

# Variational Numerical Methods in Geometric PDE

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# Preserving conservation laws

- Many physical systems have conserved quantities.
  - energy, angular momentum, electric charge

Figure: Rigid body dynamics (International Space Station)

- There is no guarantee that these conservation laws will continue to hold when we numerically simulate the system.
  - energy gain or loss (numerical dissipation)
- Goal: create numerical methods that preserve conservation laws.

# Toy example: the harmonic oscillator

Figure: A simple harmonic oscillator. Video credit: Wikipedia

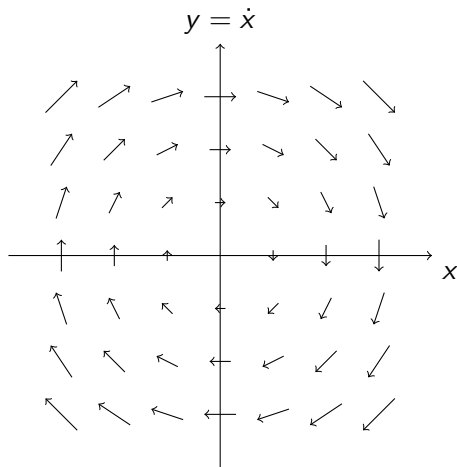
## Equations of Motion

$$\ddot{x} = -x.$$

## Conservation of energy

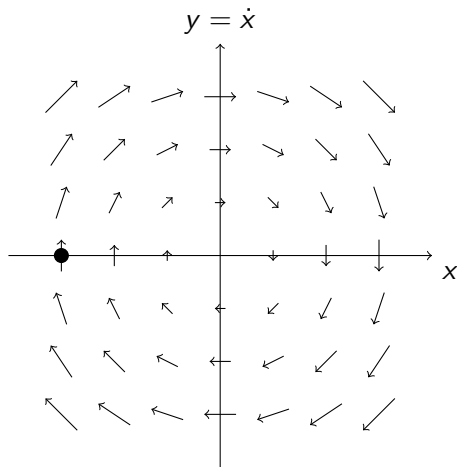
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# The harmonic oscillator: numerical conservation



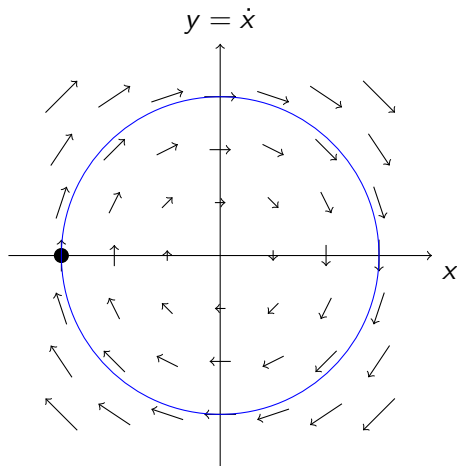
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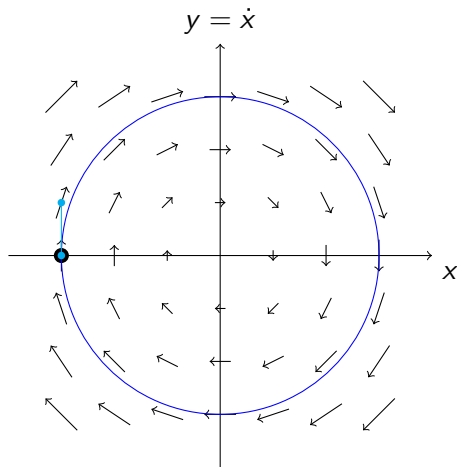
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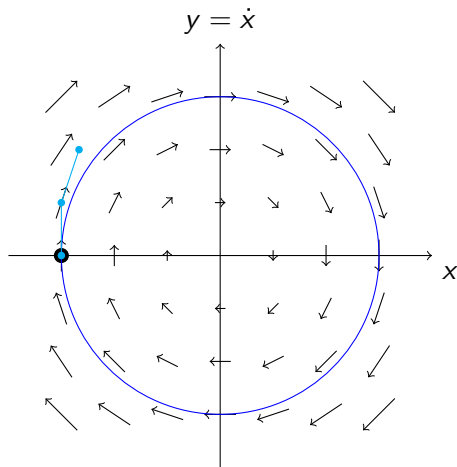
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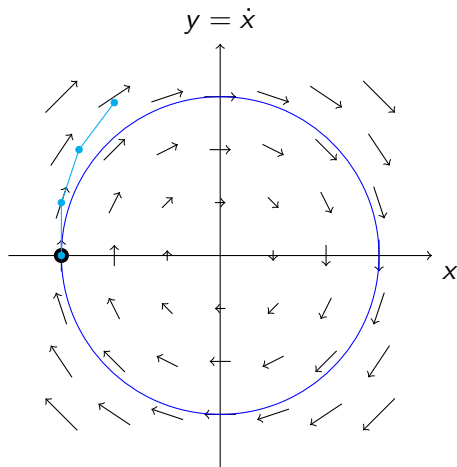
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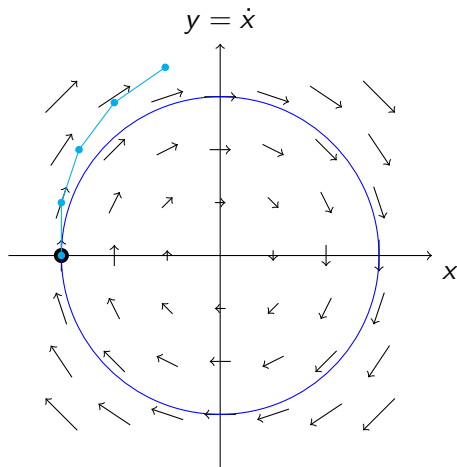


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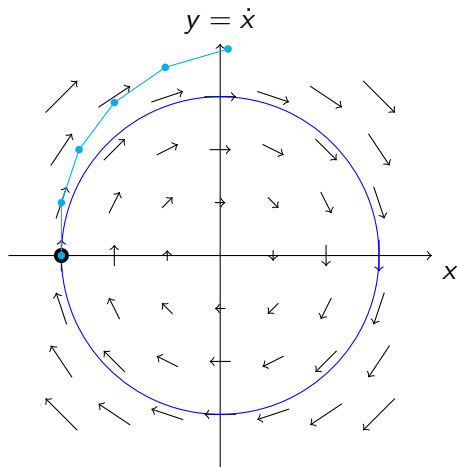
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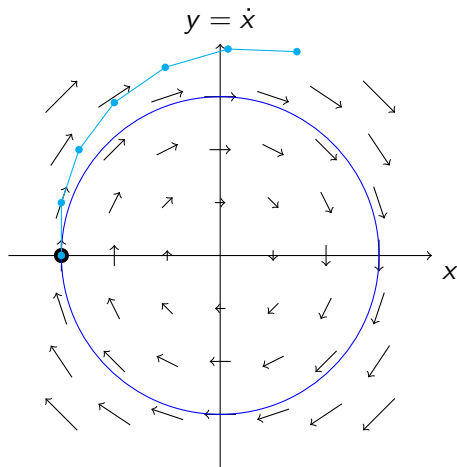
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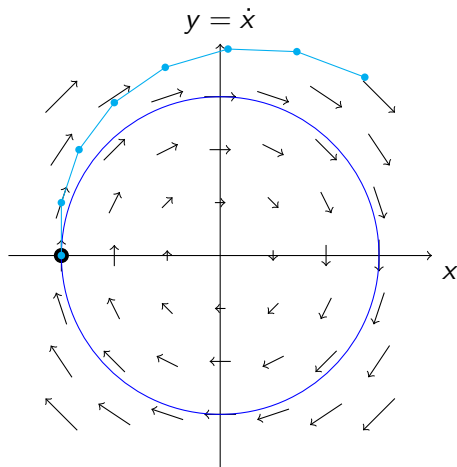
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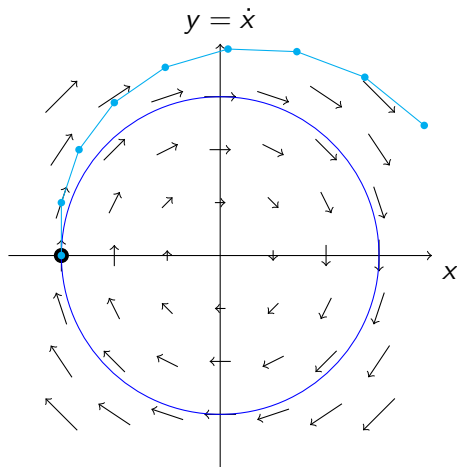
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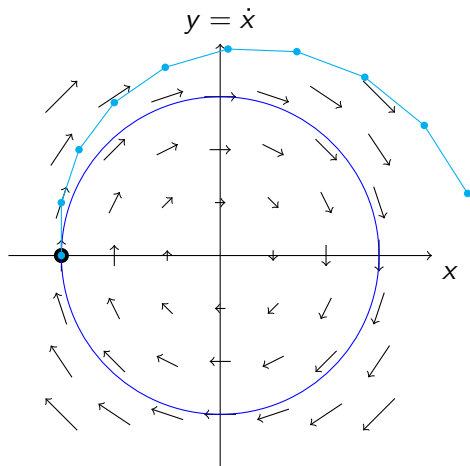
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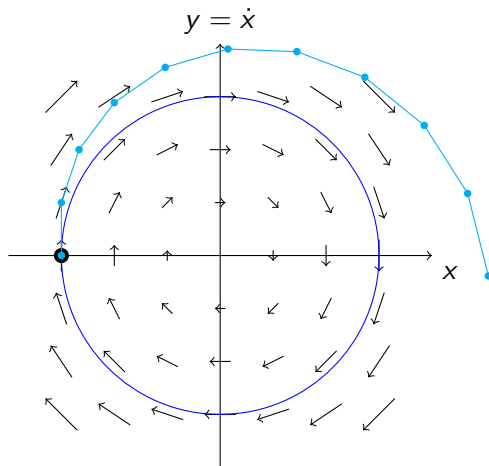
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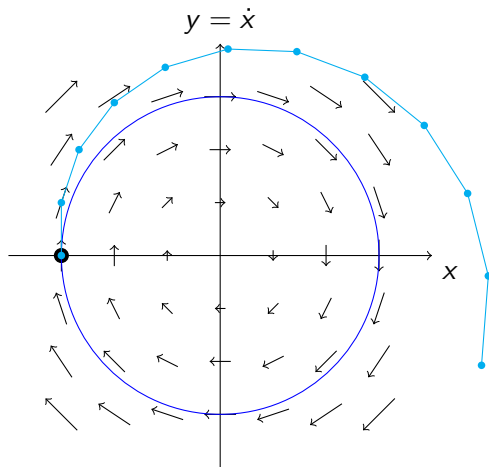
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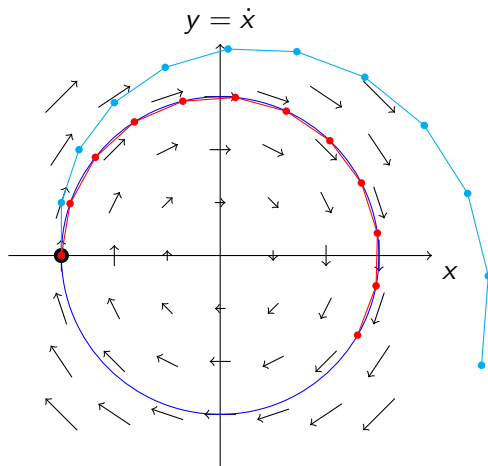


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- The critical point  $q$  of  $\mathfrak{S}$  is a solution to  $\ddot{q} = 0$ .



## Example

Geodesics in  $(M, g)$  are critical points  $q: [0, T] \rightarrow M$  of

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Harmonic oscillator trajectories  $\ddot{x} = -x$  are critical points  $x: [0, T] \rightarrow \mathbb{R}$  of

$$\mathfrak{S}(x) = \int_0^T \frac{1}{2} (|\dot{x}|^2 - |x|^2)$$

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- See Marsden and West, *Discrete Mechanics and Variational Integrators*, 2001.

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## Standard PDE formulation

Given  $f: \Omega \rightarrow \mathbb{R}$ , seek a solution  $v$  to

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- converts an infinite-dimensional variational problem to a finite-dimensional variational problem.
- approximates critical functions  $v$  with critical functions  $v_h$  coming from a finite-dimensional space.

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  - The bigger  $V_h$  is, the better our approximation.

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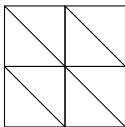


Figure: A triangulation of a square domain.

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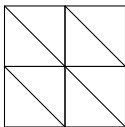


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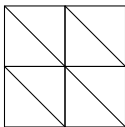


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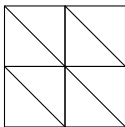


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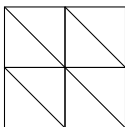


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- The Galerkin method gives us the  $v_h \in V_h$  that is the “best” approximation of the true solution.

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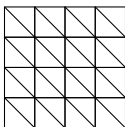


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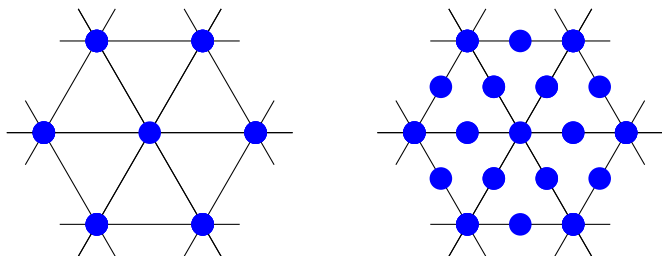
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- The Galerkin method gives us the  $v_h \in V_h$  that is the “best” approximation of the true solution.
  - By refining the triangulation, we get a larger  $V_h$  and a better approximation.

# The finite element method: degrees of freedom

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**Figure:** Degrees of freedom (blue) of piecewise linear functions (left) and piecewise quadratic functions (right).

- Specifying a value at each degree of freedom
  - uniquely determines the function on each triangle, and
  - enforces continuity between adjacent triangles.

# The finite element method for vector fields

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Duality in finite element exterior calculus and the Hodge star operator on the sphere. In preparation, 2019.



# An alternative: hybrid methods

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- 
- See (Brezzi and Fortin, 1991).

# (optional slide) Hybrid methods for Poisson's problem

## Variational formulation

Instead of  $E(v_h) = \int_{\Omega} \left( \frac{1}{2} \|\nabla v_h\|^2 - f v_h \right)$ , we have

$$E_h(v_h, \hat{p}_h) = \sum_{K \in \mathcal{T}_h} \int_K \left( \frac{1}{2} \|\nabla v_h\|^2 - f v_h \right) - \sum_{K \in \mathcal{T}_h} \int_{\partial K} (\hat{p}_h \cdot n) v_h.$$

## Weak formulation

- For all  $K \in \mathcal{T}_h$ ,  $w_h \in V_h$ ,

$$\int_K (\langle \nabla v_h, \nabla w_h \rangle - f w_h) - \int_{\partial K} (\hat{p}_h \cdot n) w_h = 0$$

- Weakly enforces  $-\Delta v_h = f$  on  $K$  and  $\hat{p}_h \cdot n = \nabla v_h \cdot n$  on  $\partial K$ .
- For all  $\hat{q}_h \in \hat{P}_h$ ,

$$\sum_{K \in \mathcal{T}_h} \int_{\partial K} (\hat{q}_h \cdot n) v_h = 0 \text{ for all } \hat{q}_h \in \hat{P}_h.$$

- Weakly enforces continuity of  $v_h$ .





# Conservation of charge in numerical methods for Maxwell's equations



Yakov Berchenko-Kogan and Ari Stern.

Constraint-preserving hybrid finite element methods for Maxwell's equations.

In preparation, 2019.



Yakov Berchenko-Kogan and Ari Stern.

Constraint-preserving hybrid finite element methods for the Yang–Mills equations.

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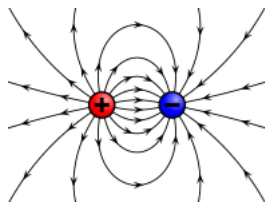
- $\text{div } E$  is a conserved quantity.

$$\frac{d}{dt}(\text{div } E) = \text{div } \dot{E} = \text{div } \text{curl } B = 0.$$

- $\text{div } E$  represents the **charge density**, denoted  $\rho$ , so this conservation law is the **conservation of charge**.



# Maxwell's equations: examples



**Figure:** Stationary and dynamic solutions to Maxwell's equations. Image credit: Wikipedia. Video credit: Electrical Exclusive.

# Maxwell's equations: the vector potential

An equivalent formulation of Maxwell's equations

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Set

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- $\ddot{A} = -\operatorname{curl} \operatorname{curl} A$  implies  $\dot{E} = \operatorname{curl} B$ .



# Maxwell's equations: numerical charge conservation

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  - Weak charge conservation.
- Hybrid method (BK, Stern, 2019).
  - Strong charge conservation.
  - Improved rate of convergence.

# The Galerkin method for Maxwell's equations (Nédélec)

## Weak formulation

$\ddot{A} = -\text{curl curl } A$  is equivalent to

$$\int_{\Omega} \langle \ddot{A}, A' \rangle = - \int_{\Omega} \langle \text{curl } A, \text{curl } A' \rangle$$

for all vector fields  $A'$  whose tangential components vanish on  $\partial\Omega$ .

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for  $\ddot{A}_h \in V_h$ .

- We now have **finite** system of second-order ODEs.



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# Hybrid methods for Maxwell's equations (BK, Stern)

Joint work with Ari Stern.

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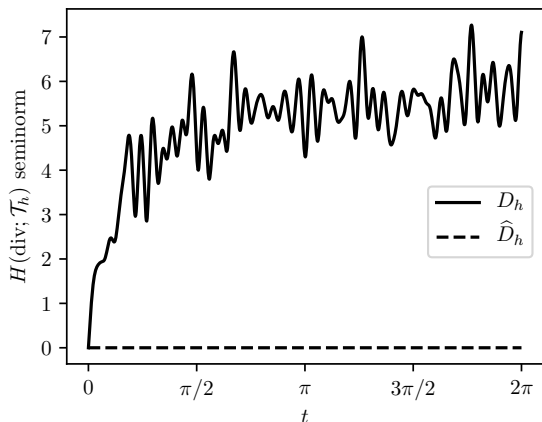
*Solutions to our hybrid formulation of Maxwell's equations satisfy*

$$\frac{d}{dt} \operatorname{div} \hat{E}_h = 0.$$

*That is, we have a strong charge conservation law for our numerical method.*



# Hybrid methods for Maxwell's equations (BK, Stern)



**Figure:** Total charge using  $E_h$  (Nédélec, solid line) vs.  $\hat{E}_h$  (our method, dashed line), simulating on a cube domain.

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- See (Christiansen and Winther, 2006).



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Yakov Berchenko-Kogan.

The entropy of the Angenent torus is approximately 1.85122.

*Journal of Experimental Mathematics*, accepted for publication, 2019.

<http://arxiv.org/abs/1808.08163>.

# Curve shortening flow

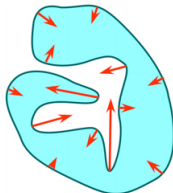


Figure: Curve shortening flow. Image credit: Treibergs. Video credit: Angenent.



# Mean curvature flow

Figure: Mean curvature flow. Video credit: Kovács.

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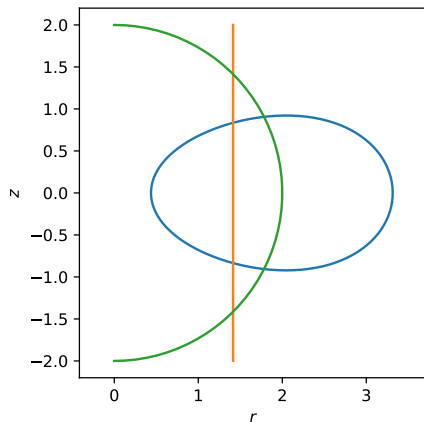
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  - Many others (Kapouleas, Kleene, Møller, 2011).

# Rotationally symmetric self-shrinkers



**Figure:** Cross-sections of three self-shrinkers: the sphere (green), the cylinder (orange), and the Angenent torus (blue).

# A variational formulation for self-shrinkers

## Theorem (Huisken, 1990)

*A hypersurface  $\Sigma \subset \mathbb{R}^{n+1}$  is a self-shrinker that becomes extinct at the origin after one unit of time if and only if it is a critical point of the weighted area functional called the **F-functional**.*

$$F(\Sigma) = (4\pi)^{-n/2} \int_{\Sigma} e^{-|x|^2/4} d\text{Area}.$$

# Entropy of self-shrinkers

The critical value of the  $F$ -functional, called the **entropy** of the self-shrinker, is helpful in understanding what kinds of singularities can occur.

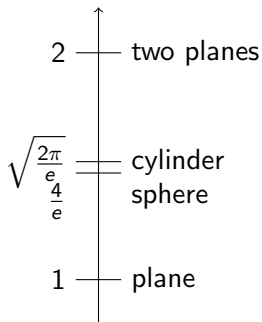


Figure: Entropies of self-shrinking surfaces

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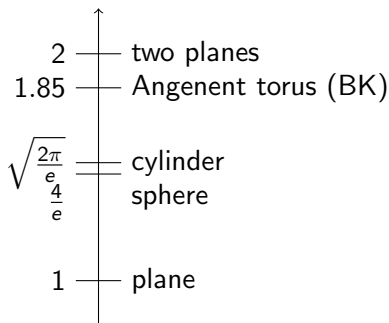


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# Variational formulations for rotationally-symmetric self-shrinkers

A rotationally symmetric surface  $\Sigma \subset \mathbb{R}^3$  with cross-sectional curve  $q$  is a self-shrinker if:

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The cross-section of the Angenent torus is a closed curve  $q$  in the  $(r, z)$ -plane that is a critical point of

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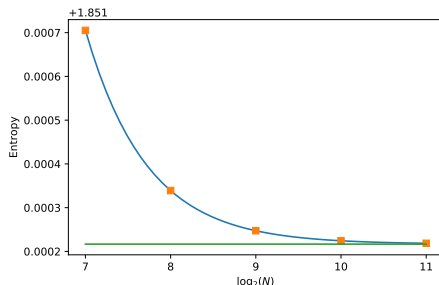
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  - This discrete curve approximates the cross-section of the Angenent torus.

# Numerical estimates of the entropy of the Angenent torus



**Figure:** The entropy of the Angenent torus as computed using 128, 256, 512, 1024, and 2048 points. The values (orange) appear to lie on an exponential curve (blue) converging to 1.8512167 (green).

The convergence rate suggests that the computed value is within  $2 \times 10^{-6}$  of the true value.

## The index of the Angenent torus

- Critical points of a functional have an **index**.
  - How many independent perturbations decrease the value of the functional?
  - The number of negative eigenvalues of the Hessian.
- The index of the Angenent torus is at least 3 (Liu, 2016) but is otherwise unknown even conjecturally.
  - Computing the index of the Angenent torus would give insight into how “generic” Angenent torus singularities are.
- We can easily compute the Hessian of  $\mathfrak{S}_d$ .

## Higher dimensions

- Angenent described a self-shrinking doughnut  $S^1 \times S^{n-1}$  in any dimension.
- My code can compute its entropy.
- What is the limiting behavior as  $n$  becomes large?



# Thank you