Innovations in stellarator optimization for quasisymmetry



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^a University of Maryland, ^b New York University, ^c Max Planck Institute for Plasma Physics, ^d Téchnico Lisboa, ^e Princeton Plasma Physics Laboratory Advantages of stellarators: steady-state, no disruptions, no Greenwald density limit, no power recirculated for current drive.

But, alpha particle losses & collisional transport would be too large unless you carefully choose the geometry.



Fraction of alpha particle energy lost before thermalization



Advantages of stellarators: steady-state, no disruptions, no Greenwald density limit, no power recirculated for current drive.

But, alpha particle losses & collisional transport would be too large unless you carefully choose the geometry.

A solution: quasisymmetry



 $B = B(s, \theta - N \varphi)$

Boozer angles

 $\Rightarrow \quad \oint (\mathbf{v}_d \cdot \nabla s) dt = 0$



- Optimizing stellarator geometry for precise quasisymmetry
- Constructing quasisymmetric geometries using near-axis expansion
- Self-consistent current in the plasma
- Future directions

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Optimization problem

- 2 stage approach, as for W7-X: First optimize shape of boundary surface, then coils.
- Objective functions:

• Parameter space: $R_{m,n} \& Z_{m,n}$ defining a toroidal boundary

$$R(\theta,\phi) = \sum_{m,n} R_{m,n} \cos(m\theta - n\phi), \quad Z(\theta,\phi) = \sum_{m,n} Z_{m,n} \sin(m\theta - n\phi)$$

- SIMSOPT with VMEC
- Cold start: circular cross-section torus
- Vacuum fields at first, allowing precise checks against SPEC & Biot-Savart
- Algorithm: default for least-squares in scipy (trust region reflective)
- 6 steps: increasing # of modes varied & VMEC resolution
- Run many optimizations, pick the best

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Simsopt documentation

simsopt is a framework for optimizing stellarators. The high-level routines are in python, with calls to C++ or fortran where needed for performance. Several types of components are included:

- Interfaces to physics codes, e.g. for MHD equilibrium.
- Tools for defining objective functions and parameter spaces for optimization.
- Geometric objects that are important for stellarators surfaces and curves with several available parameterizations.
- Efficient implementations of the Biot-Savart law and other magnetic field representations, including derivatives.
- Tools for parallelized finite-difference gradient calculations.
- Handles both stage 1 (plasma shape) and stage 2 (coil shapes)
- 100% open source
- Both derivative-free and derivative-based problems
- Try out new objective functions or new surface/curve representations without touching any working code.

ML, B Medasani, F Wechsung, A Giuliani, R Jorge, & C Zhu, J. Open Source Software 6, 3525 (2021).

Straight |B| contours are possible for quasi-axisymmetry



ML & Paul, PRL (2022). All input/output files and optimization scripts online at doi.org/10.5281/zenodo.5645412 10

Straight |B| contours are possible for quasi-helical symmetry



ML & Paul, PRL (2022).

All input/output files and optimization scripts online at doi.org/10.5281/zenodo.5645412 11

Good symmetry also exists with magnetic well



ML & Paul, PRL (2022).

All input/output files and optimization scripts online at doi.org/10.5281/zenodo.5645412 12

Symmetry-breaking modes can be made extremely small

New QA configuration



|B|in Boozer coordinates was verified by independent SPEC calculations



(Ntor = Mpol, Lrad = Mpol + 4)

By Elizabeth Paul

Quasisymmetry works: alpha particle confinement is significantly improved



Fraction of alpha particle energy lost before thermalization

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Alpha confinement in quasi-helical stellarators can be better than in a tokamak



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The symmetry also yields extremely low collisional transport for a thermal plasma



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Expansion about the magnetic axis reduces 3D PDE \rightarrow 1D ODEs



The expansion by Garren & Boozer (1991) has been converted into a practical algorithm for generating stellarator shapes

- Inputs:
 - Shape of the magnetic axis.
 - 3-5 other numbers (e.g. current on the axis).
- Outputs:
 - Shape of the surfaces around the axis.
 - Rotational transform on axis.

- Quasisymmetry guaranteed in a neighborhood of axis.
- Can pick any surface to pass to traditional 3D MHD fixed-boundary solve.



Though quasisymmetry can be guaranteed in a neighborhood of the axis, optimization can greatly increase the volume of good symmetry



 $w_{\nabla\nabla}$, w_L , w_i , w_{B20} , w_{well} : Weights chosen by user

The near-axis equations can be solved so quickly that tensor-product scans over many parameters are feasible



The near-axis equations can be solved so quickly that tensor-product scans over many parameters are feasible



The near-axis expansion can yield configurations very similar to finite-aspect-ratio optimization, but much faster



In some cases, the near-axis construction can directly generate configurations with excellent confinement

Fraction of alpha particle energy lost before thermalization



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The bootstrap current arises in tokamaks & stellarators when the density & temperature become significant

- Ions and electrons have different trajectories.
 Different mean flows = electric current.
- Current depends on geometry, density, & temperature.
- For $\beta > 0$, we don't know **B** until we include this effect.
- Computing the bootstrap current requires kinetic theory: coupled 4D advection-dominated integrodifferential equations.
- Need *self-consistency* between MHD equilibrium and kinetic equation.
- How can a self-consistent bootstrap current calculation be integrated with stellarator optimization?



New idea: exploit quasisymmetry & use analytic expressions for tokamaks

Pytte & Boozer (1981), Boozer (1983):

Bootstrap current (& other quantities) in quasisymmetry are the same as in axisymmetry, up to some substitutions:

 $\iota \rightarrow \iota - N$

Should be accurate for the new precisely quasisymmetric configurations.

A new set of analytical formulae for the computation of the bootstrap current and the neoclassical conductivity in tokamaks

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Before doing new optimizations: Redl formula is accurate in previous QA & QH stellarators

 $n_e = (1 - s^5) 4x 10^{20} m^{-3}$, $T_e = T_i = (1 - s) 12 keV$



(Not self-consistent yet)

Optimization recipe

- Objective function: $f = f_{QS} + f_{bootstrap} + (A - 6.5)^{2} + (a - a_{ARIES-CS})^{2} + (\langle B \rangle - \langle B \rangle_{ARIES-CS})^{2}$ Boundary aspect ratio $f_{QS} = \int d^{3}x \left(\frac{1}{B^{3}} \left[(N - \iota) \mathbf{B} \times \nabla B \cdot \nabla \psi - (G + NI) \mathbf{B} \cdot \nabla B \right] \right)^{2}$ $f_{bootstrap} = \frac{\int_{0}^{1} ds \left[\langle \mathbf{j} \cdot \mathbf{B} \rangle_{\text{vmec}} - \langle \mathbf{j} \cdot \mathbf{B} \rangle_{\text{RedI}} \right]^{2}}{\int_{0}^{1} ds \left[\langle \mathbf{j} \cdot \mathbf{B} \rangle_{\text{vmec}} + \langle \mathbf{j} \cdot \mathbf{B} \rangle_{\text{RedI}} \right]^{2}}$
- Parameter space: $\{R_{m,n}, Z_{m,n}, \text{ toroidal flux, current spline values}\}$ or $\{R_{m,n}, Z_{m,n}, \text{ toroidal flux, iota spline values}\}$
- Cold start
- Algorithm: default for least-squares in scipy (trust region reflective)
- Steps: increasing # of modes varied: m and |n/nfp| up to j in step j

Example of optimization with self-consistent bootstrap current



To reach reactor-relevant 5% beta in QH without crossing iota=1, a constraint on iota can be included

Crossing iota=1, the worst resonance, is probably unacceptable.



$$n_{e0} = 3e20/meters^3$$
, $T_{e0} = T_{i0} = 15 \text{ keV}$

To reach reactor-relevant 5% beta in QH without crossing iota=1, a constraint on iota can be included

Crossing iota=1, the worst resonance, is probably unacceptable.



If you want *perfectly* self-consistent current, you can do a few fixed-point iterations at the end



No significant degradation in quasisymmetry:



The optimization with self-consistent bootstrap current also works for quasi-axisymmetry



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Future directions

- Eliminate islands at high β (plasma pressure & current)
- Coils & MHD stability for the high β configurations
- Quasi-isodynamic (|B| contours close poloidally)
- Understand trade-offs using multi-objective optimization
- Robustness to uncertainty in the pressure profile
- Interact with systems codes & reactor studies
- Combined coil + confinement (1-stage) optimization
- Optimization of turbulence & divertor



The Hidden Symmetries project has enabled significant progress in stellarator optimization & confinement



Extra slides

Why do the configurations with best quasisymmetry not have the best trajectory confinement?



2 types of quasisymmetry

Quasi-helical symmetry Quasi-axisymmetry General stellarator (QA): $B = B(r, \theta)$ (QH): $B = B(r, \theta - N\phi)$ (not symmetric) Φ6 Φ6 Φ6 Poloidal Boozer angle angle angle Boozer Poloidal Boozer Poloidal 0 0 0 6 Toroidal Boozer angle φ Toroidal Boozer angle φ Toroidal Boozer angle φ

Contours of $B = |\mathbf{B}|$: $B_{min} \square B_{max}$

Previous quasisymmetric configurations



(a) Zarnstorff et al (2001)
(b) Najambadi et al (2008)
(c) Garabedian (2008)
(d) Liu et al (2018)
(e) Henneberg et al (2019)
(f) Nuhrenberg & Zille (1988)
(g) Anderson et al (1995)
(h) Bader et al (2020)

We want $B = B(r, \theta - N \phi)$

Is there an optimization recipe that can give consistently straight |B| contours?

The new configurations have small magnetic shear





Self-consistent bootstrap current profiles have previously been computed by fixedpoint iteration between VMEC and a bootstrap current code

Available codes: DKES/NTSS, SFINCS, + others for tokamaks.

VMEC: given $I_0(s)$, determine B_0 . SFINCS: given B_0 , determine $I_1(s)$. VMEC: given $I_1(s)$, determine B_1 . SFINCS: given B_1 , determine $I_2(s)$.

SFINCS: >20 node-seconds per surface for reactor n/T, cost much higher at low collisionality, uses PETSc, tricky to set resolution parameters

...



New idea: exploit quasisymmetry & use analytic expressions for tokamaks



Decent 16-coil solutions have been found for the new QAs



By Florian Wechsung @ NYU.

<R>/10 between filament centers.

2π

θ

0

Ω

|B| @ s=0.05

Φ

Haven't looked at the QHs yet

Φ

2π ||B| @ s=1;

1.028

1.022

1.016

1.010

- 1.004

0.998

L 0.992

E

π

θ

0

1.096

1.072

1.048

1.024

1.000

🗄 0.976

0.952

且_{0.928}

π

The symmetry yields extremely good confinement of collisionless trajectories



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- Efficient implementations of the Biot-Savart law and other magnetic field representations, including derivatives.
- Tools for parallelized finite-difference gradient calculations.

The design of **simsopt** is guided by several principles:

- Thorough unit testing, regression testing, and continuous integration.
- Extensibility. It should be possible to add new codes and terms to the objective function without editing modules that already work, i.e. the open-closed principle. This is because any edits to working code can potentially introduce bugs.
- Modularity: Physics modules that are not needed for your optimization problem do not need to be installed. For instance, to optimize SPEC equilibria, the VMEC module need not be installed.
- Flexibility: The components used to define an objective function can be re-used for applications other than standard optimization. For instance, a simsopt objective function is a standard python function that can be plotted, passed to optimization packages outside of simsopt, etc.

simsopt is fully open-source, and anyone is welcome to use it, make suggestions, and contribute.



Previous quasisymmetric configurations (s=0.5)



Previous quasisymmetric configurations (s=1)



B along a field line for new QA



|B| along a field line for new QH



|B| along a field line for new QA with magnetic well



SPEC confirms the new QA/QH configurations have good surfaces



Good flux surface exist with coils



Overview

- We'd like to minimize islands/chaos if they exist.
- But, many stellarator codes and objective functions assume nested surfaces, & build on the VMEC 3D MHD equilibrium code [1].
- Idea:
 - Compute two B representations at each iteration: one assuming surfaces (VMEC) and one not (SPEC [2]).
 - Include both island width (from SPEC) and surface-based quantities (from VMEC) in the objective function.
 - Measure island width using Greene's residue [3,4]

[1] Hirshman & Whitson, *Phys. Fluids* (1993)
 [3] Greene, *J. Math. Phys.* (1979)
 [2] Hudson, Dewar, et al, *Phys. Plasmas* (2012)
 [4] Hanson & Cary, *Phys. Fluids* (1984)

Example: Start with a configuration that has islands



Simsopt driver script applied:

SPEC told to use the same boundary surface object as VMEC.

```
mpi = MpiPartition()
vmec = Vmec("input.nfp2 QA", mpi)
surf = vmec.boundary
spec = Spec("nfp2 QA.sp", mpi)
spec.boundary = surf
 # Define parameter space:
surf.fix all()
surf.fixed range(mmin=0, mmax=3,
                 nmin=-3, nmax=3, fixed=False)
surf.fix("rc(0,0)") # Major radius
# Configure quasisymmetry objective:
qs = Quasisymmetry(Boozer(vmec),
                   0.5, # Radius s to target
                   1, 0) # (M, N) you want in |B|
```

```
# Specify resonant iota = p / q
p = -2; q = 5
residue1 = Residue(spec, p, q)
residue2 = Residue(spec, p, q, theta=np.pi)
```

```
# Define objective function
```

least_squares_mpi_solve(prob, mpi, grad=True)

Objective function includes both quasisymmetry from VMEC and residues from SPEC.

The optimization eliminates the islands



Quasisymmetry is simultaneously improved during the optimization



Expansion about the magnetic axis reduces 3D PDE -> 1D ODEs

