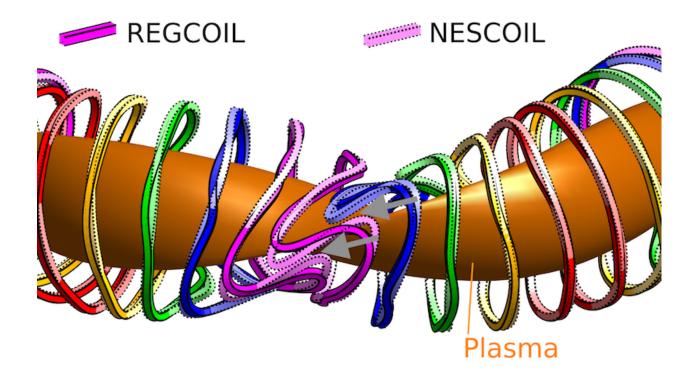
# **REGCOIL** User Manual



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# CHAPTER 1

# **Overview**

This program is an implementation of the regcoil algorithm described in [1], and was used for the calculations in [1]. This paper is available in the Git repository for this program. In addition, this program can read output files from the nescoil code [2], processing the results to compute quantities like the current density and residual magnetic field normal to the target plasma surface.

# 1.1 Required libraries

- NetCDF (for writing the output file)
- BLAS (for matrix multiplication)
- LAPACK (for solving linear systems and for singular value decomposition)

Most of these libraries will be available on any high-performace computing system. BLAS and LAPACK are available on Apple Mac computers (as part of the Accelerate framework) if you install Xcode through the App store.

If OpenMP is available, calculations with the code are parallelized. The plotting and testing functions use python, numpy, and scipy. The plotting routines regcoilPlot and compareRegcoil use matplotlib.

# 1.2 Cloning the repository

The source code for regcoil is hosted in a git repository at https://github.com/landreman/regcoil. You obtain the regcoil source code by cloning the repository. This requires several steps.

- 1. Create an account on github.com, and sign in to github.
- 2. Click the icon on the top right to see the drop-down menu of account options, and select the "Settings" page.

- 3. Click on "SSH and GPG keys" on the left, and add an SSH key for the computer you wish to use. To do this, you may wish to read see the "generating SSH keys" guide which is linked to from that page: https://help.github.com/articles/connecting-to-github-with-ssh/
- 4. From a terminal command line in the computer you wish to use, enter git clone git@github.com:landreman/regcoil.git to download the repository.

Any time after you have cloned the repository in this way, you can download future updates to the code by entering git pull from any subdirectory within your local copy.

### 1.3 Parallelization

The code does not use MPI, and so it runs on a single computing node. However, it is possible to use multiple threads on the node to accelerate computations. The multi-threaded parallelization is done in part using OpenMP and in part using a multi-threaded BLAS routine. Typically the number of threads is set by setting the environment variable OMP\_NUM\_THREADS.

### 1.4 make test

To test that your regcoil executable is working, you can run make test. Doing so will run regcoil for some or all of the examples in the examples/ directories. After each example completes, several of the output quantities will be checked, using the tests.py script in the example's directory. The make test feature is very useful when making changes to the code, since it allows you to check that your code modifications have not broken anything and that previous results can be recovered.

If you run make retest, no new runs of regcoil will be performed, but the tests.py script will be run on any existing output files in the /examples/ directories.

### 1.5 Units

As in vmec, all of regcoil's input and output parameters use SI units: meters, Teslas, Amperes, and combinations thereof.

### 1.6 Plasma current

If there is current inside the plasma, then this current will contribute to the magnetic field normal to the target plasma surface, which the coils must cancel. The contribution of plasma current to the normal field is not computed directly by regcoil, but it can be computed using the bnorm code which is often distributed with vmec. You can then set load\_bnorm=.true. and specify bnorm\_filename in the regcoil input namelist to load the bnorm results into regcoil.

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### 1.7 Matlab version

Both fortran and matlab versions of regcoil are included in the repository. The matlab version is contained in the file regcoil.m. For normal use you will want to use the fortran version, since it is much faster. The matlab version was originally written as a check of the fortran version, to verify that two independent implementations of the algorithm in different languages give identical results. The matlab version reads in an output file from the fortran version and verifies that each significant variable is identical. A few of the features in the fortran version are not available in the matlab version.

# 1.8 Plotting results

The python program regcoilPlot will display many of the output quantities from a single regcoil calculation. Results from multiple regcoil calculations can be compared using the python program compareRegcoil.

You can also make a 3D figure of the shapes of discrete coils using the matlab program m20160811\_01\_plotCoilsFromRegcoil.m. Two different sets of coils can be plotted together using the matlab program m20160811\_02\_compare2CoilsetsFromRegcoil.m. The latter program was used to generate the figure on the cover of this manual.

# 1.9 Cutting coils

Once a suitable current potential has been computed with regcoil, you can 'cut' discrete coils using the python script cutCoilsFromRegcoil. You can run this script with no arguments to see a list of the input parameters. This script will generate a coils file suitable for input to the makegrid code (distributed with vmec), which in turn generates an mgrid file used as input for free-boundary vmec.

# 1.10 Output quantities

The output variables are documented using metadata (the 'long\_name' attribute) in the netCDF output files regcoil\_out.<extension>.nc. To view the available output variables, their annotations, and their values, you can run ncdump regcoil\_out.<extension>.nc | less from the command line. Some of the most commonly used output quantities which can be found in the netCDF file are lambda, chi2\_B, chi2\_K, max\_Bnormal, max\_K, chi2\_B\_target, and current\_potential.

# 1.11 Questions, Bugs, and Feedback

We welcome any contributions to the code or documentation. For write permission to the repository, or to report any bugs, provide feedback, or ask questions, contact Matt Landreman at matt.landreman@gmail.com

# CHAPTER 2

# **Input Parameters**

In this section we describe all the parameters which can be included in the input namelist.

## 2.1 General parameters

### general\_option

Type: integer Default: 1

When it matters: Always

*Meaning*: Determines the overall flow of program execution.

general\_option = 1: Compute the current potential for a range of  $\lambda$ .

general\_option = 2: Do not compute the current potential, but rather load the current potential computed by nescoil in the file nescout\_filename, compute the  $\chi_B^2$  and  $\chi_K^2$  for it, and save results. For this setting, Nlambda will be over-written with the number of current potential solutions found in the nescout file.

general\_option = 3: Emulate nescoil's truncated singular value decomposition (TSVD) solver. The least-squares problem solved will be minimization of only  $\chi^2_B$  (i.e.  $\lambda=0$ .) Output quantities will be saved in the same arrays as if  $\lambda$  were scanned. For this setting, Nlambda will be over-written with the number of singular values.

general\_option = 4: Search for a value of the regularization weight such that a certain target is met. The target is chosen using target\_option. Use this value of general\_option for running regcoil inside a fixed-boundary plasma shape optimization, in which case chi2\_B\_target is the objective function you should minimize in the optimization.

general\_option = 5: Same as 4, except that before the  $\lambda$  search is carried out, the system is solved for  $\lambda=0$  and  $\lambda=\infty$  to check whether the current density target is attainable. Thus, this

option takes a little more time than general\_option=4 but is more robust.

### regularization\_term\_option

*Type*: string

Default: "chi2\_K"
When it matters: Always

Meaning: Determines which term is used for regularization.

regularization\_term\_option = "chi2\_K": Use  $\chi^2_K$  as the regularization term, as described in the Nuclear Fusion paper.

regularization\_term\_option = "Laplace-Beltrami": Use  $\int d^2a(\nabla^2\Phi)^2$  as the regularization term, where the integral is performed over the coil surface, and  $\nabla^2$  is the Laplace-Beltrami operator.

### nescout\_filename

Type: string Default: ""

When it matters: Only when general\_option=2.

Meaning: Name of a nescoil output file which can be read in for processing.

### symmetry\_option

Type: integer Default: 1

When it matters: Always

Meaning: Determines whether stellarator symmetry is imposed.

symmetry\_option = 1: Force the single-valued part of the current potential to be odd in  $\theta$  and  $\zeta$ . This option corresponds to stellarator symmetry.

symmetry\_option = 2: Force the single-valued part of the current potential to be even in  $\theta$  and  $\zeta$ . I'm not sure why you would ever use this option, but it is available for completeness.

symmetry\_option = 3: No symmetry in the current potential is imposed.

### save\_level

*Type*: integer *Default*: 3

When it matters: Always

*Meaning*: Option related determining how many variables are saved in the netCDF output file. The larger the value, the smaller the output file.

save\_level = 0: Save everything.

save\_level = 1: Do not save the inductance matrix.

save\_level = 2: Also do not save the matrix g.

save\_level = 3: Also do not save the normal vector or derivatives of the position vector.

### load\_bnorm

Type: logical
Default: .false.

When it matters: When general\_option=1 or 3.

Meaning: Whether or not an output file from the bnorm code is to be loaded. Set this option to .true. if there is significant current in the plasma, meaning the coils will need to cancel the associated magnetic field component normal to the target plasma surface.

### bnorm\_filename

Type: string Default: ""

When it matters: When general\_option=1 or 3 and load\_bnorm=.true..

*Meaning*: Output file from the bnorm code which contains the magnetic field normal to the target plasma surface associated with current inside the plasma.

### net\_poloidal\_current\_Amperes

Type: real Default: 1.0

When it matters: If geometry\_option\_plasma=0,1, 5 or 7, i.e. if the plasma surface is not a

vmec equilibrium.

*Meaning*: The number of Amperes of current the links the coil winding surface poloidally, denoted G in [1]. If the plasma surface is obtained from a vmec equilibrium, then net\_poloidal\_current\_Amperes will be determined instead from the byco value in the vmec wout file.

### net\_toroidal\_current\_Amperes

Type: real Default: 0.0

When it matters: Always

Meaning: The number of Amperes of current the links the coil winding surface toroidally, denoted

I in [1]. Unlike the net poloidal current, this number is never read from a wout file.

# 2.2 Resolution parameters

For any new set of surface geometries you consider, you should vary the resolution parameters in this section to make sure they are large enough. These parameters should be large enough that the code results you care about are unchanged under further resolution increases.

### ntheta\_plasma

*Type*: integer

Default: 64

When it matters: Always

*Meaning*: Number of grid points in poloidal angle used to evaluate surface integrals on the plasma surface. Often 64 or 128 is a good value. It is resonable and common but not mandatory to use the same value for ntheta\_plasma and ntheta\_coil.

### ntheta\_coil

Type: integer Default: 64

When it matters: Always

Meaning: Number of grid points in poloidal angle used to evaluate surface integrals on the coil winding surface. Often 64 or 128 is a good value. It is resonable and common but not mandatory to use the same value for ntheta\_plasma and ntheta\_coil.

### nzeta\_plasma

*Type*: integer *Default*: 64

When it matters: Always

*Meaning*: Number of grid points in toroidal angle used to evaluate surface integrals on the plasma surface. Often 64 or 128 is a good value. It is resonable and common but not mandatory to use the same value for nzeta\_plasma and nzeta\_coil.

### nzeta\_coil

*Type*: integer *Default*: 64

When it matters: Always

*Meaning*: Number of grid points in toroidal angle used to evaluate surface integrals on the coil winding surface. Often 64 or 128 is a good value. It is resonable and common but not mandatory to use the same value for nzeta\_plasma and nzeta\_coil.

### mpol\_potential

*Type*: integer *Default*: 12

When it matters: Always

*Meaning*: Maximum poloidal mode number to include for the single-valued part of the current potential on the coil winding surface.

### ntor\_potential

*Type*: integer *Default*: 12

*When it matters*: Always

*Meaning*: Maximum toroidal mode number to include for the single-valued part of the current potential on the coil winding surface.

### mpol\_transform\_refinement

Type: real Default: 5.0

When it matters: Only when geometry\_option\_plasma is 4.

Meaning: The number of poloidal mode numbers in the vmec file will be multiplied by this value when transforming from the original poloidal angle to the straight-field-line angle. Since the original vmec angle is chosen to minimize the number of Fourier modes required, more modes are required in any other coordinate. This parameter affects the time required to compute constant-offset surfaces, but does not affect the time for other calculations.

### ntor\_transform\_refinement

Type: real Default: 1.0

When it matters: Only when geometry\_option\_plasma is 4.

Meaning: The number of toroidal mode numbers in the vmec file will be multiplied by this value when transforming from the original poloidal angle to the straight-field-line angle. Since the original vmec angle is chosen to minimize the number of Fourier modes required, more modes are required in any other coordinate. This parameter affects the time required to compute constant-offset surfaces, but does not affect the time for other calculations.

# 2.3 Geometry parameters for the plasma surface

### geometry\_option\_plasma

Type: integer Default: 0

*When it matters*: Always

*Meaning*: This option controls how you specify the shape of the target plasma surface.

geometry\_option\_plasma = 0: The plasma surface will be a plain circular torus. The major radius will be RO\_plasma. The minor radius will be a\_plasma. This option exists just for testing purposes.

geometry\_option\_plasma = 1: Identical to option 0.

geometry\_option\_plasma = 2: The plasma surface will be the last surface in the full radial grid of the vmec file specified by wout\_ilename. The poloidal angle used will be the normal vmec angle which is not a straight-field-line coordinate. This is typically the best option to use for working with vmec equilibria.

geometry\_option\_plasma = 3: The plasma surface will be the last surface in the half radial grid of the vmec file specified by wout\_filename. The poloidal angle used will be the normal vmec angle which is not a straight-field-line coordinate. This option exists so that the same flux surface can be used when comparing with geometry\_option\_plasma = 4.

geometry\_option\_plasma = 4: The plasma surface will be the last surface in the half radial grid of the vmec file specified by wout\_filename. The poloidal angle used will be the straight-field-line coordinate, obtained by shifting the normal vmec poloidal angle by vmec's  $\lambda$  quantity. This option exists in order to examine changes when using a different poloidal coordinate compared to geometry\_option\_plasma = 3.

geometry\_option\_plasma = 5: The plasma surface will be the flux surface with normalized poloidal flux efit\_psiN taken from the efit file specified by efit\_filename.

geometry\_option\_plasma = 6: The plasma surface will be loaded from an ASCII file, specified by shape\_filename\_plasma. The first line of this file is ignored. The second line is an integer giving the number of Fourier modes to read. The remaining lines contain m, n, rmnc, zmns, rmns, zmnc.

geometry\_option\_plasma = 7: The plasma surface and Bnorm information will be loaded from an ASCII file in FOCUS format, specified by shape\_filename\_plasma. For more information, please look here https://princetonuniversity.github.io/FOCUS/rdsurf. pdf.

### shape\_filename\_plasma

Type: string Default: ""

When it matters: Only when geometry\_option\_plasma is 6 or 7.

*Meaning*: ASCII file from which to read in the plasma shape.

### R0\_plasma

Type: real Default: 10.0

When it matters: Only when geometry\_option\_plasma is 0 or 1.

Meaning: Major radius of the plasma surface, when this surface is a plain circular torus.

### $a_plasma$

Type: real Default: 0.5

When it matters: Only when geometry\_option\_plasma is 0 or 1.

*Meaning*: Minor radius of the plasma surface, when this surface is a plain circular torus.

### nfp\_imposed

Type: integer Default: 1

When it matters: Only when geometry\_option\_plasma is 0 or 1.

Meaning: When the plasma surface is a plain circular torus, only toroidal mode numbers that are a multiple of this parameter will be considered. This parameter thus plays a role like vmec's nfp (number of field periods), and is used when nfp is not already loaded from a vmec file.

### wout\_filename

Type: string Default: ""

When it matters: Only when geometry\_option\_plasma is 2, 3, or 4.

Meaning: Name of the vmec wout output file which will be used for the plasma surface. You can

use either a netCDF or ASCII format file.

### efit\_filename

Type: string Default: ""

When it matters: Only when geometry\_option\_plasma is 5.

*Meaning*: Name of the efit output file which will be used for the plasma surface.

### efit\_psiN

Type: real Default: 0.98

When it matters: Only when geometry\_option\_plasma is 5.

*Meaning*: Value of normalized poloidal flux at which to select a flux surface from the efit input file. A value of 1 corresponds to the last closed flux surface, and 0 corresponds to the magnetic axis.

### efit\_num\_modes

Type: integer Default: 10

When it matters: Only when geometry\_option\_plasma is 5.

Meaning: Controls the number of Fourier modes used to represent  $R(\theta)$  and  $Z(\theta)$  for the shape of the plasma surface. Each of these functions will be expanded in a sum of functions  $\sin(m\theta)$  and  $\cos(m\theta)$ , where m ranges from 0 to efit\_num\_modes-1.

# 2.4 Geometry parameters for the coil winding surface

### geometry\_option\_coil

Type: integer Default: 0

When it matters: Always

*Meaning*: This option controls which type of geometry is used for the coil surface.

geometry\_option\_coil = 0: The coil surface will be a plain circular torus. The major radius will be the same as the plasma surface: either R0\_plasma if geometry\_option\_plasma is 0 or 1, or Rmajor\_p from the vmec wout file if geometry\_option\_plasma is 2. The minor radius will be a\_coil.

geometry\_option\_coil = 1: Identical to option 0, except the major radius of the coil surface will be set by R0\_coil.

geometry\_option\_coil = 2: The coil surface will computing by expanding the plasma surface uniformly by a distance separation. The expanded surface will be saved to a local file specified by nescin\_filename.

geometry\_option\_coil = 3: The coil surface will be the 'coil' surface in the nescoil 'nescin' input file specified by nescin\_filename.

geometry\_option\_coil = 4: Similar to option 2, except that the poloidal angle will be changed such that the arclength (with respect to  $\theta$ ) is independent of  $\theta$  at each  $\zeta$ . The coil surface will computing by expanding the plasma surface uniformly by a distance separation. The expanded surface will be saved to a local file specified by nescin\_filename.

### R0\_coil

Type: real Default: 10.0

When it matters: Only when geometry\_option\_coil is 1.

Meaning: Major radius of the coil surface, when this surface is a plain circular torus.

### a\_coil

Type: real Default: 1.0

When it matters: Only when geometry\_option\_coil is 0 or 1.

*Meaning*: Minor radius of the coil surface, when this surface is a plain circular torus.

### separation

Type: real Default: 0.2

When it matters: Only when geometry\_option\_coil is 2.

*Meaning*: Amount by which the coil surface is offset from the plasma surface.

### nescin\_filename

*Type*: string

Default: "nescin.out"

When it matters: Only when geometry\_option\_coil is 2 (write to) or 3 (read from).

Meaning: Name of a nescin file, of the sort used with the nescoil code. If geometry\_option\_coil=3, the coil surface from this file will be used as the coil surface for regcoil. If geometry\_option\_coil=2, regcoil will save the uniform-offset surface it computes into a file with this name.

### mpol\_coil\_filter

Type: integer Default: 24

When it matters: Only when geometry\_option\_coil is 2, 3, or 4.

*Meaning*: Terms in the Fourier series for  $R(\theta, \zeta)$  and  $Z(\theta, \zeta)$  describing the coil winding surface will be dropped if the poloidal mode number is larger than mpol\_coil\_filter.

### ntor\_coil\_filter

Type: integer Default: 24

When it matters: Only when geometry\_option\_coil is 2, 3, or 4.

*Meaning*: Terms in the Fourier series for  $R(\theta, \zeta)$  and  $Z(\theta, \zeta)$  describing the coil winding surface will be dropped if the toroidal mode number is larger than ntor\_coil\_filter. Specify 1, 2, 3, ... rather than nfp,  $2 \times nfp$ ,  $3 \times nfp$ , etc.

# 2.5 Parameters related to the regularization weight

### Nlambda

*Type*: integer *Default*: 4

When it matters: Only when  $general_option = 1, 4, or 5$ .

Meaning: When general\_option=1, Nlambda is the number of values of  $\lambda$  for which the problem is solved. When general\_option=4 or 5, Nlambda is the upper limit on the number of values of  $\lambda$  for which the problem is solved.

### lambda\_max

*Type*: real *Default*: 1.0e-13

When it matters: Only when general\_option = 1.

*Meaning*: Maximum value of  $\lambda$  for which the problem is solved.

### lambda\_min

Type: real Default: 1.0e-19

When it matters: Only when  $general_option = 1$ .

*Meaning*: Minimum nonzero value of  $\lambda$  for which the problem is solved. Note that the problem is always solved for  $\lambda = 0$  in addition to the nonzero values.

### target\_option

Type: string
Default: "max\_K"

When it matters: Only when general\_option = 4 or 5. Meaning: Controls which quantity is targeted to determine  $\lambda$ :

target\_option = "max\_K": Search for the  $\lambda$  value such that the maximum current density over the winding surface equals target\_value.

target\_option = "chi2\_K": Search for the  $\lambda$  value such that  $\chi^2_K$  equals target\_value.

target\_option = "rms\_K": Search for the  $\lambda$  value such that the root-mean-square current density  $(\int d^2a \ K^2)^{1/2}$  (where the integral is over the current winding surface) equals target\_value.

target\_option = "max\_Bnormal": Search for the  $\lambda$  value such that the maximum  $\mathbf{B} \cdot \mathbf{n}$  over the plasma surface equals target\_value.

target\_option = "chi2\_B": Search for the  $\lambda$  value such that  $\chi^2_B$  equals target\_value.

target\_option = "rms\_Bnormal": Search for the  $\lambda$  value such that the root-mean-square value of  $\mathbf{B} \cdot \mathbf{n}$ , i.e.  $\left( \int d^2 a \ B_n^2 \right)^{1/2}$  (where the integral is over the plasma surface) equals target\_value. target\_option = "max\_K\_lse": Search for the  $\lambda$  value such that  $K_{\max,lse}$  (the maximum approximated using the log-sum-exponent norm) equals target\_value.

$$K_{\text{max,lse}} = \frac{1}{\text{target\_option\_p}} \log \left( \frac{\int_{\text{coil}} d^2 A \exp \left( \text{target\_option\_p} K \right)}{A_{\text{coil}}} \right) \tag{2.1}$$

See target\_option\_p.

target\_option = "lp\_norm\_K": Search for the  $\lambda$  value such that  $||K||_p$  ( the  $L^p$  norm of K) equals target\_value.

$$||\mathbf{K}||_p = \left(\frac{\int_{\text{coil}} d^2 A K^{\text{target\_option\_p}}}{A_{\text{coil}}}\right)^{1/p} \tag{2.2}$$

See target\_option\_p.

### target\_option\_p

Type: real Default: 4.0

When it matters: Only when target\_option = "lp\_norm\_K" or "max\_K\_lse".

*Meaning*: The value of p used for the  $L^p$  norm or log-sum-exponent norm of K.

### target\_value

*Type*: real *Default*: 8.0e6

When it matters: Only when  $general_option = 4$  or 5.

*Meaning*: The value of the quantity specified by target\_option that the code will attempt to match by varying  $\lambda$ .

### lambda\_search\_tolerance

Type: real Default: 1.0e-5

When it matters: Only when general option = 4 or 5. *Meaning*: Relative tolerance for the lambda root-finding.

# 2.6 Parameters related to adjoint solve

### sensitivity\_option

*Type*: integer

### Default: 1

When it matters: Only when one wishes to compute derivatives of output quantities with respect to the coil winding surface parameters. Note that sensitivity\_option > 1 must be used with general\_option = 1, 4, or 5. sensitivity\_option = 3, 4, 5 should give the same results, although 4 or 5 tend to be more efficient.

### Meaning:

sensitivity\_option = 1: Derivatives are not computed. sensitivity\_option = 2: Derivative of  $\chi^2$  is computed. sensitivity\_option = 3: Derivatives of  $\chi^2_K$ ,  $\chi^2_B$ , and  $\chi^2$  are computed. This requires two adjoint solves.

sensitivity\_option = 4: Derivatives of  $\chi_K^2$ ,  $\chi_B^2$ , and  $\chi^2$  are computed. An adjoint solve is used to compute the derivative of  $\chi_K^2$  and the derivative of  $\chi_B^2$  is computed from it. This requires one adjoint solve.

sensitivity\_option = 5: Derivatives of  $\chi_K^2$ ,  $\chi_B^2$ , and  $\chi^2$  are computed. An adjoint solve is used to compute the derivative of  $\chi_B^2$  and the derivative of  $\chi_K^2$  is computed from it. This requires one adjoint solve.

### fixed\_norm\_sensitivity\_option

*Type*: logical *Default*: false

When it matters: When sensitivity\_option > 1.

Meaning: If true, derivatives of  $\chi^2$ ,  $\chi^2_B$ , and  $\chi^2_K$  are computed at fixed target (indicated by target\_option) rather than at fixed  $\lambda$ . This option must be used with general\_option > 3 and target\_option = "chi2\_B", "lp\_norm\_K" or "max\_K\_lse".

### sensitivity\_symmetry\_option

*Type*: integer *Default*: 1

When it matters: Symmetry assumed when computing derivative with respect to coil geometry parameters. This does not need to be the same as symmetry\_option.

### Meaning:

sensitivity\_symmetry\_option = 1: Only compute derivatives with respect to  $r^c_{mn}$  and  $z^s_{mn}$  of the winding surface using the NESCIN convention. This option corresponds to stellarator symmetry.

sensitivity\_symmetry\_option = 2: Only compute derivatives with respect to  $r_{mn}^s$  and  $z_{mn}^c$  of the winding surface using the NESCIN convention.

sensitivity\_symmetry\_option = 3: No symmetry in the winding surface is imposed.

### nmax\_sensitivity

*Type*: integer *Default*: 1

When it matters: When sensitivity\_option > 1.

*Meaning*: Derivatives of  $\chi^2$ ,  $\chi^2_B$ , and  $\chi^2_K$  are computed with respect to winding surface Fourier modes with  $|n| \leq \text{nmax\_sensitivity}$ .

### mmax\_sensitivity

Type: integer Default: 1

When it matters: When sensitivity\_option > 1.

Meaning: Derivatives of  $\chi^2$ ,  $\chi^2_B$ , and  $\chi^2_K$  are computed with respect to winding surface Fourier modes with  $|m| \leq \max_{s} \text{sensitivity}$ .

### coil\_plasma\_dist\_lse\_p

Type: real Default: 1.0d4

When it matters: When sensitivity\_option> 1.

*Meaning*: If sensitivity\_option > 1, the derivative of the log-sum-exponent approximation to the coil-plasma distance will be computed. The value of coil-plasma\_dist\_lse\_p determines the scaling, p, in the exponent for this form of the distance approximation.

$$d_{\min,lse} = -\frac{1}{p} \log \left( \frac{\int_{\text{coil}} d^2 A \int_{\text{plasma}} d^2 A \exp\left(-p\sqrt{(r_{\text{coil}} - r_{\text{plasma}})^2}\right)}{A_{\text{coil}} A_{\text{plasma}}} \right)$$
(2.3)

# CHAPTER 3

# Winding Surface Optimization with Adjoint REGCOIL

In this section we describe winding surface optimization using the adjoint REGCOIL method.

### 3.1 Overview

If an adjoint equation is solved in REGCOIL, (sensitivity\_option > 1), then analytic derivatives of  $\chi_B^2$ ,  $\|\boldsymbol{K}\|_2$ , or  $K_{\max}$  are computed with respect to the Fourier coefficients defining the winding surface using the adjoint method. These derivatives are used for a gradient-based optimization method to find a winding surface which minimizes a user-defined objective function. The target plasma surface is held fixed during the optimization. The user has the option of holding a target function fixed during the optimization (such as  $\chi_B^2$ ,  $\|\boldsymbol{K}\|_2$ , or  $K_{\max}$ ) to fix the regularization parameter  $\lambda$ . There are also options to impose constraints, such as on the minimum coil-plasma distance. The NESCIN convention is used, and the result of the optimization is a NESCIN file with the optimal winding surface Fourier coefficients.

# 3.2 Optimization scripts

Additional parameters must be included in the REGCOIL input file outside the regcoil\_nml Fortran namelist. The parameters in this namelist are read by either the scipy\_optimize or nlopt\_optimize python scripts, found in the windingSurfaceOptimization directory. These scripts are called with the REGCOIL input file as an argument. The REGCOIL input file in addition to any geometry files (nescin\_filename, efit\_filename, bnorm\_filename, shape\_filename\_plasma) must be located in the directory from which these scripts are called.

The nlopt package must be installed in order to call nlopt\_optimize. See the nlopt documentation for installation instructions. In general nlopt\_optimize should be used if one wants to perform constrained optimization. Once nlopt is installed, ensure that your \$PYTHONPATH includes the directory containing libnlopt.so. The directory where this is located is specified by

libdir in the file libnlopt.la. At this time nlopt\_optimize has been used with nlopt 2.4.2. The scipy\_optimze script utilizes the scipy\_optimize package. Details on installation of scipy can be found here. The parameters relevant to each of these scripts are detailed below.

Each time that REGCOIL is called from one of the scripts, an eval\_directory will be created. The script will print the objective function and constraint functions diagnostics with each evaluation to standard output. The compareRegcoilSurface script (found in regcoil/coilOptimizationTools) can be called on two REGCOIL output files to compare the winding surfaces at 2 evaluations.

```
compareRegcoilSurface eval_0/regcoil_out.w7x.nc eval_10/regcoil_out.w7x.nc
```

Several example input files can be found in the adjointRegcoilExamples directory.

While nlopt\_optimize and scipy\_optimize are serial optimizers, the gradient computation in REGCOIL is performed in parallel with OpenMP. Multithreading is controlled with the OMP\_NUM\_THREADS environment variable.

To run scipy\_optimize or nlopt\_optimize from any directory, add the regcoil/coilOptimizationTools directory to your \$PATH and to your \$PYTHONPATH, and add the regcoil directory to your \$PATH.

## 3.3 Required &regcoil\_nml namelist parameters

The following items in the &regcoil namelist should be used when running adjoint REGCOIL.

- geometry\_option\_coil = 3 or 4
  - A nescin\_filename must be specified. It is assumed that the m=0 mode only includes  $n\geq 0$  modes.
- sensitivity\_option > 1 denotes an adjoint solve must be performed. If  $\chi_B^2$ ,  $\|K\|_2$  or  $K_{\max}$  are included in the objective function, sensitivity\_option should be > 2. If finite difference derivatives are used by setting grad\_option = 1 or if  $\chi_B^2$ ,  $\|K\|_2$  or  $K_{\max}$  are not included in the objective function, sensitivity\_option can be set to 1.
- nmax\_sensitivity should be set to the largest value of n that should be varied in the NESCIN file. This matters if sensitivity\_option > 1.
- nmax\_sensitivity should be set to the largest value of m that should be varied in the NESCIN file. This matters if sensitivity\_option > 1.
- sensitivity\_symmetry\_option should be set to reflect the symmetry desired in the optimized winding surface.
- If the coil-plasma distance is to be included in the objective function or constraints, then coil-plasma\_dist\_lse\_p should be set to the desired value for the log-sum-exponent approximation. A value in the range  $10^2$   $10^4$  is typically sufficient. At very large values the function has very steep gradients, while at small values it does not approximate the minimum function well.

- If the gradients of  $\chi_B^2$ ,  $\|\boldsymbol{K}\|_2$  or  $K_{\text{max}}$  are to be computed at fixed target function (specified by target\_option) (rather than at fixed  $\lambda$ ), fixed\_norm\_sensitivity\_option should be > 1. The following parameters matter when fixed\_norm\_sensitivity\_option > 1.
  - target\_option must be "max\_K\_lse", "lp\_norm\_K", or "chi2\_B"
  - target\_option\_p is a parameter in the norm defined by target\_option

# 3.4 Coil-winding Surface Optimization Parameters

The parameters related to winding surface optimization are defined in the input file outside the regcoil\_nml namelist.

# 3.5 Winding Surface Optimization

The following objective function is used when nlopt\_optimize or scipy\_optimize is called.

$$f = \text{scale\_factor} \left( -\alpha_V V_{\text{coil}} + \alpha_S S_p - \alpha_D d_{\text{min}} + \alpha_B \chi_B^2 + \alpha_K \| \boldsymbol{K} \|_2 + \alpha_{D,\text{tanh}} \left( 1 + \text{tanh} \left( (d_{\text{min}} - \text{d\_min\_target}) / \text{alpha\_D\_tanh\_scale} \right) \right) \right)$$
(3.1)

Here  $S_p$  is the spectral width,

$$S_p = \sum_{m,n} m^p \left( (r_{mn}^c)^2 + (z_{mn}^s)^2 \right), \tag{3.2}$$

 $d_{\min}$  is the minimum coil-plasma distance,

$$d_{\min} = \min\left(\sqrt{\left(\boldsymbol{r}_{\text{coil}} - \boldsymbol{r}_{\text{plasma}}\right)^2}\right),\tag{3.3}$$

and  $\|K\|_2$  is the root-mean-squared current density,

$$\|\boldsymbol{K}\|_2 = \sqrt{\chi_K^2 / A_{\text{coil}}}.$$
 (3.4)

The coefficients in f are defined by the user.

### alphaV

*Type*: float *Default*: 0

When it matters: When nlopt\_optimize or scipy\_optimize is being called.

*Meaning*: Scaling factor for  $V_{\text{coil}}$  in the objective function.

### alphaS

*Type*: float *Default*: 0

When it matters: When nlopt\_optimize or scipy\_optimize is being called.

*Meaning*: Scaling factor for  $S_p$  in the objective function.

### alphaD

*Type*: float *Default*: 0

When it matters: When nlopt\_optimize or scipy\_optimize is being called.

*Meaning*: Scaling factor for  $d_{min}$  in the objective function.

### alphaB

Type: float Default: 0

When it matters: When nlopt\_optimize or scipy\_optimize is being called.

*Meaning*: Scaling factor for  $\chi_B^2$  in the objective function.

### alphaK

*Type*: float *Default*: 0

When it matters: When nlopt\_optimize or scipy\_optimize is being called.

*Meaning*: Scaling factor for  $||K||_2$  in the objective function.

### alphaD\_tanh

*Type*: float *Default*: 0

When it matters: When nlopt\_optimize or scipy\_optimize is being called.

*Meaning*: Scaling factor for the tanh function in the objective function, which acts as a 'wall' in parameter space when  $d_{min}$  reaches  $d_{min}$ -target. The scaling is set by alphaD\_tanh\_scale.

### alphaD\_tanh\_scale

*Type*: float *Default*: 1.0

When it matters: When nlopt\_optimize or scipy\_optimize is being called and alphaD\_tanh\_scale

is non-zero.

Meaning: Sets the scale length for the tanh function in the objective function. When this value is

large, the gradients are less sharp.

### d\_min\_target

Type: float
Default: 0.1

When it matters: When nlopt\_optimize or scipy\_optimize is being called and alphaD\_tanh\_scale

is non-zero.

*Meaning*: Sets the location of the 'wall' in parameter space due to the tanh function.

### scaleFactor

Type: float Default: 1

When it matters: When nlopt\_optimize or scipy\_optimize is being called.

*Meaning*: Scaling factor for objective function.

### 3.5.1 Scipy Optimize

The following parameters are read if scipy\_optimize is being called.

### scipy\_optimize\_method

Type: string Default: CG

When it matters: When scipy\_optimize is being called.

*Meaning*: The method used by scipy\_optimize. The following gradient-based methods are available: CG, BFGS, Newton-CG, L-BFGS-B, TNC, SLSQP, dogleg, and trust-ncp. See the scipy.optimize.minimize documentation for more information.

### grad\_option

Type: integer Default: 1

When it matters: When scipy\_optimize is being called.

Meaning: When grad\_option == 1, the gradients computed by REGCOIL are used by scipy.optimize.minimize. If grad\_option == 0, a gradient function handle is not passed to scipy.optimize, and finite differencing is used.

### maxiter

*Type*: integer *Default*: 1000

When it matters: When scipy\_optimize is being called.

Meaning: Maximum number of iteration to be taken by scipy.optimize.minimize.

### norm

Type: integer Default: 2

When it matters: When scipy\_optimize is being called.

Meaning: Order of norm of the gradient used by scipy.optimize.minimize to determine

successful termination.

### gtol

Type: float Default:  $10^{-5}$ 

When it matters: When scipy\_optimize is being called.

Meaning: Tolerance for gradient norm required for termination.

### nmax

*Type*: integer *Default*: none

When it matters: When scipy\_optimize is being called.

*Meaning*: Maximum *n* for Fourier modes of coil winding surface parameterization in nescin\_filename.

### mmax

*Type*: integer *Default*: none

When it matters: When scipy\_optimize is being called.

*Meaning*: Maximum m for Fourier modes of coil winding surface parameterization in nescin\_filename.

### nmax

*Type*: integer *Default*: none

When it matters: When nlopt\_optimize is being called.

*Meaning*: Maximum n value for winding surface Fourier modes in nescin\_filename.

### mmax

*Type*: integer *Default*: none

When it matters: When nlopt\_optimize is being called.

*Meaning*: Maximum m value for winding surface Fourier modes in nescin\_filename.

### 3.5.2 NLOPT Optimize

The following parameters are read if nlopt\_optimize is being called.

### constraint\_min

*Type*: integer *Default*: 0

When it matters: When nlopt\_optimize is being called.

*Meaning*: constraint\_min = 0: No constraint on a minimum coil-plasma distance is enforced.

constraint min = 1: Minimum coil-plasma distance is constrained to be ≤ d.min.

### d\_min

*Type*: float *Default*: 0.2

When it matters: When nlopt\_optimize is being called and contraint\_min = 1.

Meaning: Minimum coil-plasma allowed for optimized winding surface.

### constraint\_max\_K

Type: integer Default: 0

When it matters: When nlopt\_optimize is being called. Meaning: constraint\_max\_K = 0: No constraint on max K. constraint\_max\_K = 1: Maximum current density is constraint to be ≤ max\_K

### $max_K$

*Type*: float *Default*: 7.1e6

When it matters: When nloptloptimize is being called and contraint\_max\_K = 1.

Meaning: Maximum current density allowed during winding surface optimization.

### constraint\_rms\_K

Type: integer Default: 0

When it matters: When nlopt\_optimize is being called. Meaning: constraint\_rms\_K = 0: No constraint on  $||K||_2$ .

constraint\_rms\_K = 1: Maximum current density is constraint to be ≤ rms\_K

### rms\_K

*Type*: float *Default*: 2.36e6

When it matters: When nlopt\_optimize is being called and contraint\_rms\_K = 1.

Meaning: Maximum current density allowed during winding surface optimization.

### nlopt\_method

Type: string Default: none

When it matters: When nlopt\_optimize is being called.

*Meaning*: Algorithm used for gradient based winding surface optimization. The following options are supported.

- nlopt.G\_MLSL\_LDS
- nlopt.LD\_LBFGS
- nlopt.LD\_MMA
- nlopt.LD\_SLSQP
- nlopt.LD\_CCSAQ
- nlopt.LD\_TNEWTON\_PRECOND\_RESTART
- nlopt.LD\_VAR1

### omega\_min

Type: float Default: -7

When it matters: When nlopt\_optimize is being called.

Meaning: Minimum value for  $r_{mn}^c$  or  $z_{mn}^s$  allowed for winding surface optimization.

### omega\_max

Type: float Default: 7

When it matters: When nlopt\_optimize is being called.

*Meaning*: Maximum value for  $r_{mn}^c$  or  $z_{mn}^s$  allowed for winding surface optimization.

### constraint\_tol

*Type*: float *Default*: 1e-6

When it matters: When nlopt\_optimize is being called and constraint\_min = 1 or constraint\_max\_K

= 1 or constraint\_rms\_K.

*Meaning*: Tolerance allowed for constraint equation to be satisfied.

### ftol\_rel

*Type*: float *Default*: 1e-6

When it matters: When nlopt\_optimize is being called.

Meaning: Optimization will stop when the relative change in the objective function f is less than

ftol\_rel in successive steps.

# 3.6 General considerations and tips

- The results of the optimization vary widely with the input parameters. It is suggested that a user perform low-resolution optimizations with varying parameters (such as  $\alpha_B$ ,  $\alpha_S$ ,  $\alpha_{\max K}$ , and  $\alpha_V$ ). To begin, one can run the optimization for a few evaluations to ensure that it is descending in the desired direction.
- If general\_option = 4 or 5 (a  $\lambda$  search is performed for a target function), it is not always possible to obtain a solution for  $\lambda$  if the current density is too low or high. In this case, the optimization scripts adjust the target\_current\_density and will print a message to standard output. If you see that the target\_current\_density is readjusted several times, it is probably a good idea to begin the optimization with a different target\_current\_density.
- The SLSQP and CCSAQ algorithms in nlopt can be sensitive to the selection of omega\_min and omega\_max, as these set the initial step size for the optimization. If the winding surface wanders to far from the initial surface, these should be adjusted.

# References

- [1] M. Landreman. An improved current potential method for fast computation of stellarator coil shapes. *Nucl. Fusion*, **57**, 046003 (2017).
- [2] P. Merkel. Solution of stellarator boundary value problems with external currents. *Nucl. Fusion*, **27**, 867 (1987).