do
388
            out = x1_cov_x2 + matmul(matmul(x1_cov_data,param_pres),data_cov_x2)
389
```

11.7.2.6 gp_k_post_same_x()

```
real(dp) function, dimension(x_dim,x_dim) gp_surrogate::gp_k_post_same_x ( real(dp), dimension(x_dim,n_dof), intent(in) x, integer, intent(in) x_dim )
```

specific function for cov(x,x), see gp_k_post

Definition at line 322 of file GP_surrogate.f90.

```
322
              implicit none
323
              integer, intent(in) :: x_dim
             real(dp), dimension(x_dim,n_dof), intent(in) :: x !param space point real(dp), dimension(x_dim,x_dim) :: out, x_cov_x
324
325
326
              real(dp), dimension(x_dim, n_data) :: x_cov_data
327
              real(dp), dimension(n_data,x_dim) :: data_cov_x
             integer :: i,j
328
329
330
              if (.not. init) then
331
                  print*,'not intialised'
332
                  stop
333
             end if
334
335
             do i=1.x dim
336
                  do j=1,n_data
337
                       data_{cov_x(j,i)} = k_{prior(param_data(j,:), x(i,:))}
```

```
338
                  end do
339
              end do
340
341
              x_cov_data = transpose(data_cov_x)
342
              do i=1, x\_dim
343
                  do j=1,i
                       !is symmteric, this reduces calls 
x_cov_x(i,j) = k_prior(x(i,:), x(j,:))
344
345
346
                       x_{cov_x(j,i)} = x_{cov_x(i,j)}
347
                  end do
348
              end do
349
350
            out = x_cov_x + matmul(matmul(x_cov_data,param_pres),data_cov_x)
```

Referenced by biased_optim::bi_op_step().

Here is the caller graph for this function:



11.7.2.7 gp_min_stored()

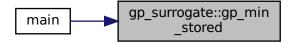
for finding minimum of the energy and associated parameter space point, from stored data

Definition at line 724 of file GP_surrogate.f90.

```
implicit none
real(dp), dimension(n_dof), intent(out) :: min_params
real(dp), intent(out) :: min_E
real(dp), intent(out) :: min_params
real(dp), intent(o
```

Referenced by main().

Here is the caller graph for this function:



11.7.2.8 gp_mu_post()

posterior mean

Definition at line 244 of file GP_surrogate.f90.

```
244
              implicit none
              integer, intent(in) :: x_dim
245
             real(dp), dimension(x_dim,n_dof), intent(in) :: x real(dp), dimension(x_dim) :: out
246
247
248
              real(dp), dimension(x_dim) :: x_means
             real(dp), dimension(x_dim,n_data) :: x_cov_data
integer :: i, j
249
250
251
             if (.not. init) then
253
                  print*,'not intialised'
254
                  stop
255
             end if
256
             do i=1.x dim
2.57
258
                  x_means(i) = mu_prior(x(i,:))
                  do j=1,n_data
260
                       x_{cov_data(i,j)} = k_{prior(x(i,:), param_data(j,:))}
261
262
             end do
263
            out = x_means + matmul(matmul(x_cov_data, param_pres), (e_data-data_mean))
264
```

Referenced by biased optim::bi op step(), gradient estimator::m vector(), and main().

Here is the caller graph for this function:



11.7.2.9 gp_mu_post_dx()

derivative of the posterior mean, wrt dimension dim

Definition at line 270 of file GP_surrogate.f90.

```
270
               implicit none
271
               !only gets evaluated at one point
272
273
               integer, intent(in) :: dim
               real(dp), dimension(n_dof), intent(in) :: x
               real(dp):: out
real(dp), dimension(1,n_data):: x_cov_data_dx
real(dp), dimension(1):: prod_temp
integer:: j
274
275
276
277
278
279
               do j=1,n_data
280
                     x\_cov\_data\_dx (1,j) \ = \ k\_prior\_dx\_1\_i \ (x,param\_data \ (j,:) \ , dim) 
281
               end do
282
               prod_temp = matmul(x_cov_data_dx, matmul(param_pres, (e_data-data_mean)))
```

References mu_prior_dx.

Referenced by gp_mu_post_grad().

Here is the caller graph for this function:



11.7.2.10 gp_mu_post_grad()

```
real(dp) function, dimension(x_dim,n_dof) gp_surrogate::gp_mu_post_grad ( real(dp), dimension(x_dim,n_dof), intent(in) x, integer, intent(in) x_dim, integer, intent(in), optional only)
```

derivative of the posterior mean, needed for stoch_grad

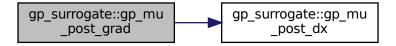
Definition at line 291 of file GP_surrogate.f90.

```
291
                 implicit none
292
                 !row i contain the gradient of mu wrt data_i
293
                 integer, intent(in) :: x_{dim}
               integer, intent(in), optional :: only
real(dp), dimension(x_dim,n_dof), intent(in) :: x !param space point
real(dp), dimension(x_dim,n_dof) :: out
integer :: i, j
294
295
296
297
298
299
                if (.not. init) then
                      print*,'not intialised'
300
301
                      stop
302
                end if
303
304
                out=0
305
306
                if (present(only)) then
307
                      do j=1,n_dof
                           out(only,j) = gp_mu_post_dx(x(only,:),j)
308
309
310
                else
311
                     do i=1, x\_dim
312
                           do j=1,n_dof
313
                                 \texttt{out}\,(\texttt{i},\texttt{j}) \; = \; \texttt{gp\_mu\_post\_dx}\,(\texttt{x}\,(\texttt{i},:)\,,\,\texttt{j})
314
                           end do
                      end do
316
                end if
```

References gp_mu_post_dx().

Referenced by gradient_estimator::combine_f_grad_k(), and main().

Here is the call graph for this function:



Here is the caller graph for this function:



11.7.2.11 gp_post_k_grad()

grad of the posterior covariance, evaluated at X of size x_dim,n_dof, needed for stoch_grad

Parameters

in	x_dim	size of X
in	X	point to evaluate at
out	out	the output matrix, size (x_dim,x_dim,x_dim,n_dof)

Definition at line 422 of file GP surrogate.f90.

```
!triple nested for loops are slow,try not to call often
423
                   implicit none
424
                   integer, intent(in) :: x_{dim}
                  real(dp), dimension(x_dim,n_dof), intent(in) :: X
real(dp), dimension(x_dim,x_dim,x_dim,n_dof),intent(out) :: out
integer :: i,j,1
425
426
427
428
429
                   if (.not. init) then
430
                         print*,'not intialised'
431
                         stop
                  end if
432
433
434
                  do i=1, x_dim
435
                         do j=1,x_dim
436
437
                                      do 1=1, n_dof
                                            \begin{array}{lll} & \text{out}\,(i,j,j,1) = & \text{gp\_k\_post\_d\_x\_1\_i}\,(x\,(j,:),x\,(i,:),1) \\ & \text{out}\,(i,j,i,1) = & \text{gp\_k\_post\_d\_x\_1\_i}\,(x\,(i,:),x\,(j,:),1) \end{array}
438
439
440
                                     end do
441
                                else
```

```
442 do l=1,n_dof

443 out(i,j,i,l) = gp_k_post_xx_d_x_i(x(i,:),l)

444 end do

445 end if

446 end do

447 end do

448
```

Referenced by gradient_estimator::combine_f_grad_k(), and main().

Here is the caller graph for this function:



11.7.2.12 gp_restart()

```
subroutine gp_surrogate::gp_restart (
    integer, intent(in) n_data_in,
    integer, intent(in) n_dof_in,
    real(dp), intent(in) kernel_var_in,
    real(dp), intent(in) kernal_inv_length_in,
    real(dp), dimension(n_data_in,n_dof_in), intent(in) param_data_in,
    real(dp), dimension(n_data_in), intent(in) E_data_in,
    real(dp), dimension(n_data_in,n_data_in), intent(in) param_pres_in,
    real(dp), dimension(n_data_in,n_data_in), intent(in) param_cov_in,
    real(dp), dimension(n_data_in), intent(in) data_mean_in,
    procedure(mean_func_interface) mean_prior,
    procedure(mean_func_interface_dx) mean_prior_dx,
    integer, intent(in) n_threads_in)
```

sets a state from inputed data, intended for use with restart files.

Variables must correspond to named counterpart

Definition at line 770 of file GP_surrogate.f90.

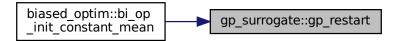
```
771
              integer, intent(in) :: n_data_in, n_dof_in,n_threads_in
772
              real(dp), intent(in) :: kernel_var_in, kernal_inv_length_in
             real(dp), dimension(n_data_in,n_dof_in), intent(in):: param_data_in real(dp), dimension(n_data_in), intent(in) :: E_data_in
773
774
775
              real(dp), dimension(n_data_in,n_data_in), intent(in) :: param_pres_in, param_cov_in
             real(dp), dimension(n_data_in), intent(in) :: data_mean_in procedure(mean_func_interface) :: mean_prior
776
777
778
             procedure(mean_func_interface_dx) :: mean_prior_dx
779
780
             n_data = n_data_in
n_dof = n_dof_in
781
782
             n_threads = n_threads_in
783
784
             kernel_var=kernel_var_in
785
              {\tt kernal\_inv\_length=kernal\_inv\_length\_in}
786
              allocate(param_data(n_data,n_dof))
787
             param_data=param_data_in
788
              allocate(e_data(n_data))
789
              e_data=e_data_in
790
              allocate(param_pres(n_data,n_data))
791
              param_pres=param_pres_in
792
              allocate (param_cov (n_data, n_data))
793
             param_cov=param_cov_in
794
              allocate(data_mean(n_data))
```

```
data_mean=data_mean_in
796
797
798
               mu_prior => mean_prior
               k_prior => gaussian_kernel
799
800
               !derivatives of priors, needed for SGA step later
801
802
               mu_prior_dx => mean_prior_dx
               k_prior_dx_1_i => gaussian_kernel_dx_1_i
k_prior_xx_dx_i => zero_func
gp_k_post_xx_d_x_i => zero_func
803
804
805
806
807
               init = .true.
```

References mu_prior_dx.

Referenced by biased_optim::bi_op_init_constant_mean().

Here is the caller graph for this function:



11.7.2.13 gp_return_size_data()

returns the integers that control the size of the state variables

Definition at line 738 of file GP_surrogate.f90.

```
738 implicit none
739 integer,intent(out) :: n_data_out, n_dof_out
740
741 n_data_out = n_data
742 n_dof_out = n_dof
743
```

11.7.2.14 gp_return_state_data()

```
real(dp), dimension(n_data,n_data), intent(out) param_cov_out,
real(dp), dimension(n_data), intent(out) data_mean_out)
```

for acessing a copy of the state variables, they are returned to the intent(out) parameter with the corresponding name

Definition at line 749 of file GP_surrogate.f90.

```
749
              implicit none
750
              real(dp), intent(out) :: kernel_var_out, kernal_inv_length_out
              real(dp), dimension(n_data,n_dof), intent(out):: param_data_out
real(dp), dimension(n_data), intent(out) :: E_data_out
751
752
753
              real(dp), dimension(n_data,n_data), intent(out) :: param_pres_out, param_cov_out
754
              real(dp), dimension(n_data), intent(out) :: data_mean_out
755
756
             kernel_var_out = kernel_var
757
              {\tt kernal\_inv\_length\_out = kernal\_inv\_length}
758
              param_data_out = param_data
              e_data_out = e_data
760
              param_pres_out = param_pres
              param_cov_out = param_cov
data_mean_out = data_mean
761
762
763
```

11.7.2.15 gp_update()

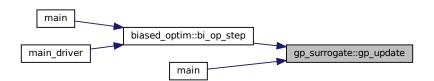
update routine for adding data to gp

Definition at line 453 of file GP_surrogate.f90.

```
integer, intent(in) :: n_top
real(dp), dimension(n_top,n_dof), intent(in) :: param_data_in_top
453
454
455
             real(dp), dimension(n_top), intent(in) :: E_data_in_top
456
            character(len=1), intent(in) :: Algo_choice
457
458
            select case (algo_choice)
            case ("F")
459
                call gp_update_full_svd(param_data_in_top, e_data_in_top, n_top)
460
            case ("U")
461
462
                call gp_update_woodbury_block_update(param_data_in_top, e_data_in_top, n_top)
463
             case defa
                 print*, "please make a valid algorithm choice"
464
            end select
465
466
```

Referenced by biased optim::bi op step(), and main().

Here is the caller graph for this function:



11.7.3 Variable Documentation

11.7.3.1 mu prior dx

```
procedure (mean_func_interface_dx), pointer gp_surrogate::mu_prior_dx => null()

Definition at line 18 of file GP_surrogate.f90.

18     procedure(mean_func_interface_dx), pointer :: mu_prior_dx => null()
```

Referenced by gp_exit(), gp_init_gausscov(), gp_mu_post_dx(), and gp_restart().

11.8 gradient_estimator Module Reference

Subroutines for obtaining a gradient estimation through Cholesky decomposition.

Functions/Subroutines

- subroutine get_cholesky (cholesky_decomp, matrix_in)
 performs Cholesky decomposition without destroying the old array.
- real(dp) function, dimension(:), allocatable m_vector (x, previous_best)
 builds the "m_vector" as described in: arXiv:1602.05149v4 [stat.ML] 5 May 2019 contains the difference between the mean and best result in a vector.
- real(dp) function, dimension(:), allocatable z_vector (z_in)
 build the "z_vector" as described in: arXiv:1602.05149v4 [stat.ML] 5 May 2019
- integer function, dimension(1) find_max_thread (m_vec, z_vec, c_mat)
 - finds the location in the vector that corresponds to the maximum of "m + CZ"
- subroutine check_max_is_unique (m_vec, z_vec, c_mat, find_max_thread)
 - check if the maximum found in the find_max_thread is a unique value.
- subroutine init_diff_f (x, z_in, previous_best)
 - initialises the workspace F and Cholesky decomposition of the covariance matrix.
- subroutine bkwd diff f()
 - performs the backward difference differentiation on the workspace F
- subroutine combine_f_grad_k (x, n_params)
 - combines the gradient contributions from the workspace F and those associated with the m_vector and covariance matrix.
- real(dp) function, dimension(:,:), allocatable run_gradient_estimator (x, z_in, n_params, previous_best) runs the gradient estimator associated routines from one block.

Variables

- real(dp), dimension(:,:), allocatable f_ij
- real(dp), dimension(:,:), allocatable | ij
- real(dp), dimension(:,:), allocatable gradient_matrix
- real(dp) check_max

11.8.1 Detailed Description

Subroutines for obtaining a gradient estimation through Cholesky decomposition.

11.8.2 Function/Subroutine Documentation

11.8.2.1 bkwd_diff_f()

```
subroutine gradient_estimator::bkwd_diff_f
```

performs the backward difference differentiation on the workspace F

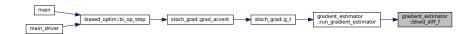
Definition at line 158 of file gradient_estimator.f90.

```
integer :: i, j, k, N
159
         integer, dimension(2) :: shape_arr
160
        shape\_arr = shape(f\_ij)
161
        n = shape_arr(1)
162
163
        do k=n,1, -1
          if (abs(1_ij(k,k)) > 0.0_dp) then
!row operations
164
165
           do j = k+1, n
    do i = j, n
    f_ij(i,k) = f_ij(i,k) - f_ij(i,j)*l_ij(j,k)
    f_ij(j,k) = f_ij(j,k) - f_ij(i,j)*l_ij(i,k)
166
167
168
169
170
               end do
171
            end do
172
            !lead column
173
            \begin{array}{lll} \mbox{do } \mbox{j} &= \mbox{k+1, n} \\ \mbox{f_ij(j,k)} &= \mbox{f_ij(j,k)/l_ij(k,k)} \\ \mbox{f_ij(k,k)} &= \mbox{f_ij(k,k)} - \mbox{l_ij(j,k)} \star \mbox{f_ij(j,k)} \end{array}
174
175
177
            !pivot
178
            f_{ij}(k,k) = 0.5_{dp*f_{ij}(k,k)/l_{ij}(k,k)}
179
         end do
180
```

References f_ij, and l_ij.

Referenced by run_gradient_estimator().

Here is the caller graph for this function:



11.8.2.2 check_max_is_unique()

check if the maximum found in the find_max_thread is a unique value.

Parameters

m_vec	as returned from the m_vector function.
z_vec	as returned from the z_vector function.
c_mat	corresponds to the Cholesky decomposition of the covariance matrix.
find_max_thread	integer containing the location of the maximum of "m + CZ"

Definition at line 87 of file gradient estimator.f90.

```
integer, dimension(1), intent(in) :: find_max_thread
        real(dp), dimension(:,:) , intent(in):: c_mat real(dp), dimension(:), intent(in):: m_vec, z_vec
89
        real(dp), dimension(:), allocatable :: f_vector
integer :: i
90
91
        !make sure indexing starts from 0, so is consistent. allocate(f_{\text{vector}}(0:(\text{size}(z_{\text{vec}})-1)))!by default set = 1, so it does nothing when multiplied with something.
92
93
95
        check_max = 1.0_dp
         f_vector = m_vec + matmul(c_mat, z_vec)
96
97
         !loop over each element of the calculated vector and check if it equals the max of that vector
        !but in more than one location.
98
99
        do i = 0, size(f_vector) -1
          if ( (f_vector(i) .EQ. f_vector(find_max_thread(1))) .AND. (i .NE. find_max_thread(1)) ) then
100
101
              check_max=0.0_dp
102
            end if
103
          end do
          deallocate(f_vector)
104
```

References check max.

Referenced by init diff f().

Here is the caller graph for this function:



11.8.2.3 combine_f_grad_k()

combines the gradient contributions from the workspace F and those associated with the m_vector and covariance matrix.

Parameters

X	is 2D array containing the param_inputs for each thread.
n_params	is the total number of parameters being evaluated

Definition at line 189 of file gradient_estimator.f90.

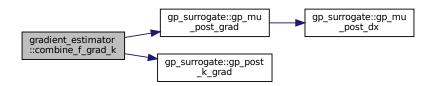
```
189 real(dp), dimension(:,:) :: x
190 real(dp), dimension(:,:), allocatable :: grad_mu
191 real(dp), dimension(:,:,:,:), allocatable:: post_grad_in
```

```
192
      integer, dimension(2) :: shape_arr
193
      integer, dimension(4) :: shape_arr_4
194
      integer :: i, j, k, l, n_params
195
196
197
      shape arr = shape(x)
198
199
      if allocated(post_grad_in) then
200
       deallocate(post_grad_in)
201
      end if
      allocate(post_grad_in(shape_arr(1), shape_arr(1), shape_arr(1), n_params))
202
203
      if allocated(grad_mu) ther
204
       deallocate (grad mu)
205
206
      allocate(grad_mu( shape_arr(1), n_params ))
      call gp_post_k_grad(x, shape_arr(1), post_grad_in)
shape_arr_4 = shape(post_grad_in)
207
208
209
210
      !print*, shape_arr_4(:)
211
      if allocated(gradient_matrix) then
212
        deallocate(gradient_matrix)
213
214
      allocate(gradient_matrix(shape_arr_4(3), shape_arr_4(4)) )
215
      gradient_matrix = 0.0_dp
216
      do k = 1, shape_arr_4(3)
217
       do 1 = 1, shape_arr_4(4)
do i = 1, shape_arr_4(1)
218
            do j = 1, shape_arr_4(2)
219
220
              gradient\_matrix(k,l) = gradient\_matrix(k,l) + f\_ij(i,j)*post\_grad\_in(i,j,k,l)
221
            end do
222
          end do
223
        end do
224
      end do
225
      ! \ensuremath{\mathsf{gradient}} in param space associated with each mean.
226
      grad_mu = gp_mu_post_grad(x, shape_arr(1))
227
228
      gradient_matrix = (gradient_matrix - grad_mu)
229
230
231
      !deallocate(F_ij, L_ij)
```

References f_ij, gp_surrogate::gp_mu_post_grad(), gp_surrogate::gp_post_k_grad(), and gradient_matrix.

Referenced by run_gradient_estimator().

Here is the call graph for this function:



Here is the caller graph for this function:



11.8.2.4 find_max_thread()

finds the location in the vector that corresponds to the maximum of "m + CZ"

Parameters

m_vec	as returned from the m_vector function.
z_vec	as returned from the z_vector function.
c_mat	corresponds to the Cholesky decomposition of the covariance matrix.

Definition at line 70 of file gradient_estimator.f90.

```
real(dp), dimension(:,:), intent(in):: c_mat
real(dp), dimension(:), intent(in):: m_vec, z_vec
integer, dimension(1):: find_max_thread
integer, dimension(2):: shape_arr
shape_arr = shape(c_mat)
find_max_thread = maxloc(m_vec + matmul(c_mat, z_vec)) - 1
!-1 is shift the indexing back to 0 from 1.
```

Referenced by init diff f().

Here is the caller graph for this function:

```
main biased optim:bi_op_step | stoch_grad_grad_accent | stoch_grad-g_t | gradient_estimator |
```

11.8.2.5 get_cholesky()

performs Cholesky decomposition without destroying the old array.

also with 0 at i=0 padding.

Parameters

cholesky_decomp	is where the result is stored.
matrix_in	2D matrix to be decomposed.

Definition at line 20 of file gradient_estimator.f90.

```
20  real(dp), dimension(:,:) :: matrix_in, cholesky_decomp
21  real(dp), dimension(:,:), allocatable :: get_cholesky_temp
22  integer :: info
```

```
integer, dimension(2) :: shape_arr
get_cholesky_temp = matrix_in
shape_arr = shape(matrix_in)
dotrf('L', shape_arr(1), get_cholesky_temp, shape_arr(1), info) !this is the LAPACK routine for getting Cholesky'L' = lower triangle. info has an error state
cholesky_decomp = 0.0_dp
cholesky_decomp(1:shape_arr(1), 1:shape_arr(1)) = -get_cholesky_temp
```

Referenced by init diff f().

Here is the caller graph for this function:



11.8.2.6 init_diff_f()

initialises the workspace F and Cholesky decomposition of the covariance matrix.

Parameters

X	is 2D array containing the param_inputs for each thread.
z_in	is a 1D array of normally distributed numbers.
previous_best	is a real number containing the best energy from the prior trial.

Definition at line 113 of file gradient_estimator.f90.

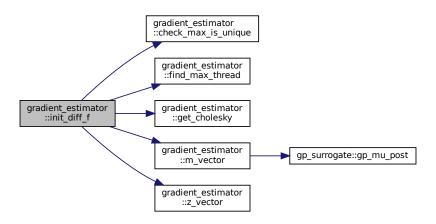
```
113
       real(dp), dimension(:,:), intent(in):: x
      real(dp), intent(in) :: previous_best
real(dp), dimension(:), intent(in) :: z_in
real(dp), dimension(:), allocatable :: m_vec, z_vec
real(dp), dimension(:,:), allocatable :: c_mat, init_F_ij
114
115
116
117
       integer, dimension(2) :: shape_arr
       integer, dimension(1) :: loc_max_thread
integer :: i, j
shape_arr = shape(x)
119
120
121
122
       allocate(m_vec(0:shape_arr(1)))
123
       allocate(z_vec(0:shape_arr(1)))
124
       allocate(c_mat(0:shape_arr(1), 0:shape_arr(1) ))
125
       \verb|allocate(init_f_ij(0:shape_arr(1), 0:shape_arr(1))||\\
126
127
       if (allocated(f_ij)) then
        deallocate(f_ij)
128
129
       end if
130
       allocate(f_ij(1:shape_arr(1), 1:shape_arr(1)))
131
132
       if (allocated(l_ij)) then
133
        deallocate(l_ij)
134
       end if
       allocate(l_ij(1:shape_arr(1), 1:shape_arr(1)))
init_f_ij = 0.0_dp
135
136
137
       m_vec = m_vector(x, previous_best)
       z_vec = z_vector(z_in)
138
139
140
       call get_cholesky(c_mat, gp_k_post(x, shape_arr(1))
141
      loc_max_thread = find_max_thread(m_vec, z_vec, c_mat)
142
      !print*, loc_max_thread
```

```
143
      !This is the analytical result of diffing the max(f) w.r.t each L(ij)
144
      init_f_i(loc_max_thread(1)), l:loc_max_thread(1)) = -z_vec(1:loc_max_thread(1))
145
      !putting array back into correct size (removing index 0, padding)
               init_f_ij(1:shape_arr(1) , 1:shape_arr(1))
146
      f_i =
      !put cholesky in same size array, removing 0 index padding.
l_ij = c_mat(1:shape_arr(1) , 1:shape_arr(1))
147
148
149
150
151
      call check_max_is_unique(m_vec, z_vec, c_mat, loc_max_thread)
152
      deallocate(c_mat, z_vec, m_vec, init_f_ij)
```

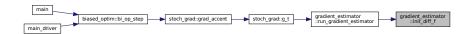
References check_max_is_unique(), f_ij, find_max_thread(), get_cholesky(), l_ij, m_vector(), and z_vector().

Referenced by run gradient estimator().

Here is the call graph for this function:



Here is the caller graph for this function:



11.8.2.7 m_vector()

```
real(dp) function, dimension(:), allocatable gradient_estimator::m_vector ( real(dp), dimension(:,:), intent(in) x, real(dp), intent(in) previous\_best)
```

builds the "m_vector" as described in: arXiv:1602.05149v4 [stat.ML] 5 May 2019 contains the difference between the mean and best result in a vector.

Parameters

X	is 2D array containing the param_inputs for each thread.	
previous_best	is a real number containing the best energy from the prior trial.	

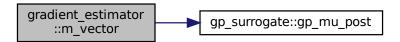
Definition at line 38 of file gradient_estimator.f90.

```
real(dp), dimension(:), allocatable :: m_vector, pbest_arr
real(dp), dimension(:,:) , intent(in):: x
real(dp), dimension(:,:) , intent(in):: x
real(dp), intent(in) :: previous_best
integer, dimension(2) :: shape_arr
shape_arr = shape(x)
allocate(m_vector(0:shape_arr(1)))
allocate(pbest_arr(shape_arr(1)))
pbest_arr = previous_best !need an array to compare each thread/trial/point in param space.
m_vector(0) = 0.0_dp
m_vector(1:shape_arr(1)) = pbest_arr - gp_mu_post(x, shape_arr(1))
```

References gp_surrogate::gp_mu_post().

Referenced by init diff f().

Here is the call graph for this function:



Here is the caller graph for this function:

```
main biased_optim:bi_op_step stoch_grad.grad_accent stoch_grad.gc_t gradient_estimator ::m_gradient_estimator ::m_
```

11.8.2.8 run_gradient_estimator()

runs the gradient estimator associated routines from one block.

Parameters

X	is 2D array containing the param_inputs for each thread.
n_params	is the total number of parameters being evaluated.
z_in	is a 1D array of normally distributed numbers.
previous_best	is a real number containing the best energy from the prior trial.

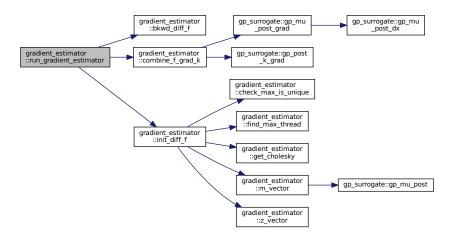
Definition at line 241 of file gradient_estimator.f90.

```
real(dp), dimension(:,:), intent(in) :: x
real(dp), dimension(:,:), allocatable :: run_gradient_estimator
242
         real(dp), dimension(:), intent(in) :: z_in
243
         integer, intent(in) :: n_params
real(dp), intent(in) :: previous_best
244
245
246
247
         call init_diff_f(x,z_in, previous_best)
248
         call bkwd_diff_f()
249
         call combine_f_grad_k(x, n_params)
250
         if allocated(run_gradient_estimator) then
251
          deallocate(run_gradient_estimator)
252
253
         allocate(run_gradient_estimator, mold=gradient_matrix)
254
         run_gradient_estimator = gradient_matrix*check_max
         !deallocate(gradient_matrix)
255
```

References bkwd_diff_f(), check_max, combine_f_grad_k(), gradient_matrix, and init_diff_f().

Referenced by stoch_grad::g_t().

Here is the call graph for this function:



Here is the caller graph for this function:



11.8.2.9 z_vector()

```
real(dp) function, dimension(:), allocatable gradient_estimator::z_vector ( real(dp), dimension(:), intent(in) z_i )
```

build the "z vector" as described in: arXiv:1602.05149v4 [stat.ML] 5 May 2019

Parameters

Z⊷	is a 1D array of normally distributed numbers.
_in	

Definition at line 55 of file gradient_estimator.f90.

```
55  real(dp), dimension(:), allocatable :: z_vector
56  real(dp), dimension(:), intent(in) :: z_in
57  integer :: size_z
58  size_z = size(z_in)
59  allocate(z_vector(0:size_z))
60  z_vector(0) = 0
61  z_vector(1:size_z) = z_in
```

Referenced by init_diff_f().

Here is the caller graph for this function:



11.8.3 Variable Documentation

11.8.3.1 check_max

```
real(dp) gradient_estimator::check_max
```

Definition at line 13 of file gradient_estimator.f90.

```
13 real(dp) :: check_max
```

Referenced by check_max_is_unique(), and run_gradient_estimator().

11.8.3.2 f_ij

```
\verb|real(dp)|, | \verb|dimension(:,:)|, | allocatable | gradient_estimator::f_ij
```

Definition at line 12 of file gradient_estimator.f90.

```
12 real(dp), dimension(:,:), allocatable :: F_ij, L_ij, gradient_matrix
```

Referenced by bkwd_diff_f(), combine_f_grad_k(), and init_diff_f().

11.8.3.3 gradient_matrix

```
real(dp), dimension(:,:), allocatable gradient_estimator::gradient_matrix
```

Definition at line 12 of file gradient_estimator.f90.

Referenced by combine_f_grad_k(), and run_gradient_estimator().

11.8.3.4 l_ij

```
real(dp), dimension(:,:), allocatable gradient_estimator::l_ij
```

Definition at line 12 of file gradient estimator.f90.

Referenced by bkwd_diff_f(), and init_diff_f().

11.9 init_params Namespace Reference

Python functions and scripts to obtain user input import sympy as sym.

Functions

def get_input (parameter='parameter')

Function to get a numerical value/parameter through command line.

• def new_param (window, tk_text, tk_entry, tk_input, row, dval='1', text='param', font=font, fs=fontsize)

Function for creating a row of user entry within the GUI.

Variables

```
• string title = 'User Input'
```

- string bg_color = 'white'
- string fg_color = 'grey'
- string bg_button = 'grey'

note: Mac OS may not support changing button color

- string fg_button = 'black'
- string font = 'Times New Roman'
- int fontsize = 18
- int length = 1000
- int height = 1000
- window = tk.Tk()
- background
- string txt0
- $\bullet \ \ text0 = tk. Label(window, text=txt0, font=(font, fontsize), wraplength=length-5)$

Initializing/Configuring the top row text.

- row
- column
- columnspan

```
    sticky

· list params
• list def_values = [1,1,1.5,40,1000000,0,10,100,1,10,12345,1,7,0.01,1.0,1.0,5.0,20]
• list floats = [2, 13, 14, 15, 16]
• list integers = [0, 1, 3, 4, 5, 6, 7,8, 9, 10, 11, 12, 17]
• N params = len(params)
• string txt1 = "The user must provide the following inputs: "
• text1 = tk.Label(window,text=txt1,font=(font,fontsize),wraplength=length-10)

    text

• string txt2 = "Biased Optimizer Options (not enabled by default):"

    text2 = tk.Label(window,text=txt2,font=(font,fontsize),wraplength=length-10)

string txt2_1 = "Enable the biased optimizer?"
      Create a radio button for user to choose between two options.
• text2_1 = tk.Label(window,text=txt2_1,font=(font,fontsize),wraplength=length-10)
bopt = tk.IntVar()

    variable

    value

    indicatoron

    padx

• entry5 = bopt
• int i = 6
• string txt3 = "Optional user inputs (default options are shown):"

    text3 = tk.Label(window,text=txt3,font=(font,fontsize),wraplength=length-10)

basis = tk.IntVar()
• entry7 = basis
• string txt4 = "Visualization options:"

    text4 = tk.Label(window,text=txt4,font=(font,fontsize),wraplength=length-10)

    close

relx

    rely

    anchor

• int p1 = 1
      Checks to see if user input is proper and sets everything to either an integer or float.
• int p2 = 0

    string filename = 'init params.txt'
```

11.9.1 Detailed Description

• file = open(filename,'w')

Python functions and scripts to obtain user input import sympy as sym.

11.9.2 Function Documentation

11.9.2.1 get_input()

Function to get a numerical value/parameter through command line.

This is used when a gui cant be used or is unsuitable.

Example code to get the bond length:

x=get_input(parameter='bond length')

Parameters

parameter

The name of the parameter/variable needed from the user.

Definition at line 15 of file init_params.py.

```
15 def get_input(parameter='parameter'):
16 while True:
17
           x=input('Please enter a value for the {0}: '.format(parameter))
18
                x=float(x)
19
20
21
           except:
               print('You did not enter a proper numerical value for the {0}'.format(parameter))
23
24
2.5
```

11.9.2.2 new_param()

```
def init_params.new_param (
              window,
              tk_text,
              tk_entry,
              tk_input,
              row,
              dval = '1',
              text = 'param',
              font = font,
              fs = fontsize)
```

Function for creating a row of user entry within the GUI.

Parameters

window	The tkinter window object that has been initialized	
tk_text	Variable name (as string) for holding tkinter label	
tk_entry	Variable name (as string) for holding tkinter entry object	
tk_input	Variable name (as string) for displaying the default parameter value	
row	The row of the GUI to display the prompt	
dval Default value of the parameter/variable		
text	Name of the parameter/variable	
font	The name of the font to be used as given by basis_functions	
fontsize	tsize The size of the font	

Definition at line 95 of file init_params.py.

```
95 def new_param(window,
                 tk_text,tk_entry,tk_input,
97
                 row,
                 dval='1',
98
99
                 text='param',
100
                  font=font, fs=fontsize):
101
102
        # Text to ask user for a specific input
103
        vars()[tk_text]=tk.Label(window,text=text,font=(font,fs))
104
        vars()[tk_text].configure(background=bg_color)
105
        vars()[tk_text].grid(row=row,pady=5,column=0,sticky='e') #padx=5,
106
107
        # Create a space for user text entry
```

```
# Only need first line if you want to show a default value
vars()[tk_input]=tk.StringVar(value=dval)
vars()[tk_entry]=tk.Entry(window,width=9,textvariable=vars()[tk_input])
vars()[tk_entry].grid(column=1,row=row,pady=5,sticky='w')
return vars()[tk_text],vars()[tk_entry],vars()[tk_input]

113
114
```

11.9.3 Variable Documentation

11.9.3.1 anchor

```
init_params.anchor
```

Definition at line 214 of file init_params.py.

11.9.3.2 background

```
\verb"init_params.background"
```

Definition at line 54 of file init_params.py.

11.9.3.3 basis

```
init_params.basis = tk.IntVar()
```

Definition at line 184 of file init_params.py.

11.9.3.4 bg_button

```
string init_params.bg_button = 'grey'
```

note: Mac OS may not support changing button color

Parameters

bg_button | background color of the close button

Definition at line 35 of file init_params.py.

11.9.3.5 bg_color

```
string init_params.bg_color = 'white'
```

Parameters

bg_color

background color of the gui window

Definition at line 30 of file init_params.py.

11.9.3.6 bopt

```
init_params.bopt = tk.IntVar()
```

Definition at line 164 of file init_params.py.

11.9.3.7 close

init_params.close

Initial value:

```
1 = tk.Button(window,text='Close',command=window.quit,
2 bg=bg_button,fg=fg_button)
```

Definition at line 212 of file init_params.py.

11.9.3.8 column

 $\verb"init_params.column"$

Definition at line 83 of file init_params.py.

11.9.3.9 columnspan

 $\verb"init_params.columnspan"$

Definition at line 83 of file init_params.py.

11.9.3.10 def_values

 $list init_params.def_values = [1,1,1.5,40,1000000,0,10,100,1,10,12345,1,7,0.01,1.0,1.0,5.0,20]$

Parameters

def values

Default parameter values carried over from latin_driver.f90

Definition at line 132 of file init_params.py.

11.9.3.11 dval

```
init_params.dval
```

Definition at line 150 of file init_params.py.

11.9.3.12 entry5

```
init_params.entry5 = bopt
```

Definition at line 171 of file init_params.py.

11.9.3.13 entry7

```
init_params.entry7 = basis
```

Definition at line 190 of file init_params.py.

11.9.3.14 fg_button

```
string init_params.fg_button = 'black'
```

Parameters

fg_color

foreground color of the close button

Definition at line 37 of file init_params.py.

11.9.3.15 fg_color

```
string init_params.fg_color = 'grey'
```

Parameters

fg_color foreground color of the gui window

Definition at line 32 of file init_params.py.

11.9.3.16 file

```
init_params.file = open(filename,'w')
```

Definition at line 266 of file init_params.py.

11.9.3.17 filename

```
string init_params.filename = 'init_params.txt'
```

Definition at line 265 of file init_params.py.

11.9.3.18 floats

```
list init_params.floats = [2, 13, 14, 15, 16]
```

Parameters

floats Indices of parameters that are floats

Definition at line 135 of file init_params.py.

11.9.3.19 font

string init_params.font = 'Times New Roman'

Parameters

font Font of the GUI text

Definition at line 40 of file init_params.py.

11.9.3.20 fontsize

int init_params.fontsize = 18

Parameters

fontsize Size of GUI font

Definition at line 42 of file init_params.py.

11.9.3.21 height

int init_params.height = 1000

Parameters

height	Height of the GUI window
--------	--------------------------

Definition at line 47 of file init_params.py.

11.9.3.22 i

int init_params.i = 6

Definition at line 173 of file init_params.py.

11.9.3.23 indicatoron

init_params.indicatoron

Definition at line 166 of file init_params.py.

11.9.3.24 integers

list init_params.integers = [0, 1, 3, 4, 5, 6, 7,8, 9, 10, 11, 12, 17]

Parameters

integers Indices of parameters that are iNtegers

Definition at line 137 of file init_params.py.

11.9.3.25 length

```
int init_params.length = 1000
```

Parameters

length	Length of the GUI window
--------	--------------------------

Definition at line 45 of file init_params.py.

11.9.3.26 N_params

```
init_params.N_params = len(params)
```

Parameters

N_params | Number of parameters/variables

Definition at line 140 of file init_params.py.

11.9.3.27 p1

```
int init_params.p1 = 1
```

Checks to see if user input is proper and sets everything to either an integer or float.

Definition at line 222 of file init_params.py.

11.9.3.28 p2

```
int init_params.p2 = 0
```

Definition at line 256 of file init_params.py.

11.9.3.29 padx

```
init_params.padx
```

Definition at line 167 of file init_params.py.

11.9.3.30 pady

```
init_params.pady
```

Definition at line 156 of file init_params.py.

11.9.3.31 params

```
list init_params.params
```

Initial value:

```
1 = ['Number of electrons','Number of atoms','Bond length if there are two atoms', \
2 'Number of trials for latin hypercube search','Total number of steps for MCMC run', \
3 'Biased optimizer','Number of steps', \
4 'Type of orbitals', \
5 'Proton number', \
6 'Number of OMP Threads', \
7 'Random seed for the latin hypecube', \
8 'Number of linear terms in the single-electron wavefunction per atom', \
9 'Number of dofs in the Jastrow (interaction) term', \
10 'Lengthscale for the finite difference method', \
11 'Inverse lengthscale of nuclear-electron interaction', \
12 'Inverse lengthscale of electron-electron interaction', \
13 'Amount of distance away from atoms to plot', \
14 'Number of points along axis in each direction to plot']
```

Parameters

params The names of the parameters needed, given in the order of entry.

Definition at line 116 of file init params.py.

11.9.3.32 relx

```
init_params.relx
```

Definition at line 214 of file init_params.py.

11.9.3.33 rely

```
init_params.rely
```

Definition at line 214 of file init_params.py.

11.9.3.34 row

```
init_params.row
```

Definition at line 83 of file init_params.py.

11.9.3.35 sticky

```
init_params.sticky
```

Definition at line 83 of file init_params.py.

11.9.3.36 text

 $\verb"init_params.text"$

Definition at line 150 of file init_params.py.

11.9.3.37 text0

```
init_params.text0 = tk.Label(window,text=txt0,font=(font,fontsize),wraplength=length-5)
```

Initializing/Configuring the top row text.

Definition at line 81 of file init_params.py.

11.9.3.38 text1

```
init_params.text1 = tk.Label(window,text=txt1,font=(font,fontsize),wraplength=length-10)
```

Definition at line 143 of file init_params.py.

11.9.3.39 text2

```
init_params.text2 = tk.Label(window,text=txt2,font=(font,fontsize),wraplength=length-10)
```

Definition at line 154 of file init_params.py.

11.9.3.40 text2_1

```
init_params.text2_1 = tk.Label(window,text=txt2_1,font=(font,fontsize),wraplength=length-10)
```

Definition at line 160 of file init_params.py.

11.9.3.41 text3

```
init_params.text3 = tk.Label(window,text=txt3,font=(font,fontsize),wraplength=length-10)
```

Definition at line 180 of file init_params.py.

11.9.3.42 text4

```
init_params.text4 = tk.Label(window,text=txt4,font=(font,fontsize),wraplength=length-10)
```

Definition at line 200 of file init_params.py.

11.9.3.43 title

```
string init_params.title = 'User Input'
```

Parameters

```
title GUI window title
```

Definition at line 27 of file init_params.py.

11.9.3.44 txt0

string init_params.txt0 $\,$

Initial value:

```
1 = "The default simulation parameters are shown in the boxes in \backslash 2 the right-hand column below. Please change any to your desired simulation \backslash 3 parameters and then click 'Close' at the bottom."
```

Parameters

```
txt0 The text shown in the top row of the GUI
```

Definition at line 76 of file init_params.py.

11.9.3.45 txt1

```
string init_params.txt1 = "The user must provide the following inputs: " \!\!\!\!
```

Definition at line 142 of file init_params.py.

11.9.3.46 txt2

```
string init_params.txt2 = "Biased Optimizer Options (not enabled by default):"
```

Definition at line 153 of file init_params.py.

11.9.3.47 txt2_1

```
string init_params.txt2_1 = "Enable the biased optimizer?"
```

Create a radio button for user to choose between two options.

Definition at line 159 of file init_params.py.

11.9.3.48 txt3

```
string init_params.txt3 = "Optional user inputs (default options are shown):"
```

Definition at line 179 of file init_params.py.

11.9.3.49 txt4

```
string init_params.txt4 = "Visualization options:"
```

Definition at line 199 of file init_params.py.

11.9.3.50 value

```
init_params.value
```

Definition at line 166 of file init_params.py.

11.9.3.51 variable

```
init_params.variable
```

Definition at line 166 of file init_params.py.

11.9.3.52 window

```
init_params.window = tk.Tk()
```

Definition at line 51 of file init_params.py.

11.10 log_rho_mod Module Reference

Driver for testng the biased optimization routines.

Functions/Subroutines

• real(dp) function log_rho (x, dof)

11.10.1 Detailed Description

Driver for testng the biased optimization routines.

11.10.2 Function/Subroutine Documentation

11.10.2.1 log_rho()

Definition at line 11 of file Biased_Optim_example_driver.f90.

```
implicit none
real(dp), dimension(:), intent(in) :: x
real(dp), dimension(:), intent(in) :: dof
real(dp) :: retval
real(dp) :: retval
real(dp) :: retval
retval = 2*log(abs(wave_function(x,dof)))
```

References basis_functions::wave_function.

Referenced by main().

Here is the caller graph for this function:



11.11 mcmc Module Reference

Functions and subroutines for implementing Markov chain Monte Carlo.

Data Types

· interface log_rho_interface

Functions/Subroutines

subroutine mcmc_sample (samples, log_rho, x_0, n_steps, n_burned, thinning_interval, s, e_code, dof_
 coefficients, density dimension, average accept, seed)

The main routine for MCMC, generates (n_steps-n_burned)/thinning_interval samples from a distribution rho.

• subroutine mcmc_adapt (s_out, log_rho, x_0, n_steps, s_0, e_code, s_max, s_min, memory, adapt_interval, dof_coefficients, density_dimension, seed)

Runs a version of mcmc_sample but every adapt_interval steps adjusts s, based on an exponetial average of the acceptance rate.

11.11.1 Detailed Description

Functions and subroutines for implementing Markov chain Monte Carlo.

11.11.2 Function/Subroutine Documentation

11.11.2.1 mcmc_adapt()

Runs a version of mcmc_sample but every adapt_interval steps adjusts s, based on an exponetial average of the acceptance rate.

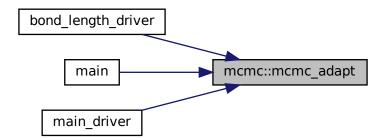
Definition at line 194 of file MCMC.f90.

```
194
             implicit none
195
             real(dp), intent(out) :: s_out
             procedure(log_rho_interface) :: log_rho
196
197
             integer, intent(in) :: density_dimension
198
             integer, intent(in) :: n_steps
199
             integer, intent(in) :: adapt_interval
            integer, intent(in), dimension(:), optional :: seed
real(dp), dimension(:), intent(in) :: dof_coefficients
real(dp), intent(in) :: s_0
200
201
202
203
             real(dp), intent(in) :: s_max, s_min
204
             real(dp), intent(in) :: memory
205
             real(dp), dimension(density_dimension), intent(in) :: x_0
206
            integer, intent(out) :: e_code
207
            \verb"real(dp)", dimension(density_dimension)" :: x,x\_prop
            real(dp) :: a,a_unnorm,norm_cnst,a_ave,rand_sample,log_rho_x,log_rho_x_prop,s, factor, a_ave_
208
209
             real(dp) :: a_min, a_max !keep in close range about 0.235
210
            integer :: loop_index, adapt_count
211
            a_min = 0.234_dp
a_max = 0.236_dp
212
213
214
            x = x_0
            a_unnorm = 0.0_dp
215
            log_rho_x = log_rho(x_0, dof_coefficients)
217
            s=s_0
218
            norm_cnst=1.0_dp
219
            a ave =1.0 dp
220
            factor=sqrt(2.0_dp)
221
222
            !uses current random state if none is given
223
            if (present (seed)) then
224
                 call random_seed(put=seed)
            end if
225
226
227
            do loop index=1,n steps
228
                 x_prop = mcmc_propose(x,s,density_dimension)
229
                 \verb|call mcmc_accept(a, x, x_prop, log_rho, s, log_rho_x, log_rho_x_prop, dof_coefficients)| \\
230
                 a = exp(a)
231
                 call random_number(rand_sample)
232
                 if (a>rand_sample) then
233
                     x = x_prop
234
                     log_rho_x = log_rho_x prop !using datalog_rho_x_prop from last loop, saves calls to rho
235
                      !computing average acceptance rate, will want to have way of outputing at some point
236
                     a\_unnorm = 1.0\_dp + exp(-1.0\_dp/memory)*a\_unnorm
237
                     a_ave_= (1.0_dp+(loop_index-1)*a_ave_)/loop_index
238
                 else
239
                     a_unnorm = exp(-1.0_dp/memory)*a_unnorm
                     a_ave_= ((loop_index-1)*a_ave_)/loop_index
```

```
241
                  end if
                  norm_cnst = 1.0_dp + exp(-1.0_dp/memory)*norm_cnst
243
244
                  adapt\_count = adapt\_count+1
                  if (adapt_count .ge. adapt_interval) then
   if (a_ave_.le.0) then
   if (a_ave_<0) then</pre>
245
246
248
                               \verb|e_code=e_code+2**1|
249
                               print*, 'ERROR: Acceptance rate negative at:', loop_index
250
251
                           end if
                           print*, 'WARNING: Acceptance rate 0 at:', loop_index
252
253
254
                      adapt_count=0
255
                      a_ave = a_unnorm/norm_cnst
256
                      if (a_ave<a_min) then
257
                           s=s/factor
258
                           if (s<s_min) then
259
                               s=s_min
260
                           end if
261
                       else if (a_ave>a_max) then
262
                           s=s*factor
263
                           if (s>s_max) then
264
                               s=s\_max
265
                           end if
266
                      end if
267
                  end if
268
             end do
269
270
             s_out=s
271
             !e_code 0 => no error
             e_code=0
```

Referenced by bond_length_driver(), main(), and main_driver().

Here is the caller graph for this function:



11.11.2.2 mcmc_sample()

```
real(dp), intent(in) s,
integer, intent(out) e_code,
real(dp), dimension(:), intent(in) dof_coefficients,
integer, intent(in) density_dimension,
real(dp), intent(out), optional average_accept,
integer, dimension(:), intent(in), optional seed)
```

The main routine for MCMC, generates (n_steps-n_burned)/thinning_interval samples from a distribution rho.

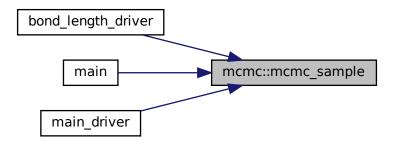
Definition at line 111 of file MCMC.f90.

```
111
              implicit none
              procedure(log_rho_interface) :: log_rho
112
              integer, intent(in) :: density_dimension
113
114
              integer, intent(in) :: n_steps
115
              integer, intent(in) :: n_burned
116
              integer, intent(in) :: thinning_interval
117
             integer, intent(in), dimension(:), optional :: seed
             real(dp), dimension(:), intent(in) :: dof\_coefficients real(dp), intent(in) :: s
118
119
             real(dp), dimension(density_dimension), intent(in) :: x_0
120
              integer, intent(out) :: e_code
122
              real(dp), intent(out), optional :: average_accept
123
              real(dp), dimension((n_steps-n_burned)/thinning_interval+1,density_dimension), intent(out) ::
        samples
124
             real(dp), dimension(density_dimension) :: x,x_prop
real(dp) :: a,a_ave,rand_sample,log_rho_x,log_rho_x_prop
125
126
             integer :: loop_index,out_array_index,thinning_counter
127
128
             !e_code 0 => no error
129
             e_code=0
130
             x = x 0
131
132
             out_array_index = 0
133
             thinning_counter = 0
134
             samples(1,:) = x_0
135
              a\_ave = 0.0\_dp
136
             log_rho_x = log_rho(x_0, dof_coefficients)
137
138
              !uses current random state if none is given
139
             if (present(seed)) then
140
                  call random_seed(put=seed)
141
             end if
142
143
             do loop index=1.n steps
144
                  x_prop = mcmc_propose(x,s,density_dimension)
                  call mcmc_accept(a, x, x_prop, log_rho, s, log_rho_x, log_rho_x_prop, dof_coefficients)
145
146
                  a = \exp(a)
147
                  call random_number(rand_sample)
148
                  if (a>rand_sample) then
149
                      x = x_prop
                      log_rho_x = log_rho_x_prop !using datalog_rho_x_prop from last loop, saves calls to rho
!computing average acceptance rate, will want to have way of outputing at some point
150
151
152
                       a\_ave = (1.0\_dp/loop\_index) * (a\_ave*(loop\_index-1.0\_dp) + 1.0\_dp)
153
                  else
154
                       a\_ave = (1.0\_dp/loop\_index) * (a\_ave*(loop\_index-1))
                  end if
155
156
                  if (loop_index.ge.n_burned) then
157
                      thinning_counter = thinning_counter+1
158
                  if (thinning_counter .ge. thinning_interval) then
  out_array_index = out_array_index+1
159
160
                       if (out_array_index>(n_steps-n_burned)/thinning_interval) then
161
                           e\_code = e\_code + 2 * * 2
162
163
                           print*, 'ERROR: Output larger than output array', loop_index
164
                           exit
165
                       end if
166
                      if (a.ne.a) then
                           e_code=e_code+1
167
                           print*, 'ERROR: NAN acceptance at:', loop index
168
169
170
171
                       if (a_ave.le.0) then
                            if (a_ave<0) then
172
                                e_code=e_code+2**1
print*, 'ERROR: Acceptance rate negative at:', loop_index
173
174
175
176
                           end if
177
                           print*, 'WARNING: Acceptance rate 0 at:', loop_index
178
                       end if
179
                       samples(out_array_index,:) = x
180
                      thinning_counter=0
                  end if
181
182
```

```
183
184
185 if (present(average_accept)) then
186 average_accept = a_ave
187 end if
188
```

Referenced by bond length driver(), main(), and main driver().

Here is the caller graph for this function:



11.12 param_search Module Reference

Functions/subroutines associated with building/initialisation the parameter search space and finding the best parameters from a given MCMC run.

Functions/Subroutines

- subroutine random_search_grid (trials, param_bounds, n_trials, seed_in)

 random_search_grid returns MxN grid of test points for M free parameters and N trials distributed
- subroutine latin_hypercube (trials, param_bounds, n_trials, seed_in)

 latin_hypercube returns MxN grid of test points for M free parameters and N trials on a latin hypercube for given
- bounds.subroutine find_best_params (trial_energies, trials)
- find_best_params returns the 1D array that contain the current best set of parameters found from a MCMC run.
- subroutine param_wall_check (param_bounds)
 param_wall_check evaluates if the best parameter set is close to the parameter bounds used to generate the test points.

Variables

- real(dp), dimension(:), allocatable, protected best_params
- integer, dimension(1), protected best_trial

11.12.1 Detailed Description

Functions/subroutines associated with building/initialisation the parameter search space and finding the best parameters from a given MCMC run.

11.12.2 Function/Subroutine Documentation

11.12.2.1 find best params()

find_best_params returns the 1D array that contain the current best set of parameters found from a MCMC run.

the output is stored in the global variable best_params.

Parameters

trial_energies	is a 1D array of the energies found for each parameter set.	
trials	is a 2D array containing the parameter set for each trial used in MCMC.	

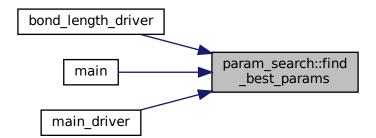
Definition at line 107 of file param_search.f90.

```
real(dp), dimension(:, :), allocatable, intent(in) :: trials
real(dp), dimension(:), allocatable, intent(in) :: trial_energies
integer, dimension(1) :: arr_shape
integer, dimension(1) :: arr_shape
arr_shape = shape(trials(1,:))
if (allocated(best_params)) deallocate(best_params)
allocate(best_params(arr_shape(1)))
best_trial = minloc(trial_energies) !index corresponding to the most negative, "best", energy.
best_params = trials(best_trial(1),:)
```

References best_params, and best_trial.

Referenced by bond_length_driver(), main(), and main_driver().

Here is the caller graph for this function:



11.12.2.2 latin hypercube()

latin_hypercube returns MxN grid of test points for M free parameters and N trials on a latin hypercube for given bounds.

Parameters

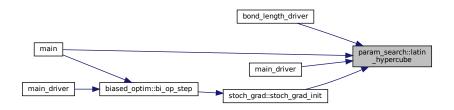
trials	is a 2D array containing the parameter set for each trial used in MCMC.
param_bounds	is a 2D array containing the upper and lower bounds for each parameter in the wavefunciton.
n_trials	is the number of trials to be tested in MCMC. This defines the binning of the Latin hypercube.
seed_in	is an integer that defines the seed being used to generate the latin Latin hypercube.

Definition at line 55 of file param_search.f90.

```
real(dp), dimension(:,:), intent(in) :: param_bounds !length of this will be the "N" real(dp), dimension(:,:), intent(inout) :: trials ! (x,y) x is each trial, y is each param integer, intent(in) :: n_trials, seed_in !n_trials is the "M" and is specified as an input, seed_in
5.5
56
                   is an integer used to set the seed.
58
                   real(dp), dimension(:),allocatable :: zero_to_one
59
                   real(dp) :: rand_num, temp_val
60
                   integer, dimension(2) :: arr_shape
                   integer :: i,j, k, h, n
integer,allocatable :: seed(:)
!setting a certain seed is done as shown below.
61
62
                   call random_seed(size=n)
                   allocate(seed(n))
65
66
                   seed = seed in
                                                                   !set seed value to that read in from input.
                  call random_seed(put=seed) !actually set the random seed for repeatability
67
68
69
                   ! arr_shape(1) contains the number of variables, param_bounds(x,y) where x is for each param and y
70
                   for limits
71
                   arr_shape = shape(param_bounds)
72
73
                   allocate(zero to one(n trials))
                  do i = 1,n_trials
75
                        {\tt zero\_to\_one(i) = (real(i, dp)-1.0\_dp)/(n\_trials-1.0\_dp) \; !extra \; bit \; needed \; to \; make \; sure \; we \; are \; are
                   binning right in the param search space!
76
77
                   ! initialize latin cube in order.
78
79
                  do i = 1, arr shape(1)
80
                       trials(:, i) = zero_to_one*(param_bounds(i,1) - param_bounds(i,2)) + param_bounds(i,2)
81
82
83
                   !scramble the array for each param.
                  do h = 1, 2 !sufficient scrambling.
84
                       do i = 1, arr_shape(1) !loop for each parameter.
85
                             do j = 1, n_trials !scramble over this loop
                                    call random_number(rand_num)
88
                                   k = 1 \, + \, floor((n\_trials+1-1) * rand\_num) \ ! this is how we are randomly selecting an index to swap.
89
                                   \label{temp_val} \mbox{temp\_val=trials(k,i) !store temp value to swap}
                                  trials(k,i) = trials(j,i) !swap points in the grid trials(j,i) = temp\_val !swap back the temp value. simple as.
90
91
92
                             end do
93
94
                   end do
9.5
96
                   deallocate (zero_to_one, seed)
```

Referenced by bond_length_driver(), main(), main_driver(), and stoch_grad::stoch_grad_init().

Here is the caller graph for this function:



11.12.2.3 param wall check()

param_wall_check evaluates if the best parameter set is close to the parameter bounds used to generate the test points.

The tolerence is set at 5%.

Parameters

param_bounds | is a 2D array containing the upper and lower bounds for each parameter in the wavefunciton.

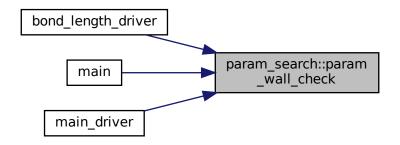
Definition at line 121 of file param_search.f90.

```
real(dp), dimension(:,:), allocatable ,intent(in) :: param_bounds
121
         real(dp), parameter :: tol = 0.05_dp !percentage tol as determined by the min and max bounds.
122
123
         real(dp) :: bound_gap
124
         integer :: i
125
126
         do i = 1, size(best_params)
127
           bound_gap = abs(param_bounds(i,1) - param_bounds(i,2))
           if (abs(best_params(i) - param_bounds(i,1))/bound_gap < tol & .or. abs(best_params(i) - param_bounds(i,2))/bound_gap < tol ) then
129
             print*, "parameter ", i, " is close to wall" !for later: might want to instead store i in and array of potential problem parameters.
130
131
132
              !As oppsed to just printing out the problem.
133
           end if
        end do
```

References best params.

Referenced by bond_length_driver(), main(), and main_driver().

Here is the caller graph for this function:



11.12.2.4 random_search_grid()

```
subroutine param_search::random_search_grid (
            real(dp), dimension(:, :), intent(inout) trials,
             real(dp), dimension(:,:), intent(in), allocatable param_bounds,
             integer, intent(in) n_trials,
             integer, intent(in) seed_in )
```

random_search_grid returns MxN grid of test points for M free parameters and N trials distributed

Parameters

trials	is a 2D array containing the parameter set for each trial used in MCMC.
param_bounds	is a 2D array containing the upper and lower bounds for each parameter in the wavefunciton.
n_trials	is the number of trials to be tested in MCMC. This defines the binning of the Latin hypercube.
seed_in	is an integer that defines the seed being used to generate the latin Latin hypercube.

Definition at line 19 of file param_search.f90.

```
real(dp), dimension(:,:), allocatable ,intent(in) :: param_bounds !length of this will be the "N" real(dp), dimension(:,:),intent(inout) :: trials ! (x,y) x is each trial, y is each param integer, intent(in) :: n_trials, seed_in!this is the "M" real(dp), dimension(:),allocatable :: rand_num
20
2.3
         integer, dimension(2) :: arr_shape
2.4
         integer :: i, n
25
         integer,allocatable :: seed(:)
         !initialising a certain seed is done as shown below.
26
         call random_seed(size=n)
         allocate(seed(n))
29
         seed = seed_in
                                !set seed to that read in from input.
30
         call random_seed(put=seed)
31
32
33
         ! arr_shape(1) contains the number of variables, param_bounds(x,y) where x is for each param and y
         arr_shape = shape(param_bounds)
35
36
         allocate(rand_num(n_trials))
38
         do i = 1,arr_shape(1)
         call random_number(rand_num)
```

```
40     trials(:, i) = rand_num*(param_bounds(i,1) - param_bounds(i,2)) + param_bounds(i,2)
41     end do
42
```

11.12.3 Variable Documentation

11.12.3.1 best_params

```
real(dp), dimension(:), allocatable, protected param_search::best_params

Definition at line 10 of file param_search.f90.

10 real(dp), dimension(:), allocatable, protected :: best_params
```

Referenced by find_best_params(), main(), main_driver(), and param_wall_check().

11.12.3.2 best_trial

```
integer, dimension(1), protected param_search::best_trial

Definition at line 11 of file param_search.f90.

11  integer, dimension(1), protected :: best_trial
```

Referenced by bond_length_driver(), find_best_params(), main(), and main_driver().

11.13 plotting Namespace Reference

Main plotting script which outputs the contour plots for the wavefunction or electron probability density.

Variables

• coords = np.loadtxt('xyz.txt')

Uploading the xy plane coordinates from the xyz.txt file generated from the xy_grid subroutine in netcdf_file.f90.

data = nc.Dataset('results.nc4', mode='r', format='NETCDF4')

Uploading the main results NetCDF file named results.nc4 generated from the result_netcdf routine.

• num_ele = data.variables['Num_of_Electrons'][:]

Prints a statement if it has been uploaded successfully.

- num_nuc = data.variables['Num_of_Nuclei'][:]
- x = coords[:,0]

Extracts the x and y coordinates from the xyz.txt.

- y = coords[:,1]
- wavefunction = data.variables['Electron_Density'][:]

This does the contour plot for the 1 electron case.

- dof = data.variables['Optimal DOF'][:]
- ele_den = data.variables['Electron_Density'][:]

Creates the contour plot of the wavefunction squared.

11.13.1 Detailed Description

Main plotting script which outputs the contour plots for the wavefunction or electron probability density.

11.13.2 Variable Documentation

11.13.2.1 coords

```
plotting.coords = np.loadtxt('xyz.txt')
```

Uploading the xy plane coordinates from the xyz.txt file generated from the xy_grid subroutine in netcdf_file.f90.

Definition at line 11 of file plotting.py.

11.13.2.2 data

```
plotting.data = nc.Dataset('results.nc4', mode='r', format='NETCDF4')
```

Uploading the main results NetCDF file named results.nc4 generated from the result_netcdf routine.

Parameters

data this contains all the information contained in the NetCDF file

Definition at line 15 of file plotting.py.

11.13.2.3 dof

```
plotting.dof = data.variables['Optimal_DOF'][:]
```

Parameters

dof	contains the degrees of freedom data
dof	the degrees of freedom

Definition at line 46 of file plotting.py.

11.13.2.4 ele_den

```
plotting.ele_den = data.variables['Electron_Density'][:]
```

Creates the contour plot of the wavefunction squared.

This does the contour plot for the 2 electron case. It returns a contour plot of the electron probability density in the xy plane

Parameters

ele_den	the electron probability density
---------	----------------------------------

Definition at line 62 of file plotting.py.

11.13.2.5 num ele

```
plotting.num_ele = data.variables['Num_of_Electrons'][:]
```

Prints a statement if it has been uploaded successfully.

Extracting the number of electrons and nuclei variables from the result file

Parameters

```
num_ele is the number of electrons used
```

Definition at line 25 of file plotting.py.

11.13.2.6 num_nuc

```
plotting.num_nuc = data.variables['Num_of_Nuclei'][:]
```

Parameters

```
num_nuc is the number of nuclei
```

Definition at line 28 of file plotting.py.

11.13.2.7 wavefunction

```
plotting.wavefunction = data.variables['Electron_Density'][:]
```

This does the contour plot for the 1 electron case.

It returns a contour plot of the wavefunction squared in the xy plane

Extracts the wavefunction and degrees of freedom parameters from the input NetCDF file

Parameters

wavefunction contains the wavefunction data

Definition at line 44 of file plotting.py.

11.13.2.8 x

```
plotting.x = coords[:,0]
```

Extracts the x and y coordinates from the xyz.txt.

Parameters

X	is the x coordinates
У	is the y coordinates

Definition at line 35 of file plotting.py.

11.13.2.9 y

```
plotting.y = coords[:,1]
```

Definition at line 36 of file plotting.py.

11.14 priors Module Reference

Functions for obtaining the prior mean and its derivative.

Functions/Subroutines

- real(dp) function prior_mean (x)
 - Gives the prior mean.
- real(dp) function prior_mean_dx (x, dim)

Derivative of the prior mean.

11.14.1 Detailed Description

Functions for obtaining the prior mean and its derivative.

11.14.2 Function/Subroutine Documentation

11.14.2.1 prior_mean()

Gives the prior mean.

Definition at line 9 of file priors.f90.

```
9     implicit none
10     real(dp), dimension(:), intent(in) :: x !param space point
11     real(dp) :: out
12
13     out = 1.0_dp
14
```

Referenced by main().

Here is the caller graph for this function:



11.14.2.2 prior_mean_dx()

Derivative of the prior mean.

Definition at line 19 of file priors.f90.

```
implicit none
integer, intent(in) :: dim
real(dp), dimension(:), intent(in) :: x !param space point
real(dp) :: out

out = 0.0_dp
```

Referenced by main().

Here is the caller graph for this function:



11.15 read_data Module Reference

Subroutines to read files and transfer user inputs into fortran.

Functions/Subroutines

subroutine readtxt (filename, n_electrons_in, n_atoms_in, bond_length, n_trials, n_MCMC_steps, n_omp_
 threads, use_biased_optimiser, n_optimiser_steps, basis_type_in, proton_number_int_in, search_seed, n_
 basis_functions_per_atom_in, n_Jastrow_in, fd_length_in, Jastrow_b_length_in, Jastrow_d_length_in, plot
 _distance, plot_points)

Read in data from a text file.

11.15.1 Detailed Description

Subroutines to read files and transfer user inputs into fortran.

11.15.2 Function/Subroutine Documentation

11.15.2.1 readtxt()

```
integer search_seed,
integer n_basis_functions_per_atom_in,
integer n_Jastrow_in,
real(dp) fd_length_in,
real(dp) Jastrow_b_length_in,
real(dp) Jastrow_d_length_in,
real(dp) plot_distance,
integer plot_points)
```

Read in data from a text file.

This module reads txt, csv files line by line. The implementation is basic but will read each line properly as it was written specifically for the parameters needed from the user.

Parameters

filename	Filename of input text file
n_electrons_in	Number of electrons
n_atoms_in	Number of atoms
bond_length	Bond length for 2 atoms
n_trials	number of trials in the hypercube search (for each step of the biased optimiser)
n_mcmc_steps	Total number of steps for each MCMC run
n_omp_threads	Number of OMP Threads
use_biased_optimiser	Flag for use of biased optimiser: true uses biased optimiser, false just uses hypercube search
n_optimiser_steps	Number of steps in the optimser
n_basis_functions_per_atom↔ _in	Number of linear terms in the single-electron wavefunction per atom
search_seed	Seed for the latin hypercube
n_jastrow_in	Number of dofs in the Jastrow (interaction) term
fd_length_in	Lengthscale of the finite difference code
jastrow_b_length_in	Inverse lengthscale of nuclear-electron interaction
jastrow_d_length_in	Inverse lengthscale of electron-electron interaction
proton_number_int_in	Proton number of atoms
basis_type_in	integer code for type of basis. Codes defined in shared_constants.f90
plot_distance	Amount of distance away from atoms to plot
plot_points	Number of points along each axis to plot

Integer value to determine if biased optimiser should be used

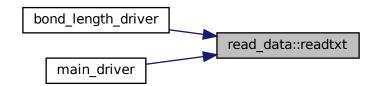
Definition at line 21 of file read_data.f90.

```
22
            ! User Inputs required - the user must define all of these
23
           ! Will obtain these from either txt file or a gui that generates the txt file
24
           CHARACTER(LEN=20) :: filename
28
           {\tt integer} \ :: \ {\tt n\_electrons\_in}
30
           integer :: n_atoms_in
32
           real(dp) :: bond_length
           integer :: n_trials
integer :: n_MCMC_steps
34
36
38
           integer :: n_omp_threads
40
           logical :: use_biased_optimiser
           integer :: n_optimiser_steps
! Optional user Inputs - these may be defined by the user, but have good default values below
42
43
           integer :: n_basis_functions_per_atom_in
integer :: search_seed
45
47
           integer :: n_Jastrow_in
```

```
real(dp) :: fd_length_in
            real(dp) :: Jastrow_b_length_in
55
            real(dp) :: Jastrow_d_length_in
57
            integer :: proton_number_int_in
59
            integer :: basis_type_in
60
62
            real(dp) :: plot_distance
            integer :: plot_points
65
67
            integer :: bias_opt_0_1
68
69
70
71
72
73
74
           OPEN(unit = 7, file = filename)
75
           ! Read in lines containing only one value
76
           READ(7,*) n_electrons_in
           READ(7,*) n_atoms_in
78
           READ(7,*) bond_length
79
           READ(7,*) n_trials
80
           READ(7,*) n_mcmc_steps
          READ(7,*) bias_opt_0_1
READ(7,*) n_optimiser_steps
81
82
           READ(7,*) basis_type_in
83
84
           READ(7,*) proton_number_int_in
85
           READ(7, \star) n_omp_threads
86
           READ(7, \star) search_seed
          \begin{tabular}{lll} READ (7,\star) & n\_basis\_functions\_per\_atom\_in \\ READ (7,\star) & n\_jastrow\_in \\ \end{tabular}
87
88
89
           READ(7,*) fd_length_in
90
           READ(7,*) jastrow_b_length_in
91
           \texttt{READ}\,(\texttt{7,*}) \;\; \texttt{jastrow\_d\_length\_in}
          READ(7,*) plot_distance
READ(7,*) plot_points
92
93
94
           CLOSE (7)
95
97
           if (bias_opt_0_1 == 1) then
          use_biased_optimiser = .true.
else if ( bias_opt_0_1 == 0 ) then
98
99
             use_biased_optimiser = .false.
100
101
102
103
104
         ! Print to see if data was properly read into fortran
105
            ! PRINT *, n_electrons_in
            ! PRINT \star, n_atoms_in
106
107
            ! PRINT *, bond_length
            ! PRINT *, n_trials
108
109
            ! PRINT *, n_MCMC_steps
110
            ! PRINT *, n_basis_functions_per_atom_in
111
            ! PRINT *, search_seed
            ! PRINT *, n_Jastrow_in
112
            ! PRINT *, fd_length_in
! PRINT *, Jastrow_b_length_in
113
115
            ! PRINT *, Jastrow_d_length_in
116
```

Referenced by bond_length_driver(), and main_driver().

Here is the caller graph for this function:



11.16 shared_constants Module Reference

Definitions of shared constants used throughout the software.

Variables

- integer, parameter dp = real64
- real(dp), parameter pi = 3.141592653589793238 dp
- real(dp), parameter electronvolt = 27.211386245988 dp
- integer, parameter slater_1s_code = 100
- integer, parameter sto_3g_code = 200

11.16.1 Detailed Description

Definitions of shared constants used throughout the software.

11.16.2 Variable Documentation

integer, parameter :: dp = real64

11.16.2.1 dp

```
integer, parameter shared_constants::dp = real64
Definition at line 6 of file constants.f90.
```

Referenced by bond_length_driver(), main(), and main_driver().

11.16.2.2 electronvolt

```
real(dp), parameter shared_constants::electronvolt = 27.211386245988_dp

Definition at line 8 of file constants.f90.
8  real(dp), parameter :: electronvolt = 27.211386245988_dp
```

Referenced by main(), and main_driver().

11.16.2.3 pi

```
real(dp), parameter shared_constants::pi = 3.141592653589793238_dp

Definition at line 7 of file constants.f90.
7  real(dp), parameter :: pi = 3.141592653589793238_dp
```

Referenced by component_functions::centered_gaussian(), component_functions::centered_slater_1s(), stoch_ \leftarrow grad::grad_accent(), and mcmc::log_rho_interface::log_rho_interface().

11.16.2.4 slater_1s_code

```
integer, parameter shared_constants::slater_1s_code = 100

Definition at line 11 of file constants.f90.
11 integer, parameter :: slater_1s_code = 100
```

Referenced by bond_length_driver(), basis_functions::initialise_basis(), and main_driver().

11.16.2.5 sto_3g_code

```
integer, parameter shared_constants::sto_3g_code = 200

Definition at line 12 of file constants.f90.
12  integer, parameter :: sto_3g_code = 200
```

Referenced by basis functions::initialise basis().

11.17 stoch_grad Module Reference

Optimization modules.

Functions/Subroutines

subroutine stoch_grad_init (N, best_from_last_run_in, seed)

Initalises module variables and sets up starts points for the restarts of the gradient assent.

• subroutine stoch_grad_exit ()

deallocates state variables

subroutine grad_accent (X_0, sequence_length, no_samples, gamma, out)

Performs the gradient assent for sequence length X_0 is the intial point to start the assent at sequence_length is how long the sequence to average over is No_samlples is the number of samples taken in the gradient estimator, gamma is parameter to tune for how much to move the next point long the estimated gradient out is the output and used to compute the sum on the go.

real(dp) function, dimension(x_shape(1), x_shape(2)) g_t (X, no_samples, X_shape)

Return an estimate for the gradient which is an average over no_samples.

• real(dp) function, dimension(:,:), allocatable nearest_point (bounds, X)

Returns a new point back to the search space if it leaves.

Variables

- integer n_restarts
- real(dp), dimension(:,:,:), allocatable n points

11.17.1 Detailed Description

Optimization modules.

11.17.2 Function/Subroutine Documentation

11.17.2.1 g_t()

Return an estimate for the gradient which is an average over no_samples.

Parameters

X	initial input
no_samples	how many samples you want to use from the gradient estimator
X_shape	defines the shape of the output

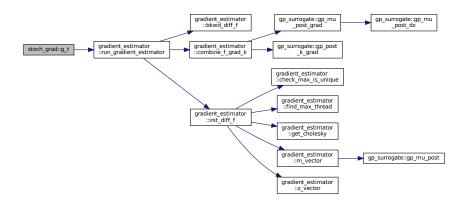
Definition at line 116 of file stoch grad.f90.

```
116
117
         implicit none
118
         INTEGER:: no_samples
119
         real(dp), dimension(:,:), intent(in) :: X
         integer, dimension(2), intent(in) :: X_shape
real(dp), DIMENSION(X_shape(1), X_shape(2)) :: G_t
120
121
122
         INTEGER :: i
123
124
         g_t=x
125
126
         do i = 1, no_samples
127
128
              g_t = g_t + run_gradient_estimator(g_t, gaussian(size(x,1)), n_dof, best_from_last_run)
129
130
131
132
         g_t = g_t/no_samples
133
```

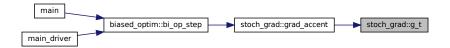
References gradient_estimator::run_gradient_estimator().

Referenced by grad_accent().

Here is the call graph for this function:



Here is the caller graph for this function:



11.17.2.2 grad_accent()

Performs the gradient assent for sequence length X_0 is the intial point to start the assent at sequence_length is how long the sequence to average over is No_samlples is the number of samples taken in the gradient estimator, gamma is parameter to tune for how much to move the next point long the estimated gradient out is the output and used to compute the sum on the go.

as result is taken as average, computing on the go uses less memory

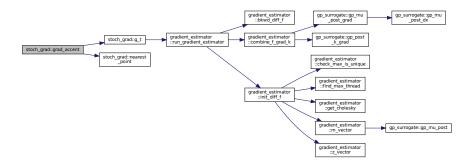
Definition at line 58 of file stoch_grad.f90.

```
58
59
        implicit none
60
        real(dp), dimension(:,:),intent(in) :: X_0
       real(dp), dimension(:,:), intent(out) :: out
real(dp), dimension(:,:), allocatable :: X_t,X_t_prev
61
        real(dp) :: gamma
       INTEGER::i, sequence_length, no_samples
65
        ALLOCATE(x_t(size(x_0,1), size(x_0,2)))
66
        ALLOCATE(x_t_prev(size(x_0,1), size(x_0,2)))
67
69
70
        x_t_prev=x_0
       out = x_t_prev
do i = 1, sequence_length
71
72
73
          \texttt{x\_t} = \texttt{nearest\_point} (\texttt{dof\_bounds}, (\texttt{x\_t\_prev} + \texttt{gamma*g\_t} (\texttt{x\_t\_prev}, \texttt{no\_samples}, \texttt{shape} (\texttt{x\_t})))) ) 
75
         x_t_prev = x_t
76
77
78
       end do
79
80
       out = out/real(sequence_length+1)
```

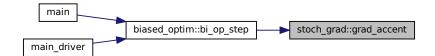
References basis_functions::dof_bounds, g_t(), nearest_point(), and shared_constants::pi.

Referenced by biased_optim::bi_op_step().

Here is the call graph for this function:



Here is the caller graph for this function:



11.17.2.3 nearest_point()

```
real(dp) function, dimension(:,:), allocatable stoch_grad::nearest_point ( real(dp), dimension(:,:), intent(in) bounds, real(dp), dimension(:,:), intent(in) X)
```

Returns a new point back to the search space if it leaves.

Parameters

Χ	new suggested point
bounds	the degree of freedom bounds defined on input

Definition at line 140 of file stoch_grad.f90.

```
140
141
          real(dp), dimension(:,:), intent(in) :: bounds
real(dp), dimension(:,:),INTENT(IN):: X
142
143
144
          \verb"real(dp)", dimension(:,:)", \verb"ALLOCATABLE": X_Out"
145
          INTEGER :: i, j
146
147
          ALLOCATE(x_{out}(size(x,1), size(x,2)))
148
149
          do i = 1, size(x, 1)
150
151
               do j = 1 , size(x, 2)
152
153
                    if (x(i,j) < bounds(j,1)) then
```

```
154
                      x_{out}(i,j) = bounds(j,1)
155
156
                 else if (x(i,j)>bounds(j,2)) then
157
                      x_{out(i,j)} = bounds(j,2)
158
159
                      x_{out}(i,j) = x(i,j)
160
161
162
             end do
163
164
165
        end do
166
```

Referenced by grad_accent().

Here is the caller graph for this function:



11.17.2.4 stoch_grad_exit()

```
subroutine stoch_grad::stoch_grad_exit
```

deallocates state variables

Definition at line 44 of file stoch_grad.f90.

```
44 implicit none
45
46 deALLOCATE(n_points)
47
```

References n_points.

Referenced by main().

Here is the caller graph for this function:



11.17.2.5 stoch_grad_init()

```
subroutine stoch_grad::stoch_grad_init (
    integer, intent(in) N,
    real(dp), intent(in) best_from_last_run_in,
    integer, dimension(:), intent(in) seed )
```

Initalises module variables and sets up starts points for the restarts of the gradient assent.

Parameters

N	sets number of restarts
best_from_last_run←	gives the best energy from the last set of points
_in	
seed	random seed in

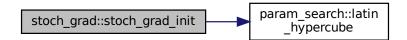
Definition at line 23 of file stoch_grad.f90.

```
implicit none
24
25
        INTEGER, INTENT(IN) :: N
       real(dp), intent(in) :: best_from_last_run_in integer, dimension(:), INTENT(IN):: seed
26
28
       integer :: i
30
        n\_dof = size(dof\_bounds, 1)
        n_restarts = n
31
32
33
       ALLOCATE(n_points(n_restarts,n_restarts,n_dof))
       best_from_last_run=best_from_last_run_in
35
36
        do i=1,n_restarts
37
            call latin_hypercube(n_points(i,:,:),dof_bounds, n_restarts ,seed(1))
38
        end do
39
```

References basis_functions::dof_bounds, param_search::latin_hypercube(), n_points, and n_restarts.

Referenced by biased_optim::bi_op_step().

Here is the call graph for this function:



Here is the caller graph for this function:



11.17.3 Variable Documentation

11.17.3.1 n_points

```
real(dp), dimension(:,:,:), allocatable stoch_grad::n_points

Definition at line 13 of file stoch_grad.f90.
13 real(dp), DIMENSION(:,:,:), ALLOCATABLE :: N_points
```

Referenced by biased_optim::bi_op_step(), stoch_grad_exit(), and stoch_grad_init().

11.17.3.2 n restarts

```
integer stoch_grad::n_restarts
```

Definition at line 11 of file stoch_grad.f90.

Referenced by stoch grad init().

11.18 write_file Module Reference

Contains all the subroutines related to writing results to file.

Functions/Subroutines

• subroutine result_netcdf (dof, ele, num_ele, num_nuc)

Main results writing to NetCDF file.

• subroutine energies_netcdf (energies, bondlen)

Output results for bond lengths and corresponding energy used for plotting.

subroutine xy_grid (points, box_size)

Writes the xyz coordinates used in the calculation of either the wavefunction or electron density to a text file names xyz.txt.

subroutine write_restart_file (gp_n_data, gp_n_dof, n_cycles, no_samples, current_best_E, constant_
 mean_value, gamma, kernel_var, kernal_inv_length, E_data, data_mean, param_pres, param_cov, param
 __data)

Creates a NetCDF file which contains information needed for the restart of the Bi_Op_step function.

• subroutine handle_err (ierr)

Handles the NetCDF errors and print statements.

11.18.1 Detailed Description

Contains all the subroutines related to writing results to file.

This module contains all the subroutines needed for all the output result files which will be used for plotting and restarting.

11.18.2 Function/Subroutine Documentation

11.18.2.1 energies_netcdf()

Output results for bond lengths and corresponding energy used for plotting.

Will only be used for the 2 nuclei case.

Parameters

filename

outputs a NetCDF file named bond length.nc4

Dimension names

ID's

Inputting the data

Writing data to file

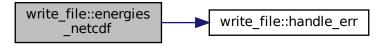
Closing the file

Definition at line 115 of file netcdf_file.f90.

```
115
         INTEGER, PARAMETER :: dp=kind(1.0d0)
116
117
         ! Inputting variables
119
         CHARACTER(LEN=100) :: filename = 'bond_length.nc4'
120
         REAL(dp), DIMENSION(:), INTENT(IN) :: energies, bondlen
121
         CHARACTER(LEN=100), DIMENSION(1) :: dim_e = (/"Energy"/)
123
124
         CHARACTER (LEN=100), DIMENSION(1) :: dim_b = (/"Bond_Lengths"/)
125
127
         ! File IDs
128
         INTEGER :: ierr, file_id
129
         ! Variable ID's
         INTEGER :: var_e, var_b
! Dimension ID's for the arrays
INTEGER, DIMENSION(1) :: did_e, did_b
130
131
132
133
         ! Implicit types for the array sizes
134
         INTEGER, DIMENSION(1) :: size_e, size_b
135
136
         ! Create the file
         ierr = nf90_create(filename, nf90_clobber, file_id)
IF (ierr /= nf90_noerr) CALL handle_err(ierr)
137
138
139
140
         ! Variable sizes
         size_e = shape(energies)
size_b = shape(bondlen)
141
142
         IF (ierr /= nf90_noerr) CALL handle_err(ierr)
143
144
146
         ! Energies
         ierr = nf90\_def\_dim(file\_id, dim\_e(1), size\_e(1), did\_e(1))
         IF (ierr /= nf90_noerr) CALL handle_err(ierr)
ierr = nf90_def_var(file_id, "Energy", nf90_double, did_e, var_e)
148
149
150
         ! Bond length
151
152
         ierr = nf90_def_dim(file_id, dim_b(1), size_b(1), did_b(1))
153
         IF (ierr /= nf90_noerr) CALL handle_err(ierr)
154
         ierr = nf90_def_var(file_id, "Bond_length", nf90_double, did_b, var_b)
155
156
           ! Metadata
         ierr = nf90_enddef(file_id)
IF (ierr /= nf90_noerr) CALL handle_err(ierr)
157
158
161
162
         ierr = nf90_put_var(file_id, var_e, energies)
163
         IF (ierr /= nf90_noerr) CALL handle_err(ierr)
164
165
         ierr = nf90_put_var(file_id, var_b, bondlen)
166
         IF (ierr /= nf90_noerr) CALL handle_err(ierr)
167
169
         ierr = nf90_close(file_id)
170
         IF (ierr /= nf90_noerr) CALL handle_err(ierr)
171
         !Finishing statement if writing file is successful.
172
         print *, "Success in writing the NETCDF file: ", filename
173
```

References handle_err().

Here is the call graph for this function:



11.18.2.2 handle_err()

Handles the NetCDF errors and print statements.

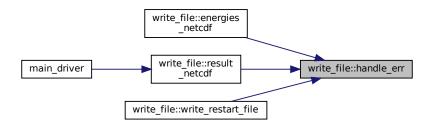
This subroutine is only used and called within this module.

Definition at line 436 of file netcdf_file.f90.

```
436
437 INTEGER, INTENT(IN) :: ierr
438
439 IF (ierr /= nf90_noerr) THEN
440 print *, trim(nf90_strerror(ierr))
441 ! Stops the code if an error is found
442 stop "Stopped"
443 END IF
444
```

Referenced by energies_netcdf(), result_netcdf(), and write_restart_file().

Here is the caller graph for this function:



11.18.2.3 result_netcdf()

Main results writing to NetCDF file.

The result_netcdf subroutine outputs the main NetCDF result file containing the optimal degrees of freedom, either the electron density or wavefunction and the number of electrons and nuclei used. Saves the file as results.nc4 which is used Has error statements printed out at each section in order to aid with debugging.

Parameters

in	dof	dof the optimal degrees of freedom	
in	ele	ele an rank 1 array containing either the wavefunction or electron density results evaluated on a grid op coordinates (for 1 or 2 electron system respectively).	
in	num_ele	num_ele the number of electrons used in the calculation	
	num_nuc	the number of nuclei used in the calculation	
in	num_nuc	num_ele the number of electrons used in the calculation	
	num_nuc	the number of nuclei used in the calculation	

Dimension names for the arrays.

ID's

Inputting the data

Writing the data to file

Closing the file

Definition at line 19 of file netcdf_file.f90.

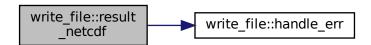
```
INTEGER, PARAMETER :: dp=kind(1.0d0)
20
         CHARACTER(LEN=100) :: filename = 'results.nc4'
REAL(dp), DIMENSION(:), INTENT(IN) :: dof
REAL(dp), DIMENSION(:), INTENT(IN) :: ele
22
24
26
         INTEGER, INTENT(IN) :: num_ele, num_nuc
30
        CHARACTER(LEN=100), DIMENSION(1) :: dim_dof = (/"Optimal_DOF"/)
CHARACTER(LEN=100), DIMENSION(1) :: dim_ele = (/"Electron_Density"/)
32
33
34
         ! File ID's
36
         INTEGER :: ierr, file_id
38
         ! Variable ID's
39
         INTEGER :: var_dof, var_ele, var_num_ele, var_num_nuc
40
         ! Dimension \ensuremath{\mathsf{ID'}} \ensuremath{\mathsf{s}} for the arrays
         INTEGER, DIMENSION(1) :: did_dof, did_ele
41
42
         ! Implicit types for the sizes for the arrays
43
         INTEGER, DIMENSION(1) :: size_dof, size_ele
45
         ! Create the file
         ierr = nf90_create(filename, nf90_clobber, file_id)
46
47
         IF (ierr /= nf90_noerr) CALL handle_err(ierr)
48
         ! Variable sizes
         size\_dof = shape(dof)
        size_ele = shape(ele)
IF (ierr /= nf90_noerr) CALL handle_err(ierr)
52
5.3
55
         ! Number of electrons
56
         ierr = nf90_def_var(file_id, "Num_of_Electrons", nf90_double, var_num_ele)
```

```
58
         IF (ierr /= nf90_noerr) CALL handle_err(ierr)
60
         ! Number of nuclei
        ierr = nf90_def_var(file_id, "Num_of_Nuclei", nf90_double, var_num_nuc)
IF (ierr /= nf90_noerr) CALL handle_err(ierr)
61
62
63
64
         \verb|ierr = nf90_def_dim(file_id, dim_dof(1), size_dof(1), did_dof(1))|
66
         IF (ierr /= nf90_noerr) CALL handle_err(ierr)
         ierr = nf90_def_var(file_id, "Optimal_DOF", nf90_double, did_dof, var_dof)
67
68
         ! Electron Density
69
         ierr = nf90_def_dim(file_id, dim_ele(1), size_ele(1), did_ele(1))
IF (ierr /= nf90_noerr) CALL handle_err(ierr)
70
71
72
         ierr = nf90_def_var(file_id, "Electron_Density", nf90_double, did_ele, var_ele)
73
74
75
         ! Metadata
76
         ierr = nf90_enddef(file_id)
         IF (ierr /= nf90_noerr) CALL handle_err(ierr)
78
79
81
         ! Number of electrons
82
        ierr = nf90_put_var(file_id, var_num_ele, num_ele)
IF (ierr /= nf90_noerr) CALL handle_err(ierr)
83
85
86
         ! Number of nuclei
        ierr = nf90_put_var(file_id, var_num_nuc, num_nuc)
IF (ierr /= nf90_noerr) CALL handle_err(ierr)
87
88
89
90
         ! DOF
         ierr = nf90_put_var(file_id, var_dof, dof)
         IF (ierr /= nf90_noerr) CALL handle_err(ierr)
93
         ! Electron Density
94
        ierr = nf90_put_var(file_id, var_ele, ele)
IF (ierr /= nf90_noerr) CALL handle_err(ierr)
95
96
98
100
          ierr = nf90_close(file_id)
101
          IF (ierr /= nf90_noerr) CALL handle_err(ierr)
          !Finishing statement if writing file is successful. print \star , "Success in writing the NETCDF file: ", filename
103
104
105
```

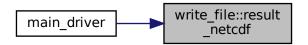
References handle err().

Referenced by main_driver().

Here is the call graph for this function:



Here is the caller graph for this function:



11.18.2.4 write_restart_file()

```
subroutine write_file::write_restart_file (
    real(dp) gp_n_data,
    real(dp) gp_n_dof,
    real(dp) n_cycles,
    real(dp) no_samples,
    real(dp) current_best_E,
    real(dp) constant_mean_value,
    real(dp) gamma,
    real(dp) kernel_var,
    real(dp) kernal_inv_length,
    real(dp), dimension(:), intent(in) E_data,
    real(dp), dimension(:), intent(in) param_pres,
    real(dp), dimension(:,:), intent(in) param_cov,
    real(dp), dimension(:,:), intent(in) param_data)
```

Creates a NetCDF file which contains information needed for the restart of the Bi_Op_step function.

This file will be created in the event that the Bi_Op_step function crashes.

Parameters

gp_n_data	Defining everything for the scalar variables
gp_n_data	is the data used for the GP surrogate
gp_n_dof	is the degrees of freedom used for the GP surrogate
n_cycles	is the number of cycles
no_samples	is the number of samples
current_best_E	is the current best energy found so far during the run.
constant_mean_value	
gamma	
kernel_var	
kernal_inv_length	
gp_n_dof	Defining everything for the scalar variables
gp_n_data	is the data used for the GP surrogate
gp_n_dof	is the degrees of freedom used for the GP surrogate
n_cycles	is the number of cycles

Parameters

	no_samples	is the number of samples
	current best E	is the current best energy found so far during the run.
	constant_mean_value	is the current best energy lound so lai duffing the full.
	gamma	
	kernel var	
	kernal_inv_length	
	n_cycles	Defining everything for the scalar variables
	gp_n_data	is the data used for the GP surrogate
		is the degrees of freedom used for the GP surrogate
n_cycles is the		is the number of cycles
		-
no_samples is the number of samples		·
	current_best_E	is the current best energy found so far during the run.
	constant_mean_value	
	gamma kornol var	
	kernel_var kernal_inv_length	
		Defining everything for the explor veriables
	no_samples	Defining everything for the scalar variables
	gp_n_data	is the data used for the GP surrogate
	gp_n_dof	is the degrees of freedom used for the GP surrogate
	n_cycles	is the number of cycles
	no_samples	is the number of samples
	current_best_E	is the current best energy found so far during the run.
	constant_mean_value	
	gamma	
	kernel_var	
	kernal_inv_length	
	current_best_e	Defining everything for the scalar variables
	gp_n_data	is the data used for the GP surrogate
	gp_n_dof	is the degrees of freedom used for the GP surrogate
	n_cycles	is the number of cycles
	no_samples	is the number of samples
	current_best_E	is the current best energy found so far during the run.
	constant_mean_value	
	gamma	
	kernel_var	
	kernal_inv_length	
in	e_data	Defining everything for the array variables Rank 1 arrays
	E_data	is a rank 1 array containing the energy data
	data_mean	is the
in	param_pres	Rank 2 arrays
	param_pres	rank 2 array containing @param_cov rank 2 array containing the covariance matrix
	param_data	
		I .

Dimension Names - named the same as the input variables

ID's

Create the file

Defining the Scalar Variables

Inputting in the Array variables and defining the dimensions

Rank 1 arrays first

Rank 2 arrays

Writing the array data to file

Scalar Values

Rank 1 arrays

Rank 2 arrays

Closing the file

Definition at line 224 of file netcdf file.f90.

```
225
226
         INTEGER, PARAMETER :: dp=kind(1.0d0)
         ! Declaring the input variables
CHARACTER(LEN=100) :: filename = 'restart.nc4'
227
229
230
232
         INTEGER :: ierr, file_id, i
233
244
         \texttt{REAL}(\texttt{dp}) \ :: \ \texttt{gp\_n\_data}, \ \texttt{gp\_n\_dof}, \ \texttt{n\_cycles}, \ \texttt{no\_samples}, \ \texttt{current\_best\_E}
245
         REAL(dp) :: constant_mean_value, gamma, kernel_var, kernal_inv_length
246
248
         INTEGER :: var_gp_n_data, var_gp_n_dof, var_n_cycles, var_no_samples
249
         INTEGER :: var_current_best_E, var_constant_mean_value, var_gamma
250
         INTEGER :: var_kernel_var, var_kernal_inv_length
251
256
         \texttt{REAL}(\texttt{dp), DIMENSION(:), INTENT(IN) :: E\_data}
257
         REAL(dp), DIMENSION(:), INTENT(IN) :: data_mean
258
263
264
         REAL(dp), DIMENSION(:,:), INTENT(IN) :: param_pres
265
         REAL(dp), DIMENSION(:,:), INTENT(IN) :: param_cov
266
         REAL(dp), DIMENSION(:,:), INTENT(IN) :: param_data
267
269
         CHARACTER(LEN=100), DIMENSION(1) :: dim_e_data = (/"E_Data"/)
         CHARACTER (LEN=100), DIMENSION(1) :: dim_data_mean = (/"data_mean"/)
270
271
         CHARACTER(LEN=100), DIMENSION(2) :: dim_param_pres = (/"param_pres","param_pres"/)
CHARACTER(LEN=100), DIMENSION(2) :: dim_param_cov = (/"param_cov","param_cov"/)
272
273
         CHARACTER(LEN=100), DIMENSION(2) :: dim_param_data = (/"param_data","param_data"/)
274
275
         ! Variable IDs
278
         INTEGER :: var_e_data, var_data_mean, var_param_pres
279
         INTEGER :: var_param_cov, var_param_data
280
         ! Dimension IDs for the arrays
INTEGER, DIMENSION(1) :: did_e_data, did_data_mean
INTEGER, DIMENSION(2) :: did_param_cov, did_param_data, did_param_pres
281
282
283
284
285
286
         INTEGER, DIMENSION(1) :: size_e_data, size_data_mean
287
         INTEGER, DIMENSION(2) :: size_param_cov, size_param_data, size_param_pres
288
289
291
         ierr = nf90_create(filename, nf90_clobber, file_id)
292
         IF (ierr /= nf90_noerr) CALL handle_err(ierr)
293
294
295
         ! Variable sizes
296
         size_e_data = shape(e_data)
         size_data_mean = shape(data_mean)
size_param_pres = shape(param_pres)
297
298
299
         size_param_cov = shape(param_cov)
300
         size_param_data = shape(param_data)
301
303
304
         ierr = nf90_def_var(file_id, "gp_n_data", nf90_double, var_gp_n_data)
         IF (ierr /= nf90_noerr) CALL handle_err(ierr)
```

```
306
        ierr = nf90_def_var(file_id, "gp_n_dof", nf90_double, var_gp_n_dof)
307
308
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
309
        ierr = nf90_def_var(file_id, "n_cycles", nf90_double, var_n_cycles)
310
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
311
312
313
        ierr = nf90_def_var(file_id, "no_samples", nf90_double, var_no_samples)
314
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
315
        ierr = nf90_def_var(file_id, "current_best_e", nf90_double, var_current_best_e)
IF (ierr /= nf90_noerr) CALL handle_err(ierr)
316
317
318
319
        ierr = nf90_def_var(file_id, "constant_mean_value", nf90_double, var_constant_mean_value)
320
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
321
        ierr = nf90_def_var(file_id, "gamma", nf90_double, var_gamma)
322
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
323
324
325
        ierr = nf90_def_var(file_id, "kernel_var", nf90_double, var_kernel_var)
326
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
327
        ierr = nf90_def_var(file_id, "kernal_inv_length", nf90_double, var_kernal_inv_length)
328
329
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
330
331
333
335
336
        ierr = nf90_def_dim(file_id, dim_e_data(1), size_e_data(1), did_e_data(1))
337
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
ierr = nf90_def_var(file_id, "E_data", nf90_double, did_e_data, var_e_data)
338
339
340
        ierr = nf90_def_dim(file_id, dim_data_mean(1), size_data_mean(1), did_data_mean(1))
341
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
342
        ierr = nf90_def_var(file_id, "data_mean", nf90_double, did_data_mean, var_data_mean)
343
345
346
        DO i = 1, 2
347
         ierr = nf90_def_var(file_id, dim_param_pres(i), size_param_pres(i), did_param_pres(i))
348
          IF (ierr /= nf90_noerr) CALL handle_err(ierr)
349
350
        ierr = nf90_def_var(file_id, "param_pres", nf90_double, did_param_pres, var_param_pres)
351
352
        DO i = 1, 2
353
         ierr = nf90_def_var(file_id, dim_param_cov(i), size_param_cov(i), did_param_cov(i))
354
          IF (ierr /= nf90_noerr) CALL handle_err(ierr)
355
356
        ierr = nf90_def_var(file_id, "param_cov", nf90_double, did_param_cov, var_param_cov)
357
358
         ierr = nf90_def_var(file_id, dim_param_data(i), size_param_data(i), did_param_data(i))
IF (ierr /= nf90_noerr) CALL handle_err(ierr)
359
360
361
362
        ierr = nf90_def_var(file_id, "param_data", nf90_double, did_param_data, var_param_data)
363
364
365
        ! Metadata
366
        ierr = nf90_enddef(file_id)
367
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
368
369
371
373
374
        ierr = nf90_put_var(file_id, var_gp_n_data, gp_n_data)
375
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
376
377
        ierr = nf90_put_var(file_id, var_gp_n_dof, gp_n_dof)
378
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
379
380
        ierr = nf90_put_var(file_id, var_n_cycles, n_cycles)
381
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
382
        ierr = nf90_put_var(file_id, var_no_samples, no_samples)
IF (ierr /= nf90_noerr) CALL handle_err(ierr)
383
384
385
386
        ierr = nf90_put_var(file_id, var_current_best_e, current_best_e)
387
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
388
389
        ierr = nf90_put_var(file_id, var_constant_mean_value, constant_mean_value)
390
        IF (ierr /= nf90 noerr) CALL handle err(ierr)
391
392
        ierr = nf90_put_var(file_id, var_gamma, gamma)
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
393
394
395
        ierr = nf90_put_var(file_id, var_kernel_var, kernel_var)
396
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
397
```

```
398
        ierr = nf90_put_var(file_id, var_kernal_inv_length, kernal_inv_length)
399
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
400
402
403
        ierr = nf90_put_var(file_id, var_e_data, e_data)
404
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
405
406
        ierr = nf90_put_var(file_id, var_data_mean, data_mean)
407
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
408
410
        ierr = nf90_put_var(file_id, var_param_pres, param_pres)
411
412
        IF (ierr /= nf90 noerr) CALL handle err(ierr)
413
414
        ierr = nf90_put_var(file_id, var_param_cov, param_cov)
415
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
416
        ierr = nf90_put_var(file_id, var_param_data, param_data)
IF (ierr /= nf90_noerr) CALL handle_err(ierr)
417
418
419
420
422
        ierr = nf90_close(file_id)
423
        IF (ierr /= nf90_noerr) CALL handle_err(ierr)
424
425
        print *, "Success in writing file: ", filename
426
```

References handle_err().

Here is the call graph for this function:



11.18.2.5 xy_grid()

Writes the xyz coordinates used in the calculation of either the wavefunction or electron density to a text file names xyz.txt.

This only produces a equally spaced square grid of points in the x-y plane, with the z coordinate being set to zero. These coordinates are used for the 2D contour plot in the resulting output plot.

Parameters

in	box_size	box_size is the user defined parameter which defines the size of the domain in each axis.	
in	points	points is the user defined	

Definition at line 185 of file netcdf file.f90.

```
185
186 INTEGER, PARAMETER :: dp=kind(1.0d0)
```

```
REAL(dp), INTENT(IN) :: box_size
INTEGER, INTENT(IN) :: points
188
190
           ! Loop variables INTEGER :: i, j
191
192
           ! Resulting position values in x-y axis REAL(dp) :: a, b ! a is x, b is y
193
194
195
           INTEGER, PARAMETER :: file_no=3
196
197
           ! Opens an empty text file
           OPEN (unit=file_no, file="xyz.txt", action="write")
198
          DO i = -points, points
DO j = -points, points
199
200
                ! Scales the positions to be between -box_size and +box_size
a = (real(i) / (abs(points) + abs(points)))*box_size
b = (real(j) / (abs(points) + abs(points)))*box_size
201
202
203
                ! Writes the coordinates to file, the z coordinate is set to zero as only using this for 2D \,
204
         contour plot which requires x and y coordinates to change. write (file_no, *) a,b,0
205
206
              END DO
207
          END DO
208
           ! Closes the file after writing
209
           CLOSE (file_no)
210
           print*, 'Success in writing: xyz.txt'
```

Referenced by main_driver().

Here is the caller graph for this function:



Chapter 12

Data Type Documentation

12.1 biased_optim::bi_op_init Interface Reference

Public Member Functions

- subroutine bi_op_init_constant_mean (param_init_data, energy_init_data, n_data_in, n_dof_in, ker_var, ker_lengthscale, constant_mean_prior, optim_rate_para, optim_no_samples, n_threads, n_loops_to_do)
- subroutine bi_op_init_arb_mean (param_init_data, energy_init_data, n_data_in, n_dof_in, ker_var, ker_ condition lengthscale, mean_prior_func, mean_prior_dx, optim_rate_para, optim_no_samples, n_threads, n_loops_condition to_do)

12.1.1 Detailed Description

Definition at line 17 of file Biased_Optim.f90.

12.1.2 Member Function/Subroutine Documentation

12.1.2.1 bi_op_init_arb_mean()

Definition at line 134 of file Biased_Optim.f90.

```
implicit none
135
              integer, intent(inout) :: n_loops_to_do
136
              \verb|integer|, intent(in) :: n_data_in, n_dof_in, optim_no_samples, n_threads|\\
             real(dp), dimension(n_data_in, n_dof_in), intent(in) :: param_init_data
real(dp), dimension(n_data_in), intent(in) :: energy_init_data
real(dp), intent(in) :: ker_var, ker_lengthscale, optim_rate_para
137
138
139
              procedure(mean_func_interface) :: mean_prior_func
140
141
             procedure(mean_func_interface_dx) :: mean_prior_dx
142
             n_dof = n_dof_in
gamma = optim_rate_para
143
144
             no_samples=optim_no_samples
145
146
147
              call gp_init(mean_prior_func, mean_prior_dx, ker_var, ker_lengthscale, param_init_data,
         energy_init_data,&
               n_data_in, n_dof_in, n_threads)
148
              gp_uptodate = .false.
149
150
              current_best_e = minval(energy_init_data)
```

12.1.2.2 bi_op_init_constant_mean()

Definition at line 84 of file Biased_Optim.f90.

```
implicit none
85
            integer, intent(inout) :: n_loops_to_do
            integer, intent(in) :: n_data_in, n_dof_in, optim_no_samples,n_threads
86
            real(dp), dimension(n_data_in, n_dof_in), intent(in) :: param_init_data real(dp), dimension(n_data_in), intent(in) :: energy_init_data
88
89
            real(dp), intent(in) :: ker_var, ker_lengthscale, constant_mean_prior, optim_rate_para
            integer gp_n_data, gp_n_dof, n_cycles
real(dp) :: kernel_var, kernal_inv_length
real(dp), dimension(:,:), allocatable :: param_data
90
91
            real(dp), dimension(:), allocatable :: E_data
            real(dp), dimension(:,:), allocatable :: param_pres, param_cov
95
            real(dp), dimension(:), allocatable :: data_mean
96
            if (find restart file()) then
                call read_restart_file_sizes(gp_n_data, gp_n_dof)
98
                allocate(param_data(gp_n_data, gp_n_dof))
100
                 allocate(e_data(gp_n_data))
101
                 allocate(param_pres(gp_n_data, gp_n_data))
102
                 allocate(param_cov(gp_n_data, gp_n_data))
103
                 \verb|allocate(data_mean(gp_n_data)||\\
104
                 call read_restart_file_data(n_cycles, no_samples, current_best_e,&
105
                 constant_mean_value, kernel_var, gamma, kernal_inv_length,&
                 gp_n_data, e_data, gp_n_data, data_mean, gp_n_data, gp_n_data, param_pres, &
106
107
                 gp_n_data, gp_n_data, param_pres, gp_n_data, gp_n_dof, param_data)
108
                 n\_dof = gp\_n\_dof
109
                 call gp_restart(gp_n_data, gp_n_dof,kernel_var, kernal_inv_length,&
110
111
                 param_data, e_data, param_pres, param_cov, data_mean, constant_mean, &
                  zero_func, n_threads)
112
                 gp_uptodate = .false.
114
                 current_best_e = minval(e_data)
115
                 n_loops_to_do=n_loops_to_do-(n_cycles-1)
             else
116
117
                 constant_mean_value = constant_mean_prior
118
                 gamma = optim_rate_para
```

The documentation for this interface was generated from the following file:

· Biased Optim.f90

12.2 gp_surrogate::cov_kernal_dx_1_interface Interface Reference

Public Member Functions

• real(dp) function cov_kernal_dx_1_interface (x_1, x_2, dim)

12.2.1 Detailed Description

Definition at line 57 of file GP_surrogate.f90.

12.2.2 Constructor & Destructor Documentation

12.2.2.1 cov_kernal_dx_1_interface()

Definition at line 58 of file GP_surrogate.f90.

```
use shared_constants
implicit none
integer, intent(in) :: dim
real(dp), dimension(:), intent(in) :: x_1 !param space point
real(dp), dimension(:), intent(in) :: x_2 !param space point
real(dp) :: out
```

The documentation for this interface was generated from the following file:

• GP_surrogate.f90

12.3 gp_surrogate::cov_kernal_interface Interface Reference

Public Member Functions

real(dp) function cov_kernal_interface (x_1, x_2)

12.3.1 Detailed Description

Definition at line 46 of file GP surrogate.f90.

12.3.2 Constructor & Destructor Documentation

12.3.2.1 cov_kernal_interface()

```
real(dp) function gp_surrogate::cov_kernal_interface::cov_kernal_interface (
              real(dp), dimension(:), intent(in) x_1,
              real(dp), dimension(:), intent(in) x_2)
Definition at line 47 of file GP_surrogate.f90.
              use shared constants
              implicit none
              real(dp), dimension(:), intent(in) :: x_1 !param space point
              real(dp), dimension(:), intent(in) :: x_2 !param space point
```

The documentation for this interface was generated from the following file:

• GP_surrogate.f90

gp_surrogate::cov_kernal_xx_dx_interface Interface Reference

Public Member Functions

real(dp) function cov_kernal_xx_dx_interface (x, dim)

12.4.1 Detailed Description

Definition at line 68 of file GP_surrogate.f90.

real(dp) :: out

12.4.2 Constructor & Destructor Documentation

12.4.2.1 cov_kernal_xx_dx_interface()

```
real(dp) function gp_surrogate::cov_kernal_xx_dx_interface::cov_kernal_xx_dx_interface (
             real(dp), dimension(:), intent(in) x,
             integer, intent(in) dim )
Definition at line 69 of file GP_surrogate.f90.
```

```
use shared_constants
70
               implicit none
               integer, intent(in) :: dim
72
               real(dp), dimension(:), intent(in) :: x !param space point
               real(dp) :: out
```

The documentation for this interface was generated from the following file:

GP_surrogate.f90

12.5 gp_surrogate::gp_init Interface Reference

general initialisation function, see gp init gausscov

Public Member Functions

- subroutine gp_init_arbcov (mean_prior, cov_prior, param_data_in, E_data_in, n_data_in, n_dof_in) do not use, don't have a function for the dervatives of the kernal/mean
- subroutine gp_init_gausscov (mean_prior, mean_prior_dx, ker_var, ker_length, param_data_in, E_data_in, n_data_in, n_dof_in, n_threads_in)

intialises with a gaussian covariance

12.5.1 Detailed Description

general initialisation function, see gp_init_gausscov

Definition at line 86 of file GP surrogate.f90.

12.5.2 Member Function/Subroutine Documentation

12.5.2.1 gp init arbcov()

do not use, don't have a function for the dervatives of the kernal/mean

Definition at line 194 of file GP_surrogate.f90.

```
implicit none
195
             procedure (mean_func_interface) :: mean_prior
196
            procedure(cov_kernal_interface) :: cov_prior
197
             integer, intent(in) :: n_data_in, n_dof_in
198
             real(dp), dimension(n_data_in,n_dof_in), intent(in) :: param_data_in
199
             real(dp), dimension(n_data_in), intent(in) :: E_data_in
200
             !work and ipiv are needed for lapack call, have no useful info
201
            integer :: i,j
202
            !setting priors
mu_prior => mean_prior
203
204
205
            k_prior => cov_prior
206
207
            !setting data
            n_data = n_data_in
n_dof = n_dof_in
208
209
210
            allocate(param_data(n_data,n_dof))
            allocate(e_data(n_data))
212
            e_data = e_data_in
213
            param_data = param_data_in
214
215
            allocate(param_cov(n_data,n_data))
```

```
217
            allocate (param_pres (n_data, n_data))
218
219
            !finds covarience for new data
220
            do i=1,n_data
221
                do j=1,i
                     !is symmteric, this reduces calls
222
223
                    param_cov(i,j) = k_prior(param_data(i,:), param_data(j,:))
224
                    param_cov(j,i) = param_cov(i,j)
225
                end do
226
            end do
227
           !compute inverse of cov (precsion)
228
229
           param_pres = param_cov
230
           call svd_inverse(param_pres, n_data)
231
232
            allocate(data_mean(n_data))
233
            !updating the prior mean list
           do i=1, n_data
234
235
                data_mean(i) = mu_prior(param_data(i,:))
236
237
238
            init = .true.
239
```

12.5.2.2 gp_init_gausscov()

intialises with a gaussian covariance

Definition at line 133 of file GP_surrogate.f90.

```
implicit none
133
134
            procedure (mean_func_interface) :: mean_prior
135
            procedure(mean_func_interface_dx) :: mean_prior_dx
136
            integer, intent(in) :: n_data_in, n_dof_in,n_threads_in
137
            real(dp), intent(in) :: ker_var, ker_length
            real(dp), dimension(n_data_in,n_dof_in), intent(in) :: param_data_in
real(dp), dimension(n_data_in), intent(in) :: E_data_in
integer :: i, j
138
139
140
141
142
            n_threads=n_threads_in
143
            !setting prior parameters
144
145
            kernel_var = ker_var
146
            kernal_inv_length = 1.0_dp/ker_length
147
            !setting priors
148
            mu_prior => mean_prior
            k_prior => gaussian_kernel
149
150
            !derivatives of priors, needed for SGA step later
151
152
            mu_prior_dx => mean_prior_dx
153
            k_prior_dx_1_i => gaussian_kernel_dx_1_i
            154
155
       support is expanded) code to get the \ensuremath{\text{0}}
156
157
            !setting data
158
            n_data = n_data_in
159
            n\_dof = n\_dof\_in
160
            allocate(param_data(n_data,n_dof))
161
            allocate(e_data(n_data))
            e_data = e_data_in
162
163
            param_data = param_data_in
164
```

```
165
            allocate(param_cov(n_data,n_data))
167
            allocate(param_pres(n_data, n_data))
168
169
           !finds covarience for new data
170
           do i=1.n data
               do j=1,i
171
172
                    !is symmteric, this reduces calls
173
                    param_cov(i,j) = k_prior(param_data(i,:), param_data(j,:))
                    param_cov(j,i) = param_cov(i,j)
174
                end do
175
176
           end do
178
           !compute inverse of cov (precsion)
179
           param_pres = param_cov
180
           call svd_inverse(param_pres, n_data)
181
182
           allocate(data_mean(n_data))
           !updating the prior mean list
183
           do i=1,n_data
185
               data_mean(i) = mu_prior(param_data(i,:))
186
           end do
187
           init = .true.
188
189
```

The documentation for this interface was generated from the following file:

· GP surrogate.f90

12.6 gp_surrogate::gp_k_post Interface Reference

function for postieror covairance kernal use in format x_1, x_2, x1_dim, x2_dim for $cov(x_1,x_2)$ use in format x, x_dim for cov(x,x)

Public Member Functions

- real(dp) function, dimension(x1_dim, x2_dim) gp_k_post_diff_x (x1, x2, x1_dim, x2_dim)
 specific function for cov(x_1,x_2), see gp_k_post
- real(dp) function, dimension(x_dim, x_dim) gp_k_post_same_x (x, x_dim)
 specific function for cov(x,x), see gp_k_post

12.6.1 Detailed Description

function for postieror covairance kernal use in format x_1, x_2, x1_dim, x2_dim for $cov(x_1,x_2)$ use in format x, x_dim for cov(x,x)

Definition at line 81 of file GP_surrogate.f90.

12.6.2 Member Function/Subroutine Documentation

12.6.2.1 gp_k_post_diff_x()

specific function for cov(x_1,x_2), see gp_k_post

Definition at line 356 of file GP surrogate.f90.

```
implicit none
357
             integer, intent(in) :: x1_dim, x2_dim
358
             real(dp), dimension(x1_dim, n_dof), intent(in) :: x1 !param space point
             real(dp), dimension(x2_dim,n_dof), intent(in) :: x2 !param space point
real(dp), dimension(x1_dim,x2_dim) :: out, x1_cov_x2
359
360
361
             real(dp), dimension(n_data,x2_dim) :: data_cov_x2
362
             real(dp), dimension(x1_dim,n_data) :: x1_cov_data
363
             integer :: i,j
364
             if (.not. init) then
365
                 print*,'not intialised'
366
367
                 stop
368
369
370
             do i=1, x2_dim
371
                 do j=1,n_data
372
                      data_cov_x2(j,i) = k_prior(x2(i,:), param_data(j,:))
373
                 end do
374
             end do
375
376
             do i=1, x1_dim
377
                 do j=1,n_data
                      x1\_cov\_data(i,j) = k\_prior(param\_data(j,:),x1(i,:))
378
379
                 end do
380
             end do
381
382
             do i=1, x1_dim
383
                 do j=1, x2\_dim
                     x1_{cov}x2(i,j) = k_{prior}(x1(i,:), x2(j,:))
384
                 end do
385
386
             end do
388
            out = x1_cov_x2 + matmul(matmul(x1_cov_data,param_pres),data_cov_x2)
389
```

12.6.2.2 gp_k_post_same_x()

```
real(dp) function, dimension(x_dim,x_dim) gp_surrogate::gp_k_post::gp_k_post_same_x ( real(dp), dimension(x_dim,n_dof), intent(in) x, integer, intent(in) x_dim )
```

specific function for cov(x,x), see gp_k_post

Definition at line 322 of file GP_surrogate.f90.

```
322
              implicit none
323
              integer, intent(in) :: x_dim
             real(dp), dimension(x_dim,n_dof), intent(in) :: x !param space point real(dp), dimension(x_dim,x_dim) :: out, x_cov_x
324
325
326
              real(dp), dimension(x_dim,n_data) :: x_cov_data
327
              real(dp), dimension(n_data, x_dim) :: data_cov_x
             integer :: i,j
328
329
330
              if (.not. init) then
331
                  print*,'not intialised'
332
                  stop
333
             end if
334
335
             do i=1.x dim
336
                  do j=1,n_data
337
                       data_{cov_x(j,i)} = k_{prior(param_data(j,:), x(i,:))}
```

```
end do
            end do
340
341
            x_cov_data = transpose(data_cov_x)
342
            do i=1,x_dim
343
                 do j=1,i
                     !is symmteric, this reduces calls
x_cov_x(i,j) = k_prior(x(i,:), x(j,:))
345
346
                      x_{cov_x(j,i)} = x_{cov_x(i,j)}
347
            end do
348
349
350
            out = x_cov_x + matmul(matmul(x_cov_data,param_pres),data_cov_x)
```

The documentation for this interface was generated from the following file:

GP_surrogate.f90

12.7 mcmc::log_rho_interface Interface Reference

Public Member Functions

• real(dp) function log_rho_interface (x, dof)

12.7.1 Detailed Description

Definition at line 17 of file MCMC.f90.

12.7.2 Constructor & Destructor Documentation

12.7.2.1 log_rho_interface()

Definition at line 18 of file MCMC.f90.

```
18 !log target dist
19    use shared_constants
20    real(dp), dimension(:), intent(in) :: x
21    real(dp), dimension(:), intent(in) :: dof
22    real(dp) :: out
```

References shared_constants::pi.

The documentation for this interface was generated from the following file:

• MCMC.f90

12.8 gp surrogate::mean func interface Interface Reference

Public Member Functions

real(dp) function mean_func_interface (x)

12.8.1 Detailed Description

Definition at line 26 of file GP surrogate.f90.

12.8.2 Constructor & Destructor Documentation

12.8.2.1 mean_func_interface()

```
real(dp) function gp_surrogate::mean_func_interface::mean_func_interface ( real(dp), dimension(:), intent(in) x)
```

Definition at line 27 of file GP_surrogate.f90.

```
use shared_constants
implicit none
real(dp), dimension(:), intent(in) :: x !param space point
real(dp) :: out
```

The documentation for this interface was generated from the following file:

· GP_surrogate.f90

12.9 gp_surrogate::mean_func_interface_dx Interface Reference

Public Member Functions

real(dp) function mean_func_interface_dx (x, dim)

12.9.1 Detailed Description

Definition at line 35 of file GP_surrogate.f90.

12.9.2 Constructor & Destructor Documentation

12.9.2.1 mean_func_interface_dx()

Definition at line 36 of file GP_surrogate.f90.

The documentation for this interface was generated from the following file:

• GP_surrogate.f90

12.10 basis_functions::wave_function_interface Interface Reference

Public Member Functions

• real(dp) function wave_function_interface (position, dof_coefficients)

12.10.1 Detailed Description

Definition at line 25 of file basis_functions.f90.

12.10.2 Constructor & Destructor Documentation

12.10.2.1 wave function interface()

Definition at line 26 of file basis_functions.f90.

```
use shared_constants
real(dp), dimension(:), intent(in) :: position
real(dp), dimension(:), intent(in) :: dof_coefficients
real(dp) :: wave_function_interface
```

The documentation for this interface was generated from the following file:

· basis_functions.f90

Chapter 13

File Documentation

13.1 acknow.txt File Reference

13.2 basis_functions.f90 File Reference

Functions that define the Hamiltonian that specifies the problem and the basis set being used.

Data Types

• interface basis_functions::wave_function_interface

Modules

· module basis functions

Wavefunction, hamiltonian and basis set choice.

Functions/Subroutines

subroutine basis_functions::initialise_basis (n_electrons_in, n_basis_functions_per_atom_in, n_atoms_in, atom_coords_in, n_Jastrow_in, fd_length_in, Jastrow_b_length_in, Jastrow_d_length_in, proton_numbers
 __in, basis_type_in)

Initialisation routine.

· subroutine basis functions::deinitialise basis

Dinitialisation routine.

real(dp) function basis_functions::wave_function_slater_1s (position, dof_coefficients)

Single Electron wavefunction: slater 1s basis.

• real(dp) function basis_functions::reduced_hamiltonian_slater_1s (position, dof_coefficients)

Single Electron Reduced Hamiltonian: slater 1s basis.

• real(dp) function basis_functions::discrete_laplacian_reduced (position, h, dofs)

Finite Difference Reduced Laplacian Computes finite difference approximation to the reduced laplacian \$(\nabla^2\psi)\/psi\$.

• real(dp) function basis_functions::wave_function_2_electrons (position, dof_coefficients)

Wavefunction for 2 electrons.

- real(dp) function basis_functions::reduced_hamiltonian_2_electrons (position, dof_coefficients)

 Reduced Hamiltonian for 2 electrons.
- subroutine basis_functions::mno_allocate (n_terms)

Allocate parameters for Jastrow factor.

real(dp) function basis_functions::log_density (position, dof_coefficients)

Log of the Probability Density.

- real(dp) function basis_functions::wave_function_sto3g (position, dof_coefficients)

 Single Electron wavefunction: gaussian sto3g basis.
- real(dp) function basis_functions::reduced_hamiltonian_sto3g (position, dof_coefficients)

Single Electron Reduced Hamiltonian: gaussian sto3g basis.

Variables

- procedure(wave_function_interface), pointer basis_functions::wave_function
- · procedure(wave function interface), pointer basis functions::reduced hamiltonian
- logical, protected basis_functions::initialised = .false.
- integer, protected basis functions::n electrons
- integer, protected basis_functions::n_basis_functions_per_atom
- integer, protected basis_functions::n_atoms
- real(dp), dimension(:,:), allocatable, protected basis_functions::atom_coords
- integer, protected basis functions::n jastrow dofs
- real(dp), protected basis functions::fd h
- real(dp), protected basis_functions::b_length
- real(dp), protected basis_functions::d_length
- real(dp), dimension(:), allocatable, protected basis_functions::proton_numbers
- integer, protected basis_functions::basis_type
- integer, protected basis functions::number dofs
- integer, protected basis_functions::n_space_dims
- real(dp), dimension(:,:), allocatable, protected basis_functions::dof_bounds
- integer, protected basis_functions::n_dofs_per_atom
- · integer, protected basis functions::n dofs no jastrow
- integer, dimension(:,:), allocatable, protected basis functions::mno parameters
- procedure(wave function interface), pointer basis functions::wave function single

13.2.1 Detailed Description

Functions that define the Hamiltonian that specifies the problem and the basis set being used.

13.3 bias_opt.txt File Reference

13.4 Biased Optim.f90 File Reference

Biased optimization subroutines and functions.

Data Types

· interface biased optim::bi op init

Modules

• module biased_optim

Biased optimization subroutines and functions.

Functions/Subroutines

- logical function biased_optim::find_restart_file ()
- subroutine biased_optim::bi_op_init_constant_mean (param_init_data, energy_init_data, n_data_in, n_dof
 __in, ker_var, ker_lengthscale, constant_mean_prior, optim_rate_para, optim_no_samples, n_threads, n_
 loops_to_do)
- subroutine biased_optim::bi_op_init_arb_mean (param_init_data, energy_init_data, n_data_in, n_dof_in, ker_var, ker_lengthscale, mean_prior_func, mean_prior_dx, optim_rate_para, optim_no_samples, n_threads, n_loops_to_do)
- real(dp) function, dimension(threads, n_dof) biased_optim::bi_op_step (param_update_data, energy_

 update_data, n_new_data, threads, seed, n_cycles)

Variables

• logical biased optim::gp uptodate = .False.

13.4.1 Detailed Description

Biased optimization subroutines and functions.

13.5 Biased_Optim_example_driver.f90 File Reference

Driver for testng the biased optimization routines.

Modules

· module log_rho_mod

Driver for testng the biased optimization routines.

Functions/Subroutines

- real(dp) function log_rho_mod::log_rho (x, dof)
- program main

13.5.1 Detailed Description

Driver for testng the biased optimization routines.

13.5.2 Function/Subroutine Documentation

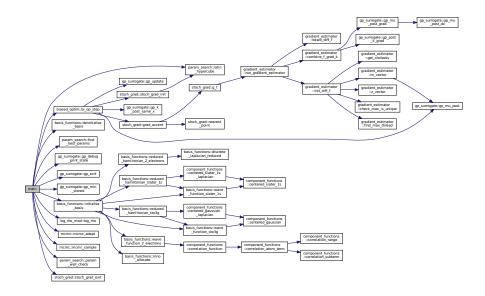
13.5.2.1 main()

program main

Definition at line 23 of file Biased Optim example driver.f90.

References param_search::best_params, param_search::best_trial, biased_optim::bi_op_step(), basis_functions ::deinitialise_basis(), basis_functions::dof_bounds, shared_constants::dp, shared_constants::electronvolt, param = __search::find_best_params(), __gp_surrogate::gp_debug_print_state(), __gp_surrogate::gp_exit(), __gp_surrogate = __:gp_min_stored(), __basis_functions::initialise_basis(), __param_search::latin_hypercube(), __log_rho_mod::log_rho(), __mcmc::mcmc_adapt(), __mcmc::mcmc_sample(), __basis_functions::number_dofs, __param_search::param_wall_ = __check(), __basis_functions::reduced_hamiltonian, and stoch_grad::stoch_grad_exit().

Here is the call graph for this function:



13.6 bond_driver.f90 File Reference

Driver for running multiple simulations to optimise bond length.

Functions/Subroutines

· program bond length driver

Driver for running multiple simulations to optimise bondlength.

13.6.1 Detailed Description

Driver for running multiple simulations to optimise bond length.

13.7 calc.f90 File Reference 159

13.6.2 Function/Subroutine Documentation

13.6.2.1 bond_length_driver()

program bond_length_driver

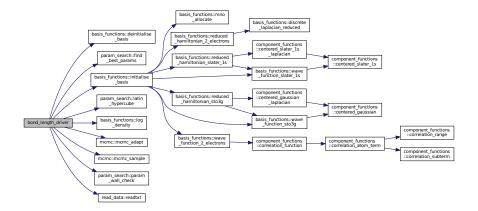
Driver for running multiple simulations to optimise bondlength.

This code computes the ground state energy and corresponding trial wavefunction for a given atom and electron configuration. It saves the resulting wavefunction or electron density in netcdf.

Definition at line 7 of file bond_driver.f90.

References param_search::best_trial, basis_functions::deinitialise_basis(), basis_functions::dof_bounds, shared constants::dp, param_search::find_best_params(), basis_functions::initialise_basis(), param_search::latin_chappercube(), basis_functions::log_density(), mcmc::mcmc_adapt(), mcmc::mcmc_sample(), basis_functions::nchappercube(), basis_functions::number_dofs, param_search::param_wall_check(), read_data::readtxt(), basis_chappercube(), basis_functions::nchappercube(), basis_functions::nchapper

Here is the call graph for this function:



13.7 calc.f90 File Reference

Function completing calculations of either the wavefunction or electron density (depending on the system) at a set of coordinates [x,y,0] on a grid of equally spaced points on a xy grid.

Modules

· module calculations

Function completing calculations of either the wavefunction or electron density (depending on the system) at a set of coordinates [x,y,0] on a grid of equally spaced points on a xy grid.

Functions/Subroutines

• real(dp) function, dimension(:), allocatable calculations::calc (dof, points, box, n_ele, n_MCMC_steps) calc function returns the wavefunction or electron density evaluated on a 2D xy plane (taking a slice) depending on the number of electrons in the system.

13.7.1 Detailed Description

Function completing calculations of either the wavefunction or electron density (depending on the system) at a set of coordinates [x,y,0] on a grid of equally spaced points on a xy grid.

13.8 component_functions.f90 File Reference

Basic subfunctions used throughout the simulation.

Modules

· module component_functions

Basic subfunctions This module contains basic functions used in basis_functions.f90.

Functions/Subroutines

- real(dp) function component_functions::centered_gaussian (position, alpha)
 - Gaussian distribution centred at the origin.
- real(dp) function component functions::centered gaussian laplacian (position, alpha)
 - Analytic Laplacian of Gaussian distribution centred at the origin.
- real(dp) function component_functions::centered_slater_1s (position, zeta)
 - Slater-1s distribution centred at the origin.
- real(dp) function component functions::centered slater 1s laplacian (position, zeta)
 - Analytic Laplacian of Slater-1s distribution centred at the origin.
- real(dp) function component_functions::correlation_range (r, d)
 - Functions that construct the Jastrow interaction function Notation here follows Schmidt and Moskowitz 1990, refered to as SM90.
- real(dp) function component_functions::correlation_subterm (r_12, r_l1, r_l2, m, n, o)
 - Jastrow subfuction: basic subterm Subterm of the correlation function, one for each Jastrow dof per atom This is the term in the k sum in Schmidt and Moskowitz 1990.
- real(dp) function component_functions::correlation_atom_term (atom_coord, electron_coords, mno_←
 parameters, c, b, d)
 - Jastrow subfuction: atom subterm Correlation term for each atom.
- real(dp) function component_functions::correlation_function (atom_coords, electron_coords, mno_←
 parameters, c, b, d)

Jastrow correlation fuction Function F from Schmidt and Moskowitz 1990.

13.8.1 Detailed Description

Basic subfunctions used throughout the simulation.

13.9 constants.f90 File Reference

Fortran shared constants definitions.

Modules

· module shared_constants

Definitions of shared constants used throughout the software.

Variables

- integer, parameter shared constants::dp = real64
- real(dp), parameter shared_constants::pi = 3.141592653589793238_dp
- real(dp), parameter shared_constants::electronvolt = 27.211386245988_dp
- integer, parameter shared_constants::slater_1s_code = 100
- integer, parameter shared_constants::sto_3g_code = 200

13.9.1 Detailed Description

Fortran shared constants definitions.

13.10 ed_test.f90 File Reference

Driver for testing electron density function.

Functions/Subroutines

· program main_driver

Driver for testing electron density function.

13.10.1 Detailed Description

Driver for testing electron density function.

13.10.2 Function/Subroutine Documentation

13.10.2.1 main_driver()

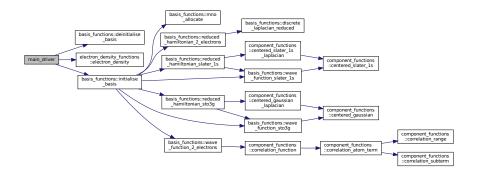
program main_driver

Driver for testing electron density function.

Definition at line 3 of file ed_test.f90.

References basis_functions::deinitialise_basis(), electron_density_functions::electron_density(), and basis_ \leftarrow functions::initialise_basis().

Here is the call graph for this function:



13.11 electron_density.f90 File Reference

Electron density function.

Modules

module electron_density_functions
 Electron density function.

Functions/Subroutines

- real(dp) function electron_density_functions::electron_density (fixed_position, integral_bounds, dof_← coefficients, n_MC_points, seed_in)
 - Computes electron density for 2 electron simulations Uses basic Monte Carlo Integration.
- real(dp) function electron_density_functions::wave_function_normalisation (integral_bounds, dof_

 coefficients, n_MC_points, seed_in)

Computes the integral of the wavefunction squared To normalise the wavefunction for outputing Uses basic Monte Carlo Integration.

13.11.1 Detailed Description

Electron density function.

13.12 energy plotting.py File Reference

Script to output the energy against the bond length.

Namespaces

· energy_plotting

Script outputs the energy against the bond length.

Variables

- energy_plotting.data = np.loadtxt('energies.txt')
 Loading in the data from the energies.txt.
- energy_plotting.bond_length = data[:,0]
- energy_plotting.energy = data[:,1]

13.12.1 Detailed Description

Script to output the energy against the bond length.

13.13 files.txt File Reference

13.14 GP surrogate.f90 File Reference

Gaussian process surrogate subroutines and functions.

Data Types

- interface gp_surrogate::mean_func_interface
- interface gp_surrogate::mean_func_interface_dx
- interface gp_surrogate::cov_kernal_interface
- interface gp_surrogate::cov_kernal_dx_1_interface
- interface gp_surrogate::cov_kernal_xx_dx_interface
- interface gp_surrogate::gp_k_post

function for postieror covairance kernal use in format x_1 , x_2 , x_1 dim, x_2 dim for $cov(x_1,x_2)$ use in format x, x_2 dim for cov(x,x)

• interface gp_surrogate::gp_init

general initialisation function, see gp_init_gausscov

Modules

• module gp_surrogate

Gaussian process surrogate submodules and functions.

Functions/Subroutines

subroutine gp_surrogate::gp_init_gausscov (mean_prior, mean_prior_dx, ker_var, ker_length, param_data
 —in, E_data_in, n_data_in, n_dof_in, n_threads_in)

intialises with a gaussian covariance

subroutine gp_surrogate::gp_init_arbcov (mean_prior, cov_prior, param_data_in, E_data_in, n_data_in, n← dof in)

do not use, don't have a function for the dervatives of the kernal/mean

- real(dp) function, dimension(x_dim) gp_surrogate::gp_mu_post (x, x_dim)
 posterior mean
- real(dp) function gp_surrogate::gp_mu_post_dx (x, dim)

derivative of the posterior mean, wrt dimension dim

• real(dp) function, dimension(x_dim, n_dof) gp_surrogate::gp_mu_post_grad (x, x_dim, only)

derivative of the posterior mean, needed for stoch_grad

real(dp) function, dimension(x_dim, x_dim) gp_surrogate::gp_k_post_same_x (x, x_dim)

specific function for cov(x,x), see gp_k_post

real(dp) function, dimension(x1_dim, x2_dim) gp_surrogate::gp_k_post_diff_x (x1, x2, x1_dim, x2_dim)
 specific function for cov(x_1,x_2), see gp_k_post

subroutine gp_surrogate::gp_post_k_grad (X, x_dim, out)

grad of the posterior covariance, evaluated at X of size x_dim,n_dof, needed for stoch_grad

 $\bullet \ \ subroutine \ gp_surrogate::gp_update \ (param_data_in_top, \ E_data_in_top, \ n_top, \ Algo_choice)$

update routine for adding data to gp

subroutine gp_surrogate::gp_debug_print_state ()

prints all scalar stae variables, size of all array state variables, and min and max stored energy

• subroutine gp_surrogate::gp_exit ()

deallocates state variables

• subroutine gp_surrogate::gp_min_stored (min_params, min_E)

for finding minimum of the energy and associated parameter space point, from stored data

• subroutine gp_surrogate::gp_return_size_data (n_data_out, n_dof_out)

returns the integers that control the size of the state variables

• subroutine gp_surrogate::gp_return_state_data (kernel_var_out, kernal_inv_length_out, param_data_out, E_data_out, param_pres_out, param_cov_out, data_mean_out)

for acessing a copy of the state variables, they are returned to the intent(out) parameter with the corresponding name

subroutine gp_surrogate::gp_restart (n_data_in, n_dof_in, kernel_var_in, kernal_inv_length_in, param_
 data_in, E_data_in, param_pres_in, param_cov_in, data_mean_in, mean_prior, mean_prior_dx, n_threads
 _in)

sets a state from inputed data, intended for use with restart files.

Variables

procedure(mean_func_interface_dx), pointer gp_surrogate::mu_prior_dx => null()

13.14.1 Detailed Description

Gaussian process surrogate subroutines and functions.

13.15 GP_surrogate_test_driver.f90 File Reference

Driver for testing the Gaussian process surrogate.

Functions/Subroutines

· program main

Driver for testing the Gaussain process surrogate.

13.15.1 Detailed Description

Driver for testing the Gaussian process surrogate.

13.15.2 Function/Subroutine Documentation

13.15.2.1 main()

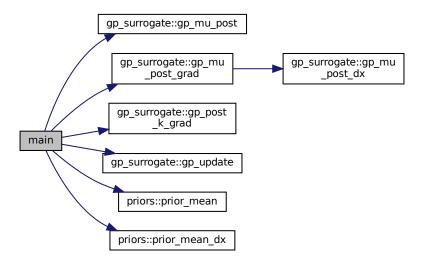
program main

Driver for testing the Gaussain process surrogate.

Definition at line 3 of file GP_surrogate_test_driver.f90.

References gp_surrogate::gp_mu_post(), gp_surrogate::gp_mu_post_grad(), gp_surrogate::gp_post_k_grad(), gp_surrogate::gp_update(), priors::prior_mean(), and priors::prior_mean_dx().

Here is the call graph for this function:



13.16 gradient_estimator.f90 File Reference

Subroutines for obtaining a gradient estimation through Cholesky decomposition.

Modules

module gradient_estimator

Subroutines for obtaining a gradient estimation through Cholesky decomposition.

Functions/Subroutines

- subroutine gradient_estimator::get_cholesky (cholesky_decomp, matrix_in)
 - performs Cholesky decomposition without destroying the old array.
- real(dp) function, dimension(:), allocatable gradient estimator::m vector (x, previous best)
 - builds the "m_vector" as described in: arXiv:1602.05149v4 [stat.ML] 5 May 2019 contains the difference between the mean and best result in a vector.
- real(dp) function, dimension(:), allocatable gradient_estimator::z_vector (z_in)
 - build the "z_vector" as described in: arXiv:1602.05149v4 [stat.ML] 5 May 2019
- integer function, dimension(1) gradient_estimator::find_max_thread (m_vec, z_vec, c_mat)
 - finds the location in the vector that corresponds to the maximum of "m + CZ"
- subroutine gradient estimator::check max is unique (m vec, z vec, c mat, find max thread)
 - check if the maximum found in the find_max_thread is a unique value.
- subroutine gradient_estimator::init_diff_f (x, z_in, previous_best)
 - initialises the workspace F and Cholesky decomposition of the covariance matrix.
- subroutine gradient_estimator::bkwd_diff_f ()
 - performs the backward difference differentiation on the workspace F
- subroutine gradient_estimator::combine_f_grad_k (x, n_params)
 - combines the gradient contributions from the workspace F and those associated with the m_vector and covariance matrix.
- real(dp) function, dimension(:,:), allocatable gradient_estimator::run_gradient_estimator (x, z_in, n_params, previous_best)

runs the gradient estimator associated routines from one block.

Variables

- real(dp), dimension(:,:), allocatable gradient_estimator::f_ij
- real(dp), dimension(:,:), allocatable gradient_estimator::l_ij
- real(dp), dimension(:,:), allocatable gradient_estimator::gradient_matrix
- real(dp) gradient estimator::check max

13.16.1 Detailed Description

Subroutines for obtaining a gradient estimation through Cholesky decomposition.

13.17 init params.py File Reference

Python code to obtain user input through GUI or command line.

Namespaces

· init params

Python functions and scripts to obtain user input import sympy as sym.

Functions

def init_params.get_input (parameter='parameter')

Function to get a numerical value/parameter through command line.

def init_params.new_param (window, tk_text, tk_entry, tk_input, row, dval='1', text='param', font=font, fs=fontsize)

Function for creating a row of user entry within the GUI.

Variables

- string init params.title = 'User Input'
- string init_params.bg_color = 'white'
- string init_params.fg_color = 'grey'
- string init params.bg button = 'grey'

note: Mac OS may not support changing button color

- string init_params.fg_button = 'black'
- string init params.font = 'Times New Roman'
- int init params.fontsize = 18
- int init params.length = 1000
- int init params.height = 1000
- init_params.window = tk.Tk()
- · init_params.background
- string init params.txt0
- init params.text0 = tk.Label(window,text=txt0,font=(font,fontsize),wraplength=length-5)

Initializing/Configuring the top row text.

- · init params.row
- init_params.column
- init_params.columnspan
- · init params.sticky
- list init_params.params
- list init_params.def_values = [1,1,1.5,40,1000000,0,10,100,1,10,12345,1,7,0.01,1.0,1.0,5.0,20]
- list init_params.floats = [2, 13, 14, 15, 16]
- list init_params.integers = [0, 1, 3, 4, 5, 6, 7,8, 9, 10, 11, 12, 17]
- init_params.N_params = len(params)
- string init_params.txt1 = "The user must provide the following inputs: "
- $\bullet \ \ init_params.text1 = tk. Label (window, text=txt1, font=(font, fontsize), wraplength=length-10)$
- · init_params.dval
- · init params.text
- string init params.txt2 = "Biased Optimizer Options (not enabled by default):"
- init params.text2 = tk.Label(window,text=txt2,font=(font,fontsize),wraplength=length-10)
- · init params.pady
- string init_params.txt2_1 = "Enable the biased optimizer?"

Create a radio button for user to choose between two options.

- init_params.text2_1 = tk.Label(window,text=txt2_1,font=(font,fontsize),wraplength=length-10)
- init params.bopt = tk.IntVar()
- · init params.variable
- · init params.value
- init_params.indicatoron
- · init_params.padx
- init_params.entry5 = bopt
- int init_params.i = 6
- string init_params.txt3 = "Optional user inputs (default options are shown):"
- init_params.text3 = tk.Label(window,text=txt3,font=(font,fontsize),wraplength=length-10)

- init_params.basis = tk.IntVar()
- init_params.entry7 = basis
- string init_params.txt4 = "Visualization options:"
- init_params.text4 = tk.Label(window,text=txt4,font=(font,fontsize),wraplength=length-10)
- init_params.close
- · init params.relx
- · init_params.rely
- · init_params.anchor
- int init_params.p1 = 1

Checks to see if user input is proper and sets everything to either an integer or float.

- int init_params.p2 = 0
- string init_params.filename = 'init_params.txt'
- init_params.file = open(filename,'w')

13.17.1 Detailed Description

Python code to obtain user input through GUI or command line.

13.18 init_params.txt File Reference

13.19 latin_driver.f90 File Reference

Simulation driver for latin hypercube sampling.

Functions/Subroutines

program main_driver

Main driver for simulation using the latin_hypercube search.

13.19.1 Detailed Description

Simulation driver for latin hypercube sampling.

13.19.2 Function/Subroutine Documentation

13.19.2.1 main_driver()

program main_driver

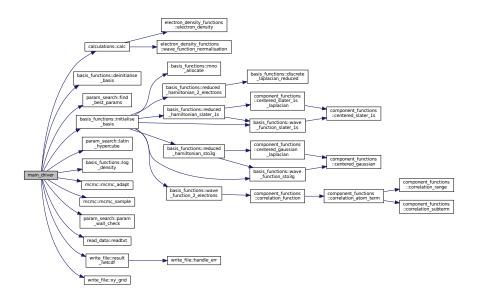
Main driver for simulation using the latin_hypercube search.

This code computes the ground state energy and corresponding trial wavefunction for a given atom and electron configuration. It saves the resulting wavefunction or electron density in netcdf.

Definition at line 7 of file latin_driver.f90.

References param_search::best_params, param_search::best_trial, calculations::calc(), basis_functions ::deinitialise_basis(), basis_functions::dof_bounds, shared_constants::dp, shared_constants::electronvolt, param = _search::find_best_params(), basis_functions::initialise_basis(), param_search::latin_hypercube(), basis_= functions::log_density(), mcmc::mcmc_adapt(), mcmc::mcmc_sample(), basis_functions::n_space_dims, basis = _functions::number_dofs, param_search::param_wall_check(), read_data::readtxt(), basis_functions::reduced_ = _hamiltonian, write_file::result_netcdf(), shared_constants::slater_1s_code, and write_file::xy_grid().

Here is the call graph for this function:



13.20 main driver.f90 File Reference

Main driver script for simulation.

Functions/Subroutines

program main_driver
 Main driver for simulation.

13.20.1 Detailed Description

Main driver script for simulation.

13.20.2 Function/Subroutine Documentation

13.20.2.1 main_driver()

program main_driver

Main driver for simulation.

More description to be added

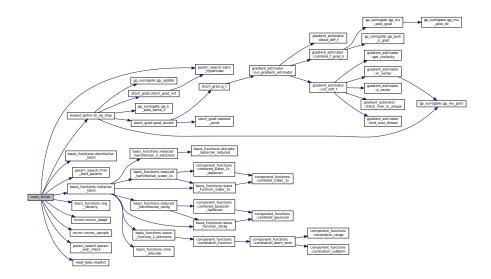
Parameters

n_electrons⇔	Number of electrons
_in	

Definition at line 6 of file main_driver.f90.

References param_search::best_params, param_search::best_trial, biased_optim::bi_op_step(), basis_functions:::deinitialise_basis(), basis_functions::dof_bounds, param_search::find_best_params(), basis_functions::initialise --_basis(), param_search::latin_hypercube(), basis_functions::log_density(), mcmc::mcmc_adapt(), mcmc::mcmc__sample(), basis_functions::n_space_dims, basis_functions::number_dofs, param_search::param_wall_check(), read_data::readtxt(), and basis_functions::reduced_hamiltonian.

Here is the call graph for this function:



13.21 mainpage.txt File Reference

13.22 MCMC.f90 File Reference

Functions and subroutines for implementing Markov chain Monte Carlo.

Data Types

· interface mcmc::log rho interface

Modules

· module mcmc

Functions and subroutines for implementing Markov chain Monte Carlo.

Functions/Subroutines

• subroutine mcmc::mcmc_sample (samples, log_rho, x_0, n_steps, n_burned, thinning_interval, s, e_code, dof_coefficients, density_dimension, average_accept, seed)

The main routine for MCMC, generates (n_steps-n_burned)/thinning_interval samples from a distribution rho.

subroutine mcmc::mcmc_adapt (s_out, log_rho, x_0, n_steps, s_0, e_code, s_max, s_min, memory, adapt
 _interval, dof_coefficients, density_dimension, seed)

Runs a version of mcmc_sample but every adapt_interval steps adjusts s, based on an exponetial average of the acceptance rate.

13.22.1 Detailed Description

Functions and subroutines for implementing Markov chain Monte Carlo.

13.23 netcdf_file.f90 File Reference

Fortran subroutines for writing results to file.

Modules

• module write_file

Contains all the subroutines related to writing results to file.

Functions/Subroutines

subroutine write_file::result_netcdf (dof, ele, num_ele, num_nuc)

Main results writing to NetCDF file.

• subroutine write_file::energies_netcdf (energies, bondlen)

Output results for bond lengths and corresponding energy used for plotting.

• subroutine write_file::xy_grid (points, box_size)

Writes the xyz coordinates used in the calculation of either the wavefunction or electron density to a text file names xyz.txt.

• subroutine write_file::write_restart_file (gp_n_data, gp_n_dof, n_cycles, no_samples, current_best_E, constant_mean_value, gamma, kernel_var, kernal_inv_length, E_data, data_mean, param_pres, param_cov, param_data)

Creates a NetCDF file which contains information needed for the restart of the Bi Op step function.

subroutine write_file::handle_err (ierr)

Handles the NetCDF errors and print statements.

13.23.1 Detailed Description

Fortran subroutines for writing results to file.

13.24 param search.f90 File Reference

Functions/subroutines associated with building/initialisation the parameter search space and finding the best parameters from a given MCMC run.

Modules

· module param search

Functions/subroutines associated with building/initialisation the parameter search space and finding the best parameters from a given MCMC run.

Functions/Subroutines

- subroutine param_search::random_search_grid (trials, param_bounds, n_trials, seed_in)
 random_search_grid returns MxN grid of test points for M free parameters and N trials distributed
- subroutine param_search::latin_hypercube (trials, param_bounds, n_trials, seed_in)

latin_hypercube returns MxN grid of test points for M free parameters and N trials on a latin hypercube for given bounds.

- subroutine param_search::find_best_params (trial_energies, trials)
 - find_best_params returns the 1D array that contain the current best set of parameters found from a MCMC run.
- subroutine param_search::param_wall_check (param_bounds)

param_wall_check evaluates if the best parameter set is close to the parameter bounds used to generate the test points.

Variables

- real(dp), dimension(:), allocatable, protected param_search::best_params
- integer, dimension(1), protected param_search::best_trial

13.24.1 Detailed Description

Functions/subroutines associated with building/initialisation the parameter search space and finding the best parameters from a given MCMC run.

13.25 plotting.py File Reference

Python plotting scripts which output the contour plots for the wave function or electron probability density.

Namespaces

plotting

Main plotting script which outputs the contour plots for the wavefunction or electron probability density.

Variables

• plotting.coords = np.loadtxt('xyz.txt')

Uploading the xy plane coordinates from the xyz.txt file generated from the xy_grid subroutine in netcdf_file.f90.

• plotting.data = nc.Dataset('results.nc4', mode='r', format='NETCDF4')

Uploading the main results NetCDF file named results.nc4 generated from the result_netcdf routine.

• plotting.num_ele = data.variables['Num_of_Electrons'][:]

Prints a statement if it has been uploaded successfully.

- plotting.num_nuc = data.variables['Num_of_Nuclei'][:]
- plotting.x = coords[:,0]

Extracts the x and y coordinates from the xyz.txt.

- plotting.y = coords[:,1]
- plotting.wavefunction = data.variables['Electron Density'][:]

This does the contour plot for the 1 electron case.

- plotting.dof = data.variables['Optimal_DOF'][:]
- plotting.ele_den = data.variables['Electron_Density'][:]

Creates the contour plot of the wavefunction squared.

13.25.1 Detailed Description

Python plotting scripts which output the contour plots for the wave function or electron probability density.

13.26 priors.f90 File Reference

Functions for obtaining the prior mean and its derivative.

Modules

· module priors

Functions for obtaining the prior mean and its derivative.

Functions/Subroutines

real(dp) function priors::prior_mean (x)

Gives the prior mean.

real(dp) function priors::prior_mean_dx (x, dim)

Derivative of the prior mean.

13.26.1 Detailed Description

Functions for obtaining the prior mean and its derivative.

13.27 read data.f90 File Reference

Subroutines to read files of user input into fortran.

Modules

· module read_data

Subroutines to read files and transfer user inputs into fortran.

Functions/Subroutines

subroutine read_data::readtxt (filename, n_electrons_in, n_atoms_in, bond_length, n_trials, n_MCMC
 _steps, n_omp_threads, use_biased_optimiser, n_optimiser_steps, basis_type_in, proton_number_int_in,
 search_seed, n_basis_functions_per_atom_in, n_Jastrow_in, fd_length_in, Jastrow_b_length_in, Jastrow
 _d_length_in, plot_distance, plot_points)

Read in data from a text file.

13.27.1 Detailed Description

Subroutines to read files of user input into fortran.

13.28 stoch_grad.f90 File Reference

Modules for optimization.

Modules

· module stoch_grad

Optimization modules.

Functions/Subroutines

- subroutine stoch_grad::stoch_grad_init (N, best_from_last_run_in, seed)
 Initalises module variables and sets up starts points for the restarts of the gradient assent.
- subroutine stoch_grad::stoch_grad_exit ()

deallocates state variables

• subroutine stoch_grad::grad_accent (X_0, sequence_length, no_samples, gamma, out)

Performs the gradient assent for sequence length X_0 is the intial point to start the assent at sequence_length is how long the sequence to average over is No_samlples is the number of samples taken in the gradient estimator, gamma is parameter to tune for how much to move the next point long the estimated gradient out is the output and used to compute the sum on the go.

- real(dp) function, dimension(x_shape(1), x_shape(2)) stoch_grad::g_t (X, no_samples, X_shape)
 - Return an estimate for the gradient which is an average over no_samples.
- real(dp) function, dimension(:,:), allocatable stoch_grad::nearest_point (bounds, X)

Returns a new point back to the search space if it leaves.

Variables

- integer stoch_grad::n_restarts
- real(dp), dimension(:,:,:), allocatable stoch_grad::n_points

13.28.1 Detailed Description

Modules for optimization.

13.29 tutorial.txt File Reference

13.30 vmc.txt File Reference