

relax

Version respository checkout



A program for NMR relaxation  
data analysis

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# Abbreviations

**AIC** Akaike's Information Criteria

**AICc** small sample size corrected AIC

**BIC** Bayesian Information Criteria

$C(\tau)$  correlation function

$\chi^2$  chi-squared function

**CSA** chemical shift anisotropy

$\mathfrak{D}$  the set of diffusion tensor parameters

$\mathfrak{D}_{\parallel}$  the eigenvalue of the spheroid diffusion tensor corresponding to the unique axis of the tensor

$\mathfrak{D}_{\perp}$  the eigenvalue of the spheroid diffusion tensor corresponding to the two axes perpendicular to the unique axis

$\mathfrak{D}_a$  the anisotropic component of the Brownian rotational diffusion tensor

$\mathfrak{D}_{iso}$  the isotropic component of the Brownian rotational diffusion tensor

$\mathfrak{D}_r$  the rhombic component of the Brownian rotational diffusion tensor

$\mathfrak{D}_{ratio}$  the ratio of  $\mathfrak{D}_{\parallel}$  to  $\mathfrak{D}_{\perp}$

$\mathfrak{D}_x$  the eigenvalue of the Brownian rotational diffusion tensor in which the corresponding eigenvector defines the x-axis of the tensor

$\mathfrak{D}_y$  the eigenvalue of the Brownian rotational diffusion tensor in which the corresponding eigenvector defines the y-axis of the tensor

$\mathfrak{D}_z$  the eigenvalue of the Brownian rotational diffusion tensor in which the corresponding eigenvector defines the z-axis of the tensor

$\epsilon_i$  elimination value

$J(\omega)$  spectral density function

**NOE** nuclear Overhauser effect

**pdf** probability distribution function

$r$  bond length

$\mathbf{R}_1$  spin-lattice relaxation rate

$\mathbf{R}_2$  spin-spin relaxation rate

$R_{ex}$  chemical exchange relaxation rate

$S^2$ ,  $S_f^2$ , **and**  $S_s^2$  model-free generalised order parameters

$\tau_e$ ,  $\tau_f$ , **and**  $\tau_s$  model-free effective internal correlation times

$\tau_m$  global rotational correlation time

# Chapter 1

## Installation instructions

### 1.1 Dependencies

The following packages need to be installed before using relax:

**Python:** Version 2.2 or higher .

**Numeric:** Version 21 or higher .

**ScientificPython:** Version 2.2 or higher .

**Optik:** Version 1.4 or higher. This is only needed if running python 2.2 .

Older versions of these packages may work, use them at your own risk.

### 1.2 Installation

#### 1.2.1 Linux precompiled distribution

To install the program relax on a GNU/Linux system, download the precompiled distribution labelled `relax-x.x.x.Linux.i386.tar.bz2`. This tar file has had the C code precompiled into shared objects files `*.so` which are loaded directly into relax. Hence compilation is not necessary. Untar and decompress the file using the command

```
$ tar jxvf relax-x.x.x.Linux.i386.tar.bz2
```

Then in the base directory `relax`, switch user to root and type the command

```
$ make install
```

This will create a directory in `/usr/local/` called `relax`, copy all the untarred files into this directory, create a symbolic link in `/usr/local/bin` to the file `/usr/local/relax/relax`, and then finally run relax to create the byte-compiled Python `*.pyc` files to speed up the start time of relax.

To change the installation path, modify the file `Makefile` and change the variable `INSTALL_PATH` to point to the desired location.

### 1.2.2 Source distribution

The source distribution should be named **relax-x.x.x.src.tar.bz2**. The make utility and a C compiler are required for compilation of the C code into shared objects which are loaded as modules into relax. To build these modules, type

```
$ make
```

Then to install the program, type

```
$ make install
```

The default installation path is currently **/usr/local/**. To change this, edit the **Makefile** and modify the variable **INSTALL\_PATH**.

### 1.2.3 Running a non-compiled version

Compilation of the C code is not essential for running relax, however, certain features of the program will be disabled. One example is relaxation curve fitting. This approach may be necessary for systems, such as MS Windows, where C compilers are not readily available (although the cygwin environment may provide the tools required for compilation).

To run relax without compilation, install the dependencies detailed above, download the source distribution which should be named **relax-x.x.x.src.tar.bz2**, extract the files, and then run the file called **relax** in the base directory.

## 1.3 Optional programs

The following is a list of programs which can be used by relax, although they are not essential for normal use.

### 1.3.1 Grace

Grace is a program for plotting two dimensional data sets in a professional looking manner. It is used to visualise parameter values. It can be downloaded from <http://plasma-gate.weizmann.ac.il/Grace/>.

### 1.3.2 OpenDX

Version 4.1.3 or compatible. OpenDX is used for viewing the output of the space mapping function, and is executed by passing the command **dx** to the command line with various options. The program is designed for visualising multidimensional data and can be found at <http://www.opendx.org/>.

### 1.3.3 Molmol

Molmol is used for viewing the PDB structures loaded into the program and to display parameter values mapped onto the structure.

### 1.3.4 Dasha

Dasha is a program used for model-free analysis of NMR relaxation data. It can be used as an optimisation engine to replace the minimisation algorithms implemented within relax.

### 1.3.5 Modelfree4

Art Palmer's Modelfree4 program is also designed for model-free analysis and can be used as an optimisation engine to replace relax's high precision minimisation algorithms.



# Chapter 2

## How to use relax

### 2.1 The prompt

The primary interface of relax is the prompt. After typing ‘`relax`’ within a terminal, you will be presented with

```
relax>
```

This is the Python prompt which has been tailored specifically for relax. You will hence have full access, if necessary, to the power of the Python programming language to manipulate your data. You can for instance type

```
relax> print "Hello World"
```

the result being

```
relax> print "Hello World"
Hello World
relax>
```

Or, using relax as a calculator

```
relax> (1.0 + (2 * 3))/10
0.69999999999999996
relax>
```

### 2.2 Python

relax has been designed such that knowledge about Python is not required to be able to fully use the program. A few basics, though, will aid in understanding relax.

A number of simple programming axioms includes that of strings , integers , floating point numbers , and lists . A string is text and within Python (as well as relax) this is delimited by either single or double quotes. An integer is a number with no decimal point while

a float is a number with a decimal point. A list in Python (called an array in other languages) is a list of anything separated by commas and delimited by square brackets, an example is `[0, 1, 2, 'a', 1.2143235]`.

Probably the most important detail is that functions in Python require brackets around their arguments. For example

```
relax> minimise()
```

will commence minimisation however

```
relax> minimise
```

will do nothing.

The arguments to a function are simply a comma separated list within the brackets of the function. For example to save the program's current state, type

```
relax> state.save('save', force=1)
```

Two types of arguments exist in Python, standard arguments and keyword arguments. The majority of arguments you will encounter within relax are keyword arguments however you may, in rare cases, encounter a non-keyword argument. For these standard arguments, just type the values in, although they must be in the correct order. Keyword arguments consist of two parts, the key and the value. For example the key may be `file` while the value you would like to supply is `'R1.out'`. Various methods exist for supplying this argument. Firstly you could simply type `'R1.out'` into the correct position in the argument list. Secondly you can type `file='R1.out'`. The power of this second option is that argument order is unimportant. Therefore if you would like to change the default value of the very last argument, you don't have to supply values for all other arguments. The only catch is that standard arguments must come before the keyword arguments.

## 2.3 User functions

For standard data analysis, a large number of specially tailored functions called 'user functions' have been implemented. These are accessible from the relax prompt by simply typing the name of the function. An example is `'help()'`. An alphabetical listing of all accessible user functions together with full descriptions is presented later within this manual.

A few special objects which are available within the prompt are not actually functions. These objects do not require brackets at their end for them to function. For example to exit relax type

```
relax> exit
```

Another special object is that of the function class `.`. This object is simply a container which holds a number of user functions. You can access the user function within the class by typing the name of the class, then a dot `'.'`, followed by the name of the user function. An example is the user function for reading relaxation data out of a file and loading the data into relax. The function is called `'read'` while the class is called `'relax_data'`. To execute the function, type something like



```
relax> relax_data.read(name, 'R1', '600', 600.0 * 1e6, 'r1.600.out')
```

The relax prompt, on first usage, can be quite daunting. Two features exist, however, to increase the usability of the prompt – the help system and tab completion

## 2.4 The help system

For assistance in using a function, simply type

```
help(function)
```

In addition to functions, if

```
help(object)
```

is typed, the help for the python object is returned. This system is similar to the help function built into the python interpreter, which has been renamed to `help_python`, with the interactive component removed. For the interactive python help system, type

```
help_python()
```

## 2.5 Tab completion

Tab completion is implemented to prevent insanity as the function names can be quite long – a deliberate feature to improve usability. The behaviour of the tab completion is very similar to that of the bash prompt.

Not only is tab completion useful for preventing RSI, but it can also be used for finding out what functions are available. To begin with if you hit the [TAB] key without typing any text, all available functions will be listed (along with function classes and other python objects). This extends to the exploration of user functions within a function class. For example, to list the user functions within the function class `'model_free'`, type

```
relax> model_free.
```

The dot character at the end is essential. After hitting the [TAB] key, you should see something like

```
relax> model_free.
model_free.__class__
model_free.__doc__
model_free.__init__
model_free.__module__
model_free.__relax__
model_free.__relax_help__
model_free.copy
model_free.create_model
model_free.delete
model_free.remove_tm
model_free.select_model
```

```
relax> model_free.
```

All the objects beginning with an underscore are “hidden”, they contain information about the function class and should be ignored. From the listing the user functions ‘copy’, ‘create\_model’, ‘delete’, ‘remove\_tm’, and ‘select\_model’ contained within ‘model\_free’ are all visible.

## 2.6 The ‘run’

Within relax, the majority of operations are assigned to a special construct called a ‘run’. For example, to load relaxation data into the program it must be committed to a pre-created ‘run’. Within one instance of relax, multiple runs can be created and various operations performed in sequence on these runs. This is useful for operations such as model selection whereby the function ‘model\_selection’ can operate on a number of runs corresponding to different models and then assign the results to a newly created run.

The flow of data through relax can be thought of as travelling through pipes – each pipe is synonymous with a run. User functions exist to transfer data between these pipes, while other functions combine data from multiple pipes into one or vice-versa. The simplest invocation of relax would be the creation of a single run and with the data being processed as it is passing through this pipe.

The primary method for creating a run is through the user function ‘run.create’. For example

```
relax> run.create('m1', 'mf')
```

will create a run called ‘m1’. The run is also associated with a type which, in this case, is model-free analysis. The following is a table of all the types which can be assigned to a run.

Run type	Description
‘jw’	Reduced spectral density mapping
‘mf’	Model-free data analysis
‘noe’	Steady state NOE calculation
‘relax_fit’	Relaxation curve fitting
‘srls’	SRLS analysis

Currently only the NOE calculation, model-free analysis, and reduced spectral density mapping features of relax are implemented (if this documentation is out of date, then you may be able to do a lot more).

## 2.7 Scripting

What ever is done within the prompt is also accessible through scripting. Just type your commands into a text file and then at the terminal type

```
$ relax your_script
```

An example of a simple script which will minimise the model-free model ‘m4’ after loading six relaxation data sets is

```
# Create the run.
name = 'm4'
run.create(name, 'mf')

# Nuclei type
nuclei('N')

# Load the sequence.
sequence.read(name, 'noe.500.out')

# Load the relaxation data.
relax_data.read(name, 'R1', '600', 600.0 * 1e6, 'r1.600.out')
relax_data.read(name, 'R2', '600', 600.0 * 1e6, 'r2.600.out')
relax_data.read(name, 'NOE', '600', 600.0 * 1e6, 'noe.600.out')
relax_data.read(name, 'R1', '500', 500.0 * 1e6, 'r1.500.out')
relax_data.read(name, 'R2', '500', 500.0 * 1e6, 'r2.500.out')
relax_data.read(name, 'NOE', '500', 500.0 * 1e6, 'noe.500.out')

# Setup other values.
diffusion_tensor.set(name, (2e-8, 1.3, 60, 290), param_types=1, axial_type='prolate',
fixed=1)
value.set(name, 1.02 * 1e-10, 'bond_length')
value.set(name, -160 * 1e-6, 'csa')

# Select a preset model-free model.
model_free.select_model(run=name, model=name)

# Grid search.
grid_search(name, inc=11)

# Minimise.
minimise('newton', run=name)

# Finish.
results.write(run=name, file='results', force=1)
state.save('save', force=1)
```

Scripting is much more powerful than the prompt as advanced Python programming can be employed (see the file ‘full\_analysis.py’ in the ‘sample\_scripts’ directory for an example).

## 2.8 Sample scripts

A few sample scripts have been provided in the directory ‘sample\_scripts’. These can be used as a good starting point for using relax.

## 2.9 The GUI

relax has been designed primarily for scripting and, as such, no graphical user interface (GUI) currently exists. The internal structure of the program has been specifically designed so any type of control mechanism can be easily added, including a GUI, therefore in the future one may be written. A GUI will, however, detract from the power and flexibility inherent in the control by scripting.

## 2.10 Access to the internals of relax

For highly advanced Python scripting or control of relax, almost every part of relax has been designed in an object oriented fashion. If you would like to play with internals of the program, the entirety of relax is accessible within the object called ‘`self.relax`’. To access the raw objects within relax which contain the program data, all data is stored within the object called ‘`self.relax.data`’.

## 2.11 Usage of the name relax

The program relax is so relaxed that the first letter should always be in lower case!

# Chapter 3

## Data analysis

### 3.1 Introduction

This chapter aims to explain not only the steps involved in the data analysis of relaxation data but also how to use the program relax to achieve this. Although a work in progress, it covers how to calculate the NOE, how to optimise and find the  $R_1$  and  $R_2$  relaxation rates, and how to implement model-free analysis.

### 3.2 Calculating the NOE

The calculation of NOE values is a straight forward and quick procedure which involves two components, the calculation of the value itself and the calculation of the errors. To understand the steps involved, we will follow in detail the execution of a sample NOE calculation script.

#### The sample script

```
# Script for calculating NOEs.

# Create the run
name = 'noe'
run.create(name, 'noe')

# Load the sequence from a PDB file.
pdb(name, 'Ap4Aase_new_3.pdb', load_seq=1)

# Load the reference spectrum and saturated spectrum peak intensities.
noe.read(name, file='ref.list', spectrum_type='ref')
noe.read(name, file='sat.list', spectrum_type='sat')

# Set the errors.
noe.error(name, error=3600, spectrum_type='ref')
```

```

noe.error(name, error=3000, spectrum_type='sat')

# Individual residue errors.
noe.error(name, error=122000, spectrum_type='ref', res_num=114)
noe.error(name, error=8500, spectrum_type='sat', res_num=114)

# Unselect unresolved residues.
unselect.read(name, file='unresolved')

# Calculate the NOEs.
calc(name)

# Save the NOEs.
value.write(name, param='noe', file='noe.out', force=1)

# Create grace files.
grace.write(name, y_data_type='ref', file='ref.agr', force=1)
grace.write(name, y_data_type='sat', file='sat.agr', force=1)
grace.write(name, y_data_type='noe', file='noe.agr', force=1)

# View the grace files.
grace.view(file='ref.agr')
grace.view(file='sat.agr')
grace.view(file='noe.agr')

# Write the results.
results.write(name, file='results', dir=None, force=1)

# Save the program state.
state.save('save', force=1)

```

## Initialisation of the run

Firstly to simplify referencing of the run name in the relevant functions, the name 'noe' is assigned to the object `name` by the command

```
name = 'noe'
```

Therefore instead of typing 'noe' each time the run needs to be referenced, `name` can be used instead. The run is created by the command

```
run.create(name, 'noe')
```

This user function will then create a run which is named 'noe', the second argument setting the run type to that of calculating the NOE. Setting the run type is important so that the program knows which user functions are compatible with the run, for example the function `minimise()` is meaningless in this sample script as the NOE values are computed by direct calculation rather than through optimisation.

## Loading the data

The first thing which need to be done prior to any residue specific command is to load the sequence. In this case, the command

```
pdb(name, 'Ap4Aase_new_3.pdb', load_seq=1)
```

will extract the sequence from the PDB file 'Ap4Aase\_new\_3.pdb'. The first argument specifies the run into which the sequence will be loaded, the second specifies the file name, while the third causes the function to extract the sequence rather than just load the PDB into relax. Although the PDB coordinates have been loaded into the program, the structure serves no purpose when calculating NOE values.

The next two commands

```
noe.read(name, file='ref.list', spectrum_type='ref')  
noe.read(name, file='sat.list', spectrum_type='sat')
```

load the peak heights of the reference and saturated NOE experiments (although the volume could be used instead). The keyword argument **format** has not been specified, hence the default format of a Sparky peak list (saved after typing 'lt') is assumed. If the program XEasy was used to analyse the spectra, the argument **format='xeasy'** is necessary. The first column of the file should be the Sparky assignment string, while it is assumed that the 4<sup>th</sup> column contains either the peak height.

## Setting the errors

In this example, the errors where measured from the base plain noise. The Sparky RMSD function was used to estimate the maximal noise levels across the spectrum in regions containing no peaks. For the reference spectrum the RMSD was approximately 3600 while in the saturated spectrum the RMSD was 3000. These errors are set by the commands

```
noe.error(name, error=3600, spectrum_type='ref')  
noe.error(name, error=3000, spectrum_type='sat')
```

For the residue G114, the noise levels are significantly increased compared to the rest of the protein as the peak is located close to the water signal. The higher errors for this residue are specified by the commands

```
noe.error(name, error=122000, spectrum_type='ref', res_num=114)  
noe.error(name, error=8500, spectrum_type='sat', res_num=114)
```

## Unresolved residues

As the peaks of certain residues overlaps to such an extent that the heights of both cannot be resolved, a simple text file was created called **unresolved** in which each line consists of a single residue number. By using the command

```
unselect.read(name, file='unresolved')
```

all residues in the file `unresolved` are excluded from the analysis.

## The NOE

At this point, the NOE can be calculated. The user function

```
calc(name)
```

will calculate both the NOE and the errors. The NOE value will be calculated using the formula

$$NOE = \frac{I_{sat}}{I_{ref}}, \quad (3.1)$$

where  $I_{sat}$  is the intensity of the peak in the saturated spectrum while  $I_{ref}$  is that of the reference spectrum. The error is calculated by

$$\sigma_{NOE} = \sqrt{\frac{(\sigma_{sat} \cdot I_{ref})^2 + (\sigma_{ref} \cdot I_{sat})^2}{I_{ref}^2}}, \quad (3.2)$$

where  $\sigma_{sat}$  and  $\sigma_{ref}$  are the peak intensity errors in the saturated and reference spectra respectively. To create a file of the NOEs, the command

```
value.write(name, param='noe', file='noe.out', force=1)
```

will create a file called `noe.out` with the NOE values and errors. The force flag will cause any file with the same name to be overwritten. An example of the format of `noe.out` is

Num	Name	Value	Error
1	GLY	None	None
2	PRO	None	None
3	LEU	None	None
4	GLY	0.12479588727508535	0.020551827436105764
5	SER	0.42240815792914105	0.02016346825976852
6	MET	0.45281703194372114	0.026272719841642134
7	ASP	0.60727570079478255	0.032369427242382849
8	SER	0.63871921623680161	0.024695665815261791
9	PRO	None	None
10	PRO	None	None
11	GLU	None	None
12	GLY	0.92927160307645906	0.059569089743604184
13	TYR	0.88832516377296256	0.044119641308479306
14	ARG	0.84945042565860407	0.060533543601110441

## Viewing the results

Any two dimensional data set can be plotted in relax in conjunction with the program Grace (<http://plasma-gate.weizmann.ac.il/Grace/>). The program is also known as Xmgrace and was previously known as ACE/gr or Xmgr. The highly flexible relax user function `grace.write` is capable of producing 2D plots of any x-y data sets. The three commands



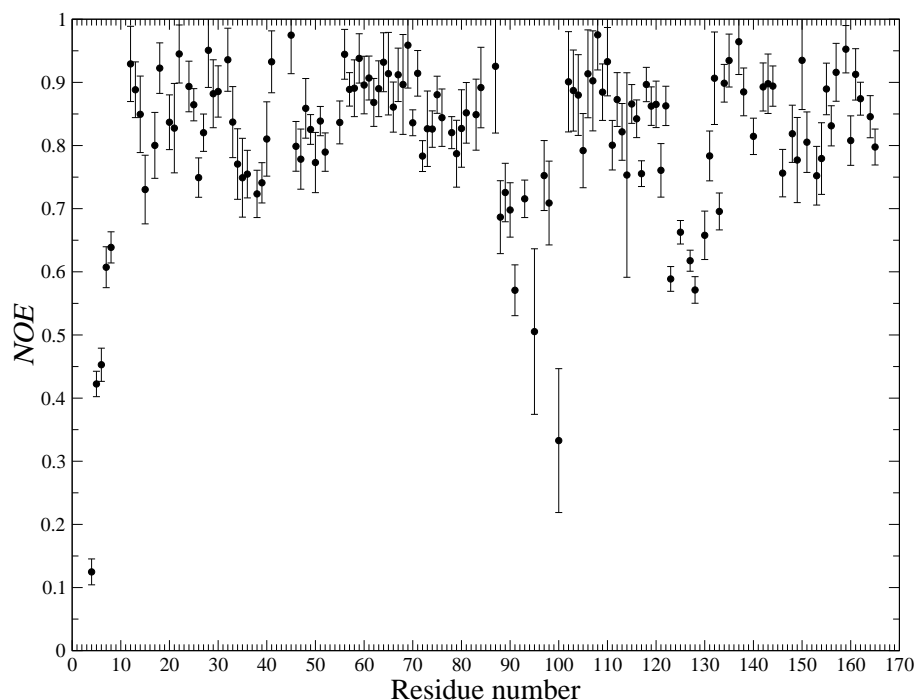


Figure 3.1: A Grace plot of the NOE value and error against the residue number. An example of the output of the user function `grace.write()`.

```
grace.write(name, y_data_type='ref', file='ref.agr', force=1)
grace.write(name, y_data_type='sat', file='sat.agr', force=1)
grace.write(name, y_data_type='noe', file='noe.agr', force=1)
```

create three separate plots of the peak intensity of the reference and saturated spectra as well as the NOE. The x-axis in all three defaults to the residue number. As the x and y-axes can be any parameter, the command

```
grace.write(name, x_data_type='ref', y_data_type='sat', file='ref_vs_sat.agr', force=1)
```

would create a plot of the reference verses the saturated intensity, with one point per residue. Returning to the sample script, three Grace data files are created, `ref.agr`, `sat.agr`, and `noe.agr` and placed in the default directory `./grace`. These can be visualised by opening the file within Grace, however `relax` will do that for you with the commands

```
grace.view(file='ref.agr')
grace.view(file='sat.agr')
grace.view(file='noe.agr')
```

An example of the output, after modifying the axes, is shown in figure 3.1.

### 3.3 The $R_1$ and $R_2$ relaxation rates - relaxation curve fitting

### **3.4 Model-free analysis—textbf**

### 3.5 Reduced spectral density mapping

## Chapter 4

# Values, gradients, and Hessians

### 4.1 Introduction

A word of warning before reading this chapter, the topics covered here are quite advanced and are not necessary for understanding how to either use relax or to implement any of the data analysis techniques present within relax. The material of this chapter is intended as an in-depth explanation of the mathematics involved in the optimisation of the parameters of the model-free models. As such it contains the chi-squared equation, relaxation equations, spectral density functions, and diffusion tensor equations as well as their gradients (first partial derivatives) and Hessians (second partial derivatives).

#### 4.1.1 Chi-squared function – $\chi^2(\theta)$

For the minimisation of models, a chain of calculations using different theories is required. At the highest level, the function which is actually minimised is the chi-squared function

$$\chi^2(\theta) = \sum_{i=1}^n \frac{(R_i - R_i(\theta))^2}{\sigma_i^2}, \quad (4.1)$$

where the index  $i$  is the summation index ranging over all the experimentally collected relaxation data,  $R_i$ , including the  $R_1$ ,  $R_2$ , and NOE data at all field strengths belonging to the set data set  $R$  for an individual residue, a collection of residues, or the entire macromolecule,  $R_i(\theta)$  is the back calculated relaxation data belonging to the set  $R(\theta)$ ,  $\theta$  is the model parameter vector which, when minimised, is denoted by the symbol  $\hat{\theta}$ , and  $\sigma_i$  are the experimental errors.

The significance of equation (4.1) is that the function returns a single value.

#### 4.1.2 Relaxation equations – $R_i(\theta)$

The chi-squared equation is itself dependent on the relaxation equations through the back calculated relaxation data  $R(\theta)$ . These data are the spin-lattice, spin-spin, and cross-

relaxation rates of Abragam (1961) and are respectively

$$R_1(\theta) = d \left( J(\omega_H - \omega_X) + 3J(\omega_X) + 6J(\omega_H + \omega_X) \right) + cJ(\omega_X), \quad (4.2)$$

$$R_2(\theta) = \frac{d}{2} \left( 4J(0) + J(\omega_H - \omega_X) + 3J(\omega_X) + 6J(\omega_H) + 6J(\omega_H + \omega_X) \right) + \frac{c}{6} \left( 4J(0) + 3J(\omega_X) \right) + R_{ex}, \quad (4.3)$$

$$\sigma_{\text{NOE}}(\theta) = d \left( 6J(\omega_H + \omega_X) - J(\omega_H - \omega_X) \right), \quad (4.4)$$

where  $J(\omega)$  is the power spectral density function,  $R_{ex}$  is the relaxation due to chemical exchange, and the dipolar and CSA constants are defined in SI units as

$$d = \frac{1}{4} \left( \frac{\mu_0}{4\pi} \right)^2 \frac{(\gamma_H \gamma_X \hbar)^2}{\langle r^6 \rangle}, \quad (4.5)$$

$$c = \frac{(\omega_H \Delta\sigma)^2}{3}, \quad (4.6)$$

where  $\mu_0$  is the permeability of free space,  $\gamma_H$  and  $\gamma_X$  are the gyromagnetic ratios of the  $H$  and  $X$  spins respectively,  $\hbar$  is Plank's constant divided by  $2\pi$ ,  $r$  is the bond length, and  $\Delta\sigma$  is the chemical shift anisotropy measured in ppm. The cross-relaxation rate  $\sigma_{\text{NOE}}$  is related to the steady state NOE by the equation

$$\text{NOE}(\theta) = 1 + \frac{\gamma_H}{\gamma_X} \frac{\sigma_{\text{NOE}}(\theta)}{R_1(\theta)}. \quad (4.7)$$

#### 4.1.3 Transformed relaxation equations – $R'_i(\theta)$

Letting the relaxation equations,  $R_i(\theta)$  be the  $R_1(\theta)$ ,  $R_2(\theta)$ , and  $\text{NOE}(\theta)$ , an additional layer of abstraction can be used to simplify the calculation of the gradients and Hessians. This involved decomposing the NOE equation into the cross relaxation rate constant  $\sigma_{\text{NOE}}(\theta)$  and the auto relaxation rate  $R_1(\theta)$ . Taking equation (4.7), the relaxation equations are

$$R'_1(\theta) = R_1(\theta) \quad (4.8)$$

$$R'_2(\theta) = R_2(\theta) \quad (4.9)$$

$$\text{NOE}(\theta) = 1 + \frac{\gamma_H}{\gamma_X} \frac{\sigma_{\text{NOE}}(\theta)}{R_1(\theta)}. \quad (4.10)$$

while the transformed relaxation equations are  $\{R'_1(\theta), R'_2(\theta), \sigma_{\text{NOE}}(\theta)\}$ .

#### 4.1.4 Spectral density functions – $J(\omega)$

The relaxation equations are themselves dependent on the calculation of the spectral density values  $J(\omega)$ . Within model-free analysis, these are modelled by the original model-free formula (Lipari and Szabo, 1982a,b)

$$J(\omega) = \frac{2}{5} \sum_{i=-k}^k c_i \cdot \tau_i \left( \frac{S^2}{1 + (\omega\tau_i)^2} + \frac{(1 - S^2)(\tau_e + \tau_i)\tau_e}{(\tau_e + \tau_i)^2 + (\omega\tau_e\tau_i)^2} \right), \quad (4.11)$$

where  $S^2$  is the square of the Lipari and Szabo generalised order parameter and  $\tau_e$  is the effective correlation time. The order parameter reflects the amplitude of the motion while the correlation time is an indication of the time scale of that motion. The theory was extended by Clore et al. (1990) by the modelling of two independent internal motions using the equation

$$J(\omega) = \frac{2}{5} \sum_{i=-k}^k c_i \cdot \tau_i \left( \frac{S^2}{1 + (\omega\tau_i)^2} + \frac{(1 - S_f^2)(\tau_f + \tau_i)\tau_f}{(\tau_f + \tau_i)^2 + (\omega\tau_f\tau_i)^2} + \frac{(S_f^2 - S^2)(\tau_s + \tau_i)\tau_s}{(\tau_s + \tau_i)^2 + (\omega\tau_s\tau_i)^2} \right). \quad (4.12)$$

where  $S_f^2$  and  $\tau_f$  are the amplitude and timescale of the faster of the two motions while  $S_s^2$  and  $\tau_s$  are those of the slower motion.  $S_f^2$  and  $S_s^2$  are related by the formula  $S^2 = S_f^2 \cdot S_s^2$ .

#### 4.1.5 Brownian diffusion

In equations (4.11) and (4.12), the generic Brownian diffusion NMR correlation function presented in ? has been used. This function is

$$C(\tau) = \frac{1}{5} \sum_{i=-k}^k c_i \cdot e^{-\tau/\tau_i}, \quad (4.13)$$

where the summation index  $i$  ranges over the number of exponential terms within the correlation function. This equation is generic in that it describes the diffusion of an ellipsoid, a spheroid, and a sphere.

#### Ellipsoid

For the ellipsoid defined by the parameter set  $\{\mathfrak{D}_{iso}, \mathfrak{D}_a, \mathfrak{D}_r, \alpha, \beta, \gamma\}$  the variable  $k$  is equal to two, therefore the index  $i \in \{-2, -1, 0, 1, 2\}$ . The geometric parameters  $\{\mathfrak{D}_{iso}, \mathfrak{D}_a, \mathfrak{D}_r\}$  are defined as

$$\mathfrak{D}_{iso} = \frac{1}{3}(\mathfrak{D}_x + \mathfrak{D}_y + \mathfrak{D}_z), \quad (4.14a)$$

$$\mathfrak{D}_a = \mathfrak{D}_z - \frac{1}{2}(\mathfrak{D}_x + \mathfrak{D}_y), \quad (4.14b)$$

$$\mathfrak{D}_r = \frac{\mathfrak{D}_y - \mathfrak{D}_x}{2\mathfrak{D}_a}, \quad (4.14c)$$

and are constrained by

$$0 < \mathfrak{D}_{iso} < \infty, \quad (4.15a)$$

$$0 \leq \mathfrak{D}_a < \frac{\mathfrak{D}_{iso}}{\frac{1}{3} + \mathfrak{D}_r} \leq 3\mathfrak{D}_{iso}, \quad (4.15b)$$

$$0 \leq \mathfrak{D}_r \leq 1. \quad (4.15c)$$

The orientational parameters  $\{\alpha, \beta, \gamma\}$  are the Euler angles using the z-y-z rotation notation.

The five weights  $c_i$  are defined as

$$c_{-2} = \frac{1}{4}(d + e), \quad (4.16a)$$

$$c_{-1} = 3\delta_y^2\delta_z^2, \quad (4.16b)$$

$$c_0 = 3\delta_x^2\delta_z^2, \quad (4.16c)$$

$$c_1 = 3\delta_x^2\delta_y^2, \quad (4.16d)$$

$$c_2 = \frac{1}{4}(d - e), \quad (4.16e)$$

where

$$d = 3(\delta_x^4 + \delta_y^4 + \delta_z^4) - 1, \quad (4.17)$$

$$e = -\frac{1}{\Re} \left[ (1 + 3\mathfrak{D}_r)(\delta_x^4 + 2\delta_y^2\delta_z^2) + (1 - 3\mathfrak{D}_r)(\delta_y^4 + 2\delta_x^2\delta_z^2) - 2(\delta_z^4 + 2\delta_x^2\delta_y^2) \right], \quad (4.18)$$

and where

$$\Re = \sqrt{1 + 3\mathfrak{D}_r^2}, \quad (4.19)$$

The five correlation times  $\tau_i$  are

$$1/\tau_{-2} = 6\mathfrak{D}_{iso} - 2\mathfrak{D}_a\Re, \quad (4.20a)$$

$$1/\tau_{-1} = 6\mathfrak{D}_{iso} - \mathfrak{D}_a(1 + 3\mathfrak{D}_r), \quad (4.20b)$$

$$1/\tau_0 = 6\mathfrak{D}_{iso} - \mathfrak{D}_a(1 - 3\mathfrak{D}_r), \quad (4.20c)$$

$$1/\tau_1 = 6\mathfrak{D}_{iso} + 2\mathfrak{D}_a, \quad (4.20d)$$

$$1/\tau_2 = 6\mathfrak{D}_{iso} + 2\mathfrak{D}_a\Re. \quad (4.20e)$$

## Spheroid

The variable  $k$  is equal to one in the case of the spheroid defined by the parameter set  $\{\mathfrak{D}_{iso}, \mathfrak{D}_a, \theta, \phi\}$ , hence  $i \in \{-1, 0, 1\}$ . The geometric parameters  $\{\mathfrak{D}_{iso}, \mathfrak{D}_a\}$  are defined as

$$\mathfrak{D}_{iso} = \frac{1}{3}(\mathfrak{D}_{\parallel} + 2\mathfrak{D}_{\perp}), \quad (4.21a)$$

$$\mathfrak{D}_a = \mathfrak{D}_{\parallel} - \mathfrak{D}_{\perp}. \quad (4.21b)$$

and are constrained by

$$0 < \mathfrak{D}_{iso} < \infty, \quad (4.22a)$$

$$-\frac{3}{2}\mathfrak{D}_{iso} < \mathfrak{D}_a < 3\mathfrak{D}_{iso}, \quad (4.22b)$$

The orientational parameters  $\{\theta, \phi\}$  are the spherical angles defining the orientation of the major axis of the diffusion frame within the lab frame.



The three weights  $c_i$  are

$$c_{-1} = \frac{1}{4}(3\delta_z^2 - 1)^2, \quad (4.23a)$$

$$c_0 = 3\delta_z^2(1 - \delta_z^2), \quad (4.23b)$$

$$c_1 = \frac{3}{4}(\delta_z^2 - 1)^2, \quad (4.23c)$$

The five correlation times  $\tau_i$  are

$$1/\tau_{-1} = 6\mathfrak{D}_{iso} - 2\mathfrak{D}_a, \quad (4.24a)$$

$$1/\tau_0 = 6\mathfrak{D}_{iso} - \mathfrak{D}_a, \quad (4.24b)$$

$$1/\tau_1 = 6\mathfrak{D}_{iso} + 2\mathfrak{D}_a. \quad (4.24c)$$

## Sphere

In the situation of a molecule diffusing as a sphere either described by the single parameter  $\tau_m$  or  $\mathfrak{D}_{iso}$ , the variable  $k$  is equal to zero. Therefore  $i \in \{0\}$ . The single weight  $c_0$  is equal to one, while the single correlation time  $\tau_0$  is equivalent to the global tumbling time  $\tau_m$  given by

$$1/\tau_m = 6\mathfrak{D}_{iso}. \quad (4.25)$$

## 4.2 Minimisation concepts

### 4.2.1 The function value

At the simplest level, all minimisation techniques require at least a function which will supply a single value for different parameter values  $\theta$ . For the modelling of NMR relaxation data, this is given by equation (4.1). For certain algorithms, such a Simplex minimisation, this single value suffices.

### 4.2.2 The gradient

The majority of minimisation algorithms, however, also require the gradient at the point of the given parameter values  $\theta$ . The gradient is a vector of partial derivatives defined as

$$\nabla = \begin{pmatrix} \frac{\partial}{\partial \theta_1} \\ \frac{\partial}{\partial \theta_2} \\ \vdots \\ \frac{\partial}{\partial \theta_n} \end{pmatrix} \quad (4.26)$$

where  $n$  is the total number of parameters in the model.

An example of a powerful algorithm which requires both the value and gradient at given parameter values is BFGS quasi-Newton minimisation.

### 4.2.3 The Hessian

A few algorithms, including the most powerful, require in addition the Hessian at given parameter values  $\theta$ . The Hessian is the matrix of second partial derivatives defined as

$$\nabla^2 = \begin{pmatrix} \frac{\partial^2}{\partial \theta_1^2} & \frac{\partial^2}{\partial \theta_1 \partial \theta_2} & \cdots & \frac{\partial^2}{\partial \theta_1 \partial \theta_n} \\ \frac{\partial^2}{\partial \theta_2 \partial \theta_1} & \frac{\partial^2}{\partial \theta_2^2} & \cdots & \frac{\partial^2}{\partial \theta_2 \partial \theta_n} \\ \vdots & \vdots & \ddots & \vdots \\ \frac{\partial^2}{\partial \theta_n \partial \theta_1} & \frac{\partial^2}{\partial \theta_n \partial \theta_2} & \cdots & \frac{\partial^2}{\partial \theta_n^2} \end{pmatrix} \quad (4.27)$$

The most powerful minimisation algorithm, Newton minimisation, requires the value, gradient, and Hessian at the given parameter values.

## 4.3 Value, gradient, and Hessian dependency chain

The dependency chain outlined in the introduction to this chapter, that the chi-squared function is dependent on the relaxation equations which are dependent on the transformed relaxation equations which themselves are dependent on the spectral density functions, combine with the values, gradients, and Hessians to create a complex web of dependencies. The relationship between all the values, gradients, and Hessians are outlined in Figure 4.1.

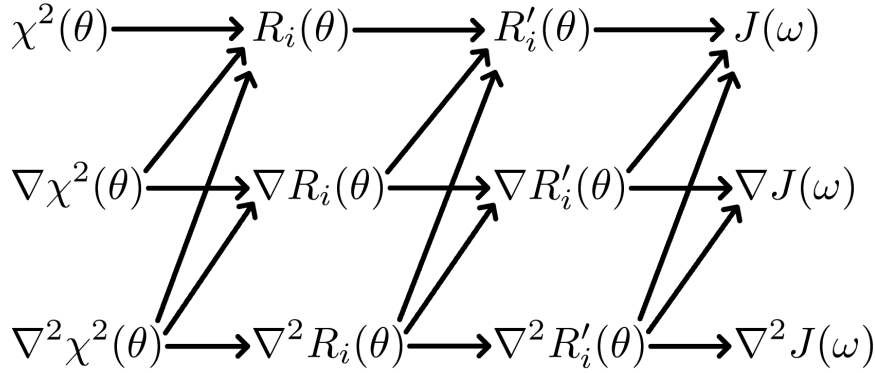


Figure 4.1: Dependencies between the  $\chi^2$ , transformed relaxation, relaxation, and spectral density equations, gradients, and Hessians.

## 4.4 $\chi^2$ values, gradients, and Hessians

### 4.4.1 $\chi^2$ values

The  $\chi^2$  value is

$$\chi^2(\theta) = \sum_{i=1}^n \frac{(R_i - R_i(\theta))^2}{\sigma_i^2}, \quad (4.28)$$

which is the same as equation (4.1) on page 19.

### 4.4.2 $\chi^2$ gradients

The  $\chi^2$  gradient is

$$\nabla \chi^2(\theta) = 2 \sum_{i=1}^n \frac{(R_i - R_i(\theta))^2}{\sigma_i^2} \nabla R_i(\theta). \quad (4.29)$$

### 4.4.3 $\chi^2$ Hessians

The  $\chi^2$  Hessian is

$$\nabla^2 \chi^2(\theta) = 2 \sum_{i=1}^n \frac{1}{\sigma_i^2} (\nabla R_i(\theta) \cdot \nabla R_i(\theta)^T - (R_i - R_i(\theta)) \nabla^2 R_i(\theta)). \quad (4.30)$$

## 4.5 $R_i(\theta)$ values, gradients, and Hessians

### 4.5.1 $R_i(\theta)$ values

The  $R_i(\theta)$  values are given by

$$R_1(\theta) = R'_1(\theta), \quad (4.31)$$

$$R_2(\theta) = R'_2(\theta), \quad (4.32)$$

$$\text{NOE}(\theta) = 1 + \frac{\gamma_H}{\gamma_X} \frac{\sigma_{\text{NOE}}(\theta)}{R_1(\theta)}. \quad (4.33)$$

### 4.5.2 $R_i(\theta)$ gradients

The  $R_i(\theta)$  gradients are

$$\nabla R_1(\theta) = \nabla R'_1(\theta), \quad (4.34)$$

$$\nabla R_2(\theta) = \nabla R'_2(\theta), \quad (4.35)$$

$$\nabla \text{NOE}(\theta) = \frac{\gamma_H}{\gamma_X} \frac{1}{R_1(\theta)^2} \left( R_1(\theta) \nabla \sigma_{\text{NOE}}(\theta) - \sigma_{\text{NOE}}(\theta) \nabla R_1(\theta) \right). \quad (4.36)$$

### 4.5.3 $R_i(\theta)$ Hessians

The  $R_i(\theta)$  Hessians are

$$\nabla^2 R_1(\theta) = \nabla^2 R'_1(\theta), \quad (4.37)$$

$$\nabla^2 R_2(\theta) = \nabla^2 R'_2(\theta), \quad (4.38)$$

$$\begin{aligned} \nabla^2 \text{NOE}(\theta) = \frac{\gamma_H}{\gamma_X} \frac{1}{R_1(\theta)^3} & \left[ \sigma_{\text{NOE}}(\theta) \left( 2 \nabla R_1(\theta) \cdot \nabla R_1(\theta)^T - R_1(\theta) \nabla^2 R_1(\theta) \right) \right. \\ & \left. - R_1(\theta) \left( \nabla \sigma_{\text{NOE}}(\theta) \cdot \nabla R_1(\theta)^T - R_1(\theta) \nabla^2 \sigma_{\text{NOE}}(\theta) \right) \right]. \end{aligned} \quad (4.39)$$

## 4.6 $R'_i(\theta)$ values, gradients, and Hessians

The partial and second partial derivatives of the transformed relaxation equations,  $R'_i(\theta)$ , are different for each parameter of the vector  $\theta$ . The vector representation of the gradient,  $\nabla R'_i(\theta)$ , and the matrix representation of the Hessian,  $\nabla^2 R'_i(\theta)$ , can be reconstructed from the individual elements presented below.

### 4.6.1 Components of the $R'_i(\theta)$ equations

To simplify the calculations of the gradients and Hessians, the  $R'_i(\theta)$  equations have been broken down into their various components. These include the dipolar and CSA constants as well as the dipolar and CSA spectral density terms for each of the three transformed relaxation data types,  $R_1$ ,  $R_2$ , and  $\sigma_{\text{NOE}}$ . The segregation of these components simplifies the maths as many partial derivatives of the components are zero.

#### Dipolar constant

The dipolar constant is defined as

$$d = \frac{1}{4} \left( \frac{\mu_0}{4\pi} \right)^2 \frac{(\gamma_H \gamma_X \hbar)^2}{\langle r^6 \rangle}. \quad (4.40)$$

This component of the relaxation equations is independent of the parameter of the spectral density function,  $\theta_j$ , the chemical exchange parameter,  $\sigma_{ex}$ , and the CSA parameter,  $\Delta\sigma$ . Therefore, the partial and second partial derivatives with respect to these parameters is zero. Only the partial derivative with respect to the bond length,  $r$ , is non-zero, being

$$d' \equiv \frac{dd}{dr} = -\frac{3}{2} \left( \frac{\mu_0}{4\pi} \right)^2 \frac{(\gamma_H \gamma_X \hbar)^2}{\langle r^7 \rangle}. \quad (4.41)$$

The double partial derivative with respect to the bond length twice is

$$d'' \equiv \frac{d^2d}{dr^2} = \frac{21}{2} \left( \frac{\mu_0}{4\pi} \right)^2 \frac{(\gamma_H \gamma_X \hbar)^2}{\langle r^8 \rangle}. \quad (4.42)$$

#### CSA constant

The CSA constant is defined as

$$c = \frac{(\omega_X \cdot \Delta\sigma)^2}{3}. \quad (4.43)$$

The partial derivative of this component with respect to all parameters but the CSA parameter  $\Delta\sigma$  is zero. This partial derivative is

$$c' \equiv \frac{dc}{d\Delta\sigma} = \frac{2\omega_X^2 \cdot \Delta\sigma}{3}. \quad (4.44)$$

The CSA constant double partial derivative with respect to  $\Delta\sigma$  is

$$c'' \equiv \frac{d^2c}{d\Delta\sigma^2} = \frac{2\omega_X^2}{3}. \quad (4.45)$$

**Spectral density terms of the  $R_1$  dipolar component**

For the dipolar component of the  $R_1$  equation, the spectral density terms are

$$J_d^{R_1} = J(\omega_H - \omega_X) + 3J(\omega_X) + 6J(\omega_H + \omega_X). \quad (4.46)$$

The partial derivative of these terms with respect to the parameter of the spectral density function  $\theta_j$  is

$$J_d^{R_1'} \equiv \frac{\partial J_d^{R_1}}{\partial \theta_j} = \frac{\partial J(\omega_H - \omega_X)}{\partial \theta_j} + 3 \frac{\partial J(\omega_X)}{\partial \theta_j} + 6 \frac{\partial J(\omega_H + \omega_X)}{\partial \theta_j}. \quad (4.47)$$

The second partial derivative with respect to the parameter of the spectral density function  $\theta_j$  and  $\theta_k$  is

$$J_d^{R_1''} \equiv \frac{\partial^2 J_d^{R_1}}{\partial \theta_j \cdot \partial \theta_k} = \frac{\partial^2 J(\omega_H - \omega_X)}{\partial \theta_j \cdot \partial \theta_k} + 3 \frac{\partial^2 J(\omega_X)}{\partial \theta_j \cdot \partial \theta_k} + 6 \frac{\partial^2 J(\omega_H + \omega_X)}{\partial \theta_j \cdot \partial \theta_k}. \quad (4.48)$$

**Spectral density terms of the  $R_1$  CSA component**

For the CSA component of the  $R_1$  equation, the spectral density terms are

$$J_c^{R_1} = J(\omega_X). \quad (4.49)$$

The partial derivative of these terms with respect to the parameter of the spectral density function  $\theta_j$  is

$$J_c^{R_1'} \equiv \frac{\partial J_c^{R_1}}{\partial \theta_j} = \frac{\partial J(\omega_X)}{\partial \theta_j}. \quad (4.50)$$

The second partial derivative with respect to the parameter of the spectral density function  $\theta_j$  and  $\theta_k$  is

$$J_c^{R_1''} \equiv \frac{\partial^2 J_c^{R_1}}{\partial \theta_j \cdot \partial \theta_k} = \frac{\partial^2 J(\omega_X)}{\partial \theta_j \cdot \partial \theta_k}. \quad (4.51)$$

**Spectral density terms of the  $R_2$  dipolar component**

For the dipolar component of the  $R_2$  equation, the spectral density terms are

$$J_d^{R_2} = 4J(0) + J(\omega_H - \omega_X) + 3J(\omega_X) + 6J(\omega_H) + 6J(\omega_H + \omega_X). \quad (4.52)$$

The partial derivative of these terms with respect to the parameter of the spectral density function  $\theta_j$  is

$$J_d^{R_2'} \equiv \frac{\partial J_d^{R_2}}{\partial \theta_j} = 4 \frac{\partial J(0)}{\partial \theta_j} + \frac{\partial J(\omega_H - \omega_X)}{\partial \theta_j} + 3 \frac{\partial J(\omega_X)}{\partial \theta_j} + 6 \frac{\partial J(\omega_H)}{\partial \theta_j} + 6 \frac{\partial J(\omega_H + \omega_X)}{\partial \theta_j}. \quad (4.53)$$

The second partial derivative with respect to the parameter of the spectral density function  $\theta_j$  and  $\theta_k$  is

$$J_d^{R_2''} \equiv \frac{\partial^2 J_d^{R_2}}{\partial \theta_j \cdot \partial \theta_k} = 4 \frac{\partial^2 J(0)}{\partial \theta_j \cdot \partial \theta_k} + \frac{\partial^2 J(\omega_H - \omega_X)}{\partial \theta_j \cdot \partial \theta_k} + 3 \frac{\partial^2 J(\omega_X)}{\partial \theta_j \cdot \partial \theta_k} + 6 \frac{\partial^2 J(\omega_H)}{\partial \theta_j \cdot \partial \theta_k} + 6 \frac{\partial^2 J(\omega_H + \omega_X)}{\partial \theta_j \cdot \partial \theta_k}. \quad (4.54)$$

### Spectral density terms of the $R_2$ CSA component

For the CSA component of the  $R_2$  equation, the spectral density terms are

$$J_c^{R_2} = 4J(0) + 3J(\omega_X). \quad (4.55)$$

The partial derivative of these terms with respect to the parameter of the spectral density function  $\theta_j$  is

$$J_c^{R_2'} \equiv \frac{\partial J_c^{R_2}}{\partial \theta_j} = 4 \frac{\partial J(0)}{\partial \theta_j} + 3 \frac{\partial J(\omega_X)}{\partial \theta_j}. \quad (4.56)$$

The second partial derivative with respect to the parameter of the spectral density function  $\theta_j$  and  $\theta_k$  is

$$J_c^{R_2''} \equiv \frac{\partial^2 J_c^{R_2}}{\partial \theta_j \cdot \partial \theta_k} = 4 \frac{\partial^2 J(0)}{\partial \theta_j \cdot \partial \theta_k} + 3 \frac{\partial^2 J(\omega_X)}{\partial \theta_j \cdot \partial \theta_k}. \quad (4.57)$$

### Spectral density terms of the $\sigma_{\text{NOE}}$ dipolar component

For the dipolar component of the  $\sigma_{\text{NOE}}$  equation, the spectral density terms are

$$J_d^{\sigma_{\text{NOE}}} = 6J(\omega_H + \omega_X) - 6J(\omega_H - \omega_X). \quad (4.58)$$

The partial derivative of these terms with respect to the parameter of the spectral density function  $\theta_j$  is

$$J_d^{\sigma_{\text{NOE}}'} \equiv \frac{\partial J_d^{\sigma_{\text{NOE}}}}{\partial \theta_j} = 6 \frac{\partial J(\omega_H + \omega_X)}{\partial \theta_j} - 6 \frac{\partial J(\omega_H - \omega_X)}{\partial \theta_j}. \quad (4.59)$$

The second partial derivative with respect to the parameter of the spectral density function  $\theta_j$  and  $\theta_k$  is

$$J_d^{\sigma_{\text{NOE}}''} \equiv \frac{\partial^2 J_d^{\sigma_{\text{NOE}}}}{\partial \theta_j \cdot \partial \theta_k} = 6 \frac{\partial^2 J(\omega_H + \omega_X)}{\partial \theta_j \cdot \partial \theta_k} - 6 \frac{\partial^2 J(\omega_H - \omega_X)}{\partial \theta_j \cdot \partial \theta_k}. \quad (4.60)$$

### 4.6.2 $R'_i(\theta)$ values

The three relaxation equations, utilising the above components, can be expressed as

$$R_1(\theta) = dJ_d^{R_1} + cJ_c^{R_1}, \quad (4.61)$$

$$R_2(\theta) = \frac{d}{2}J_d^{R_2} + \frac{c}{6}J_c^{R_2}, \quad (4.62)$$

$$\sigma_{\text{NOE}}(\theta) = dJ_d^{\sigma_{\text{NOE}}}. \quad (4.63)$$

### 4.6.3 $R'_i(\theta)$ gradients

The partial derivatives with respect to the parameter of the spectral density functions, the chemical exchange parameter, CSA parameter, and bond length parameters are all different and are presented below.

#### Spectral density function parameter

The partial derivatives of the relaxation equations with respect to the parameter of the spectral density function  $\theta_j$  are

$$\frac{\partial R_1(\theta)}{\partial \theta_j} = dJ_d^{R_1'} + cJ_c^{R_1'}, \quad (4.64)$$

$$\frac{\partial R_2(\theta)}{\partial \theta_j} = \frac{d}{2}J_d^{R_2'} + \frac{c}{6}J_c^{R_2'}, \quad (4.65)$$

$$\frac{\partial \sigma_{\text{NOE}}(\theta)}{\partial \theta_j} = dJ_d^{\sigma_{\text{NOE}}'}. \quad (4.66)$$

#### Chemical exchange parameter

The partial derivatives of the relaxation equations with respect to the chemical exchange parameter  $R_{ex}$  are

$$\frac{\partial R_1(\theta)}{\partial R_{ex}} = 0, \quad (4.67)$$

$$\frac{\partial R_2(\theta)}{\partial R_{ex}} = 1, \quad (4.68)$$

$$\frac{\partial \sigma_{\text{NOE}}(\theta)}{\partial R_{ex}} = 0. \quad (4.69)$$

### CSA parameter

The partial derivatives of the relaxation equations with respect to the CSA parameter  $\Delta\sigma$  are

$$\frac{\partial R_1(\theta)}{\partial \Delta\sigma} = c' J_c^{R_1}, \quad (4.70)$$

$$\frac{\partial R_2(\theta)}{\partial \Delta\sigma} = \frac{c'}{6} J_c^{R_2}, \quad (4.71)$$

$$\frac{\partial \sigma_{\text{NOE}}(\theta)}{\partial \Delta\sigma} = 0. \quad (4.72)$$

### Bond length parameter

The partial derivatives of the relaxation equations with respect to the bond length parameter  $r$  are

$$\frac{\partial R_1(\theta)}{\partial r} = d' J_d^{R_1}, \quad (4.73)$$

$$\frac{\partial R_2(\theta)}{\partial r} = \frac{d'}{2} J_d^{R_2}, \quad (4.74)$$

$$\frac{\partial \sigma_{\text{NOE}}(\theta)}{\partial r} = d' J_d^{\sigma_{\text{NOE}}}. \quad (4.75)$$

#### 4.6.4 $R'_i(\theta)$ Hessians

The second partial derivatives with respect to the parameter of the spectral density functions, the chemical exchange parameter, CSA parameter, and bond length parameters are presented below.

### Spectral density function parameter - Spectral density function parameter

The second partial derivatives of the relaxation equations with respect to the parameter of the spectral density functions  $\theta_j$  and  $\theta_k$  are

$$\frac{\partial^2 R_1(\theta)}{\partial \theta_j \cdot \partial \theta_k} = d J_d^{R_1''} + c J_c^{R_1''}, \quad (4.76)$$

$$\frac{\partial^2 R_2(\theta)}{\partial \theta_j \cdot \partial \theta_k} = \frac{d}{2} J_d^{R_2''} + \frac{c}{6} J_c^{R_2''}, \quad (4.77)$$

$$\frac{\partial^2 \sigma_{\text{NOE}}(\theta)}{\partial \theta_j \cdot \partial \theta_k} = d J_d^{\sigma_{\text{NOE}}''}. \quad (4.78)$$



**Spectral density function parameter - Chemical exchange parameter**

The second partial derivatives of the relaxation equations with respect to the parameter of the spectral density function  $\theta_j$  and the chemical exchange parameter  $R_{ex}$  are

$$\frac{\partial^2 R_1(\theta)}{\partial \theta_j \cdot \partial R_{ex}} = 0, \quad (4.79)$$

$$\frac{\partial^2 R_2(\theta)}{\partial \theta_j \cdot \partial R_{ex}} = 0, \quad (4.80)$$

$$\frac{\partial^2 \sigma_{\text{NOE}}(\theta)}{\partial \theta_j \cdot \partial R_{ex}} = 0. \quad (4.81)$$

**Spectral density function parameter - CSA parameter**

The second partial derivatives of the relaxation equations with respect to the parameter of the spectral density function  $\theta_j$  and the CSA parameter  $\Delta\sigma$  are

$$\frac{\partial^2 R_1(\theta)}{\partial \theta_j \cdot \partial \Delta\sigma} = c' J_c^{\text{R}_1'}, \quad (4.82)$$

$$\frac{\partial^2 R_2(\theta)}{\partial \theta_j \cdot \partial \Delta\sigma} = \frac{c'}{6} J_c^{\text{R}_2'}, \quad (4.83)$$

$$\frac{\partial^2 \sigma_{\text{NOE}}(\theta)}{\partial \theta_j \cdot \partial \Delta\sigma} = 0. \quad (4.84)$$

**Spectral density function parameter - Bond length parameter**

The second partial derivatives of the relaxation equations with respect to the parameter of the spectral density function  $\theta_j$  and the bond length parameter  $r$  are

$$\frac{\partial^2 R_1(\theta)}{\partial \theta_j \cdot \partial r} = d' J_d^{\text{R}_1'}, \quad (4.85)$$

$$\frac{\partial^2 R_2(\theta)}{\partial \theta_j \cdot \partial r} = \frac{d'}{2} J_d^{\text{R}_2'}, \quad (4.86)$$

$$\frac{\partial^2 \sigma_{\text{NOE}}(\theta)}{\partial \theta_j \cdot \partial r} = d' J_d^{\sigma_{\text{NOE}}'}. \quad (4.87)$$

**Chemical exchange parameter - Chemical exchange parameter**

The second partial derivatives of the relaxation equations with respect to the chemical exchange parameter  $R_{ex}$  twice are

$$\frac{\partial^2 R_1(\theta)}{\partial R_{ex}^2} = 0, \quad (4.88)$$

$$\frac{\partial^2 R_2(\theta)}{\partial R_{ex}^2} = 0, \quad (4.89)$$

$$\frac{\partial^2 \sigma_{\text{NOE}}(\theta)}{\partial R_{ex}^2} = 0. \quad (4.90)$$

### Chemical exchange parameter - CSA parameter

The second partial derivatives of the relaxation equations with respect to the chemical exchange parameter  $R_{ex}$  and the CSA parameter  $\Delta\sigma$  are

$$\frac{\partial^2 R_1(\theta)}{\partial R_{ex} \cdot \partial \Delta\sigma} = 0, \quad (4.91)$$

$$\frac{\partial^2 R_2(\theta)}{\partial R_{ex} \cdot \partial \Delta\sigma} = 0, \quad (4.92)$$

$$\frac{\partial^2 \sigma_{\text{NOE}}(\theta)}{\partial R_{ex} \cdot \partial \Delta\sigma} = 0. \quad (4.93)$$

### Chemical exchange parameter - Bond length parameter

The second partial derivatives of the relaxation equations with respect to the chemical exchange parameter  $R_{ex}$  and the bond length parameter  $r$  are

$$\frac{\partial^2 R_1(\theta)}{\partial R_{ex} \cdot \partial r} = 0, \quad (4.94)$$

$$\frac{\partial^2 R_2(\theta)}{\partial R_{ex} \cdot \partial r} = 0, \quad (4.95)$$

$$\frac{\partial^2 \sigma_{\text{NOE}}(\theta)}{\partial R_{ex} \cdot \partial r} = 0. \quad (4.96)$$

### CSA parameter - CSA parameter

The second partial derivatives of the relaxation equations with respect to the CSA parameter  $\Delta\sigma$  twice are

$$\frac{\partial^2 R_1(\theta)}{\partial \Delta\sigma^2} = c'' J_c^{R_1}, \quad (4.97)$$

$$\frac{\partial^2 R_2(\theta)}{\partial \Delta\sigma^2} = \frac{c''}{6} J_c^{R_2}, \quad (4.98)$$

$$\frac{\partial^2 \sigma_{\text{NOE}}(\theta)}{\partial \Delta\sigma^2} = 0. \quad (4.99)$$

### CSA parameter - Bond length parameter

The second partial derivatives of the relaxation equations with respect to the CSA parameter  $\Delta\sigma$  and the bond length parameter  $r$  are

$$\frac{\partial^2 R_1(\theta)}{\partial \Delta\sigma \cdot \partial r} = 0, \quad (4.100)$$

$$\frac{\partial^2 R_2(\theta)}{\partial \Delta\sigma \cdot \partial r} = 0, \quad (4.101)$$

$$\frac{\partial^2 \sigma_{\text{NOE}}(\theta)}{\partial \Delta\sigma \cdot \partial r} = 0. \quad (4.102)$$

### Bond length parameter - Bond length parameter

The second partial derivatives of the relaxation equations with respect to the bond length parameter  $r$  twice are

$$\frac{\partial^2 R_1(\theta)}{\partial r^2} = d'' J_d^{R_1}, \quad (4.103)$$

$$\frac{\partial^2 R_2(\theta)}{\partial r^2} = \frac{d''}{2} J_d^{R_2}, \quad (4.104)$$

$$\frac{\partial^2 \sigma_{\text{NOE}}(\theta)}{\partial r^2} = d'' J_d^{\sigma_{\text{NOE}}}. \quad (4.105)$$

## 4.7 Ellipsoidal diffusion tensor

### 4.7.1 Ellipsoid weight derivatives



# Chapter 5

## Development of relax

This chapter is written for developers or those who would like to extend the functionality of relax. It is not required for using relax.

### 5.1 Coding conventions

#### 5.1.1 Indentation

Indentation should be set to four spaces rather than a tab character. This is the recommendation given in the python style guide found at '<http://www.python.org/doc/essays/styleguide.html>'. For vi, add the following lines to '~/.vimrc':

```
set tabstop=4
set shiftwidth=4
set expandtab
```

Certain versions of vim, those within the 6.2 series, contain a bug where the tabstop value cannot be changed using the '~/.vimrc' file (although typing ':set tabstop=4' in vim will fix it). One solution is to edit the file 'python.vim' which is located in the path '/usr/share/vim/ftplugin/' or equivalent. It contains the two lines:

```
" Python always uses a 'tabstop' of 8.
setlocal ts=8
```

If these lines are deleted, the bug will be removed. Another way to fix the problem is to install newer versions of the run-time files (which will pretty much do the same thing).

#### 5.1.2 Doc strings

These should be set to no more than 100 characters long including all leading white space. The standard Python convention of a one line description separated from a detailed description by an empty line should be adhered to.

## 5.2 The make system

For UNIX like systems, including GNU/Linux, various components of the program relax can be created using the Unix make utility. This includes C module compilation, manual creation, distribution creation, and cleaning up and removing certain files. Makefiles exist in the various directories to facilitate this process.

### 5.2.1 C module compilation

As described in the installation chapter, typing ‘make’ in the base directory will create the shared objects which are imported into Python as modules.

### 5.2.2 Creation of the PDF manual

To create the PDF version of the relax manual, type

```
make manual
```

in the base directory. Make will then shift to the ‘docs/latex’ directory and run a series of shell commands to create the manual from the L<sup>A</sup>T<sub>E</sub>X sources. This is dependent on the programs ‘rm’, ‘latex’, ‘makeindex’, ‘dvips’, and ‘ps2pdf’ being located in the environment’s path.

### 5.2.3 Creation of the HTML manual

The HTML version of the relax manual is made by typing

```
make manual.html
```

in the base directory. Again make will then shift to the ‘docs/latex’ directory. One command calling the program ‘latex2html’ will be executed which will create HTML pages from the L<sup>A</sup>T<sub>E</sub>X sources.

### 5.2.4 Making distribution archives

This section is incomplete. Creation of the HTML manual

### 5.2.5 Cleaning up

If the command

```
make clean
```

is run in the base directory, all Python byte compiled files ‘\*.pyc’, all C object files ‘\*.o’, all C shared object files ‘\*.so’, and any backup files with the extension ‘\*.bak’ are removed from all subdirectories. In addition, any temporary L<sup>A</sup>T<sub>E</sub>X compilation files are removed from the ‘docs/latex’ directory.

## Chapter 6

# Alphabetical listing of user functions

The following is a listing with descriptions of all the user functions available within the relax prompt and scripting environments. These are simply an alphabetical list of the docstrings which can normally be viewed in prompt mode by typing `'help(function)'`.

### 6.1 A warning about the formatting

The following documentation of the user functions has been automatically generated by a script which extracts and formats the docstring associated with each function. There may therefore be instances where the formatting has failed or where there are inconsistencies.

### 6.2 The list of functions

Each user function is presented within it's own subsection with the documentation broken into multiple parts, the synopsis, the default arguments, and the sections from the function's docstring.

#### 6.2.1 The synopsis

The synopsis presents a brief description of the function. It is taken as the first line of the docstring when browsing the help system .

#### 6.2.2 Defaults

This section lists all the arguments taken by the function and their default values. To invoke the function, type the function name then in brackets type a comma separated list of arguments.

The first argument printed is always ‘self’ but you can safely ignore it. ‘self’ is part of the object oriented programming within Python and is automatically prefixed to the list of arguments you supply. Therefore you can’t provide ‘self’ as the first argument, even if you do try.

### 6.2.3 Docstring sectioning

All other sections are created from the sectioning within the actual docstring.



### 6.2.4 minimise

#### Synopsis

Minimisation function.

#### Defaults

**minimise**(self, \*args, \*\*keywords)

#### Arguments

The arguments, which should all be strings, specify the minimiser as well as its options. A minimum of one argument is required. As this calls the function ‘**generic\_minimise**’ the full list of allowed arguments is shown below in the reproduced ‘**generic\_minimise**’ docstring. Ignore all sections except those labelled as minimisation algorithms and minimisation options. Also do not select the Method of Multipliers constraint algorithm as this is used in combination with the given minimisation algorithm if the keyword argument ‘**constraints**’ is set to 1. The grid search algorithm should also not be selected as this is accessed using the ‘**grid**’ function instead. The first argument passed will be set to the minimisation algorithm while all other arguments will be set to the minimisation options.

Keyword arguments differ from normal arguments having the form ‘**keyword = value**’. All arguments must precede keyword arguments in python. For more information see the examples section below or the python tutorial.

#### Keyword Arguments

**run**: The name of the run.

**func\_tol**: The function tolerance. This is used to terminate minimisation once the function value between iterations is less than the tolerance. The default value is 1e-25.

**grad\_tol**: The gradient tolerance. Minimisation is terminated if the current gradient value is less than the tolerance. The default value is None.

**max\_iterations**: The maximum number of iterations. The default value is 1e7.

**constraints**: A flag specifying whether the parameters should be constrained. The default is to turn constraints on (constraints=1).

**scaling**: The diagonal scaling flag. The default that scaling is on (scaling=1).

**print\_flag**: The amount of information to print to screen. Zero corresponds to minimal output while higher values increase the amount of output. The default value is 1.

## Diagonal scaling

Diagonal scaling is the transformation of parameter values such that each value has a similar order of magnitude. Certain minimisation techniques, for example the trust region methods, perform extremely poorly with badly scaled problems. In addition, methods which are insensitive to scaling such as Newton minimisation may still benefit due to the minimisation of round off errors.

In Model-free analysis for example, if  $S^2 = 0.5$ ,  $\tau_e = 200$  ps, and  $R_{ex} = 15$  1/s at 600 MHz, the unscaled parameter vector would be  $[0.5, 2.0\text{e-}10, 1.055\text{e-}18]$ .  $R_{ex}$  is divided by  $(2 * \pi * 600,000,000)**2$  to make it field strength independent. The scaling vector for this model may be something like  $[1.0, 1\text{e-}9, 1/(2 * \pi * 6\text{e}8)**2]$ . By dividing the unscaled parameter vector by the scaling vector the scaled parameter vector is  $[0.5, 0.2, 15.0]$ . To revert to the original unscaled parameter vector, the scaled parameter vector and scaling vector are multiplied.

## Examples

To minimise the model-free run ‘m4’ using Newton minimisation together with the GMW81 Hessian modification algorithm, the More and Thuente line search algorithm, a function tolerance of  $1\text{e-}25$ , no gradient tolerance, a maximum of 10,000,000 iterations, constraints turned on to limit parameter values, and have normal printout, type any combination of:

```
relax> minimise('newton', run='m4')
relax> minimise('Newton', run='m4')
relax> minimise('newton', 'gmw', run='m4')
relax> minimise('newton', 'mt', run='m4')
relax> minimise('newton', 'gmw', 'mt', run='m4')
relax> minimise('newton', 'mt', 'gmw', run='m4')
relax> minimise('newton', run='m4', func_tol=1e-25)
relax> minimise('newton', run='m4', func_tol=1e-25, grad_tol=None)
relax> minimise('newton', run='m4', max_iter=1e7)
relax> minimise('newton', run=name, constraints=1, max_iter=1e7)
relax> minimise('newton', run='m4', print_flag=1)
```

To minimise the model-free run ‘m5’ using constrained Simplex minimisation with a maximum of 5000 iterations, type:

```
relax> minimise('simplex', run='m5', constraints=1, max_iter=5000)
```

## Note

All the text which follows is a reproduction of the docstring of the `generic_minimise` function. Only take note of the minimisation algorithms and minimisation options sections, the other sections are not relevant for this function. The Grid search and Method of

Multipliers algorithms CANNOT be selected as minimisation algorithms for this function.

The section entitled Keyword Arguments is also completely inaccessible therefore please ignore that text.

Generic minimisation function.

This is a generic function which can be used to access all minimisers using the same set of function arguments. These are the function tolerance value for convergence tests, the maximum number of iterations, a flag specifying which data structures should be returned, and a flag specifying the amount of detail to print to screen.

### Keyword Arguments

**func:** The function which returns the value.

**dfunc:** The function which returns the gradient.

**d2func:** The function which returns the Hessian.

**args:** The tuple of arguments to supply to the functions func, dfunc, and d2func.

**x0:** The vector of initial parameter value estimates (as an array).

**min\_algor:** A string specifying which minimisation technique to use.

**min\_options:** A tuple to pass to the minimisation function as the min\_options keyword.

**func\_tol:** The function tolerance value. Once the function value between iterations decreases below this value, minimisation is terminated.

**grad\_tol:** The gradient tolerance value.

**maxiter:** The maximum number of iterations.

**A:** Linear constraint matrix  $m \times n$  ( $A \cdot x \geq b$ ).

**b:** Linear constraint scalar vector ( $A \cdot x \geq b$ ).

**l:** Lower bound constraint vector ( $l \leq x \leq u$ ).

**u:** Upper bound constraint vector ( $l \leq x \leq u$ ).

**c:** User supplied constraint function.

**dc:** User supplied constraint gradient function.

**d2c:** User supplied constraint Hessian function.

**full\_output:** A flag specifying which data structures should be returned.

**print\_flag:** A flag specifying how much information should be printed to standard output during minimisation. 0 means no output, 1 means minimal output, and values above 1 increase the amount of output printed.

## Minimisation output

The following values of the ‘full\_output’ flag will return, in tuple form, the following data

0 – ‘xk’,  
 1 – ‘(xk, fk, k, f\_count, g\_count, h\_count, warning)’,

where the data names correspond to

‘xk’ – The array of minimised parameter values,  
 ‘fk’ – The minimised function value,  
 ‘k’ – The number of iterations,  
 ‘f\_count’ – The number of function calls,  
 ‘g\_count’ – The number of gradient calls,  
 ‘h\_count’ – The number of Hessian calls,  
 ‘warning’ – The warning string.

## Minimisation algorithms

A minimisation function is selected if the minimisation algorithm argument, which should be a string, matches a certain pattern. Because the python regular expression ‘match’ statement is used, various strings can be supplied to select the same minimisation algorithm. Below is a list of the minimisation algorithms available together with the corresponding patterns.

This is a short description of python regular expression, for more information, see the regular expression syntax section of the Python Library Reference. Some of the regular expression syntax used in this function is:

‘[]’ – A sequence or set of characters to match to a single character. For example, ‘[Nn]ewton’ will match both ‘Newton’ and ‘newton’.  
 ‘^’ – Match the start of the string.  
 ‘\$’ – Match the end of the string. For example, ‘^[Ll][Mm]\$’ will match ‘lm’ and ‘LM’ but will not match if characters are placed either before or after these strings.

To select a minimisation algorithm, set the argument to a string which matches the given pattern.

Parameter initialisation methods:

Minimisation algorithm	Patterns
Grid search	<code>^[Gg]rid</code>

Unconstrained line search methods:

Minimisation algorithm	Patterns
Back-and-forth coordinate descent	<code>^[Cc][Dd]\$</code> or <code>^[Cc]oordinate[_][Dd]escent\$</code>
Steepest descent	<code>^[Ss][Dd]\$</code> or <code>^[Ss]teepest[_][Dd]escent\$</code>
Quasi-Newton BFGS	<code>^[Bb][Ff][Gg][Ss]\$</code>
Newton	<code>^[Nn]ewton\$</code>
Newton-CG	<code>^[Nn]ewton[_][Cc][Gg]\$</code> or <code>^[Nn][Cc][Gg]\$</code>

Unconstrained trust-region methods:

Minimisation algorithm	Patterns
Cauchy point	<code>^[Cc]auchy</code>
Dogleg	<code>^[Dd]ogleg</code>
CG-Steihaug	<code>^[Cc][Gg][_][Ss]teihaug</code> or <code>^[Ss]teihaug</code>
Exact trust region	<code>^[Ee]xact</code>

Unconstrained conjugate gradient methods:

Minimisation algorithm	Patterns
Fletcher-Reeves	<code>^[Ff][Rr]\$</code> or <code>^[Ff]letcher[_][Rr]eeves\$</code>
Polak-Ribière	<code>^[Pp][Rr]\$</code> or <code>^[Pp]olak[_][Rr]ibiere\$</code>
Polak-Ribière +	<code>^[Pp][Rr]\+\$</code> or <code>^[Pp]olak[_][Rr]ibiere\+\$</code>
Hestenes-Stiefel	<code>^[Hh][Ss]\$</code> or <code>^[Hh]estenes[_][Ss]tiefel\$</code>

Miscellaneous unconstrained methods:

Minimisation algorithm	Patterns
Simplex	<code>^[Ss]implex\$</code>
Levenberg-Marquardt	<code>^[Ll][Mm]\$</code> or <code>^[Ll]evenburg-[Mm]arquardt\$</code>

Constrained methods:

Minimisation algorithm	Patterns
Method of Multipliers	<code>^[Mm][Oo][Mm]\$</code> or <code>^[Mm]ethod of [Mm]ultipliers\$</code>

### Minimisation options

The minimisation options can be given in any order.

Line search algorithms. These are used in the line search methods and the conjugate gradient methods. The default is the Backtracking line search.

Line search algorithm	Patterns
Backtracking line search	<code>^[Bb]ack</code>
Nocedal and Wright interpolation based line search	<code>^[Nn][Ww][Ii]</code> or <code>^[Nn]ocedal[ ][Ww]right[ ][Ii]nt</code>
Nocedal and Wright line search for the Wolfe conditions	<code>^[Nn][Ww][Ww]</code> or <code>^[Nn]ocedal[ ][Ww]right[ ][Ww]olfe</code>
More and Thuente line search	<code>^[Mm][Tt]</code> or <code>^[Mm]ore[ ][Tt]huyente\$</code>
No line search	<code>^[Nn]one\$</code>

Hessian modifications. These are used in the Newton, Dogleg, and Exact trust region algorithms.

Hessian modification	Patterns
Unmodified Hessian	<code>[Nn]one</code>
Eigenvalue modification	<code>^[Ee]igen</code>
Cholesky with added multiple of the identity	<code>^[Cc]hol</code>
The Gill, Murray, and Wright modified Cholesky algorithm	<code>^[Gg][Mm][Ww]\$</code>
The Schnabel and Eskow 1999 algorithm	<code>^[Ss][Ee]99</code>

Hessian type, these are used in a few of the trust region methods including the Dogleg and Exact trust region algorithms. In these cases, when the Hessian type is set to Newton, a Hessian modification can also be supplied as above. The default Hessian type is Newton, and the default Hessian modification when Newton is selected is the GMW algorithm.

Hessian type	Patterns
Quasi-Newton BFGS	<code>^[Bb] [Ff] [Gg] [Ss]\$</code>
Newton	<code>^[Nn]ewton\$</code>

For Newton minimisation, the default line search algorithm is the More and Thiente line search, while the default Hessian modification is the GMW algorithm.





# Chapter 7

## Licence

### 7.1 Copying, modification, sublicencing, and distribution of relax

To ensure that the program relax, including all future versions, will remain legally available for perpetuity to anyone who wishes to use the program, it has been decided to release the code under the GNU General Public Licence. The freedom of relax is guaranteed by the GPL. This is a licence which has been very carefully crafted to protect both the author of the program as well as the public by means of copyright law. If the licence is violated by improper copying, modification, sublicencing, or distribution then the licence terminates – hence the violator is copying, modifying, sublicencing, or distributing the program illegally in full violation of copyright law. For a better understanding of the protections afforded by the GPL, the licence is reprinted in whole within the next section.

### 7.2 The GPL

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**Version 2, June 1991**

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G. Lipari and A. Szabo. Model-free approach to the interpretation of nuclear magnetic-resonance relaxation in macromolecules I. Theory and range of validity. *Journal of the American Chemical Society*, 104(17):4546 – 4559, 1982a. ISSN 0002-7863.

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