

# Random entanglements

## Winding of planar Brownian motions

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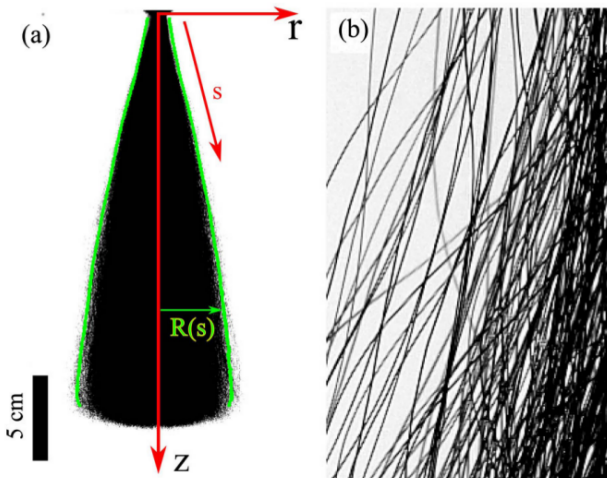
Supported by NSF grant CMMI-1233935



A dense, chaotic tangle of multi-colored wires and cables, illustrating complex entanglements. The wires are of various colors including black, white, grey, blue, red, and yellow, and are intertwined in a complex, non-linear fashion. The background is a dark, textured surface, possibly a wall or a large piece of equipment, which makes the bright colors of the wires stand out. The overall appearance is one of extreme complexity and disorder.

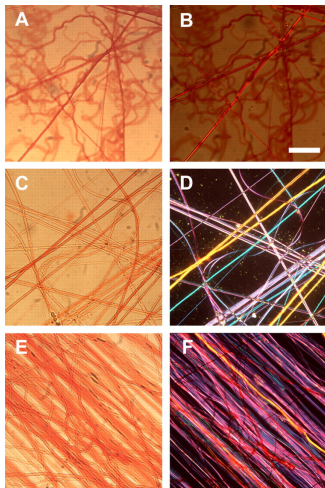
**Complex entanglements are everywhere**

# Tangled hair



[Goldstein, R. E., Warren, P. B., & Ball, R. C. (2012). *Phys. Rev. Lett.* **108**, 078101]

# Tangled hagfish slime



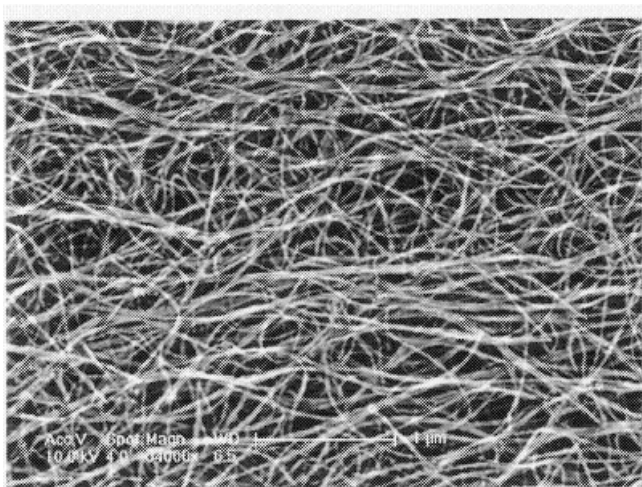
Slime secreted by **hagfish** is made of microfibers.

The quality of entanglement determines the material properties (**rheology**) of the slime.

[Fudge, D. S., Levy, N., Chiu, S., & Gosline, J. M. (2005). *J. Exp. Biol.* **208**, 4613–4625]

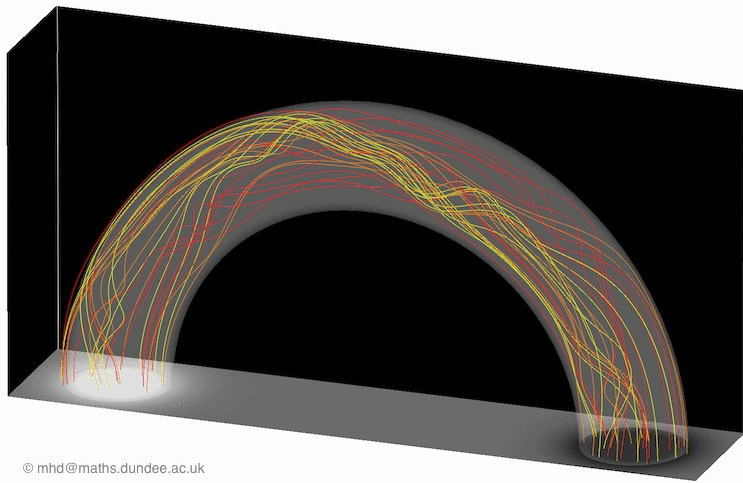
[Chaudhary, G., Ewoldt, R., & Thiffeault, J.-L. (2019). *J. Roy. Soc. Interface*, **16** (150), 20180710]

# Tangled carbon nanotubes



[Source: <http://www.ineffableisland.com/2010/04/carbon-nanotubes-used-to-make-smaller.html>]

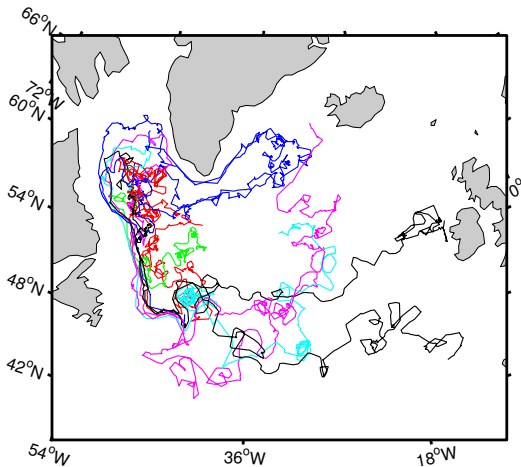
# Tangled magnetic fields



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[Source: <http://www.maths.dundee.ac.uk/mhd/>]

# Tangled oceanic float trajectories

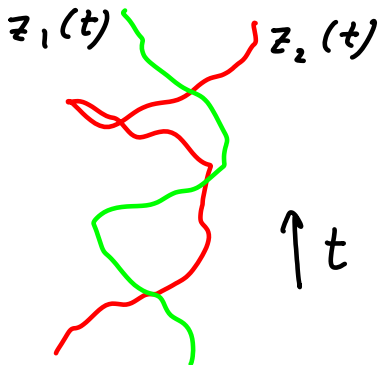
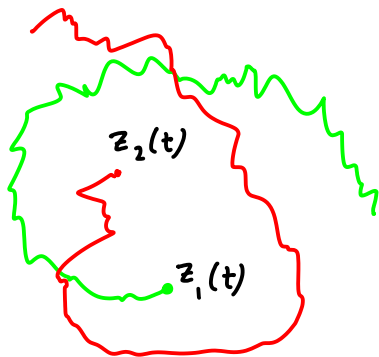


[Source: WOCE subsurface float data assembly center, <http://wfdac.whoi.edu>,  
Thiffeault, J.-L. (2010). *Chaos*, **20**, 017516]

# The simplest tangling problem



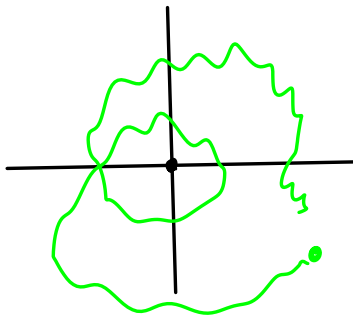
Consider two Brownian motions on the complex plane, each with diffusion constant  $D$ :



Viewed as a spacetime plot, these form a 'braid' of two strands.



Take the vector  $Z(t) = Z_1(t) - Z_2(t)$ , which behaves like a Brownian particle of diffusivity  $2D$  ( $\rightarrow D$ ):



Define  $\Theta \in (-\infty, \infty)$  to be the **total winding angle** of  $Z(t)$  around the origin.



Spitzer (1958) found the time-asymptotic distribution of  $\theta$  to be **Cauchy**:

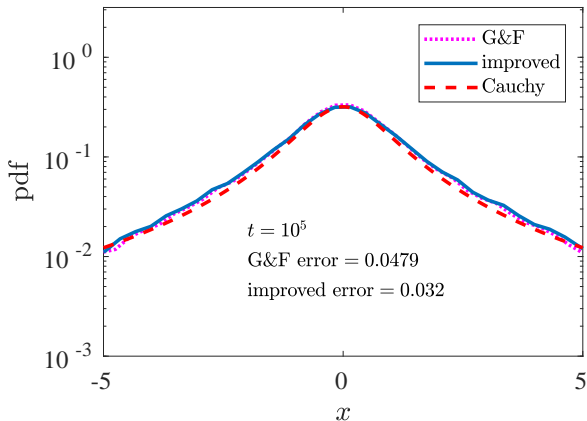
$$\frac{\Theta(t)}{\log(2\sqrt{Dt}/r_0)} \xrightarrow{d} X, \quad p_X(x) = \frac{1}{\pi} \frac{1}{1+x^2}.$$

where  $r_0 = |Z(0)|$ .

The normalized variable is  $X \sim \Theta(t)/\log t$ .

Note that a Cauchy distribution is a bit strange: the variance is infinite, so **large windings are highly probable!**

[Spitzer, F. (1958). *Trans. Amer. Math. Soc.* **87**, 187–197]



The normalized variable is  $x = \theta / \log(2\sqrt{Dt}/r_0)$ .

Some care is needed for these simulations (rescale time near the origin)

[Wen, H. & Thiffeault, J.-L. (2019). *Philos. Trans. Royal Soc. A*, **377**, 20180347]

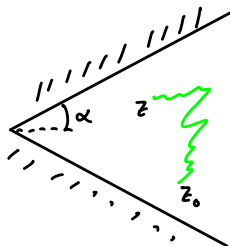
# Winding angle distribution: derivation



The probability distribution  $P(z, t)$  of the Brownian process satisfies the Fokker–Planck PDE (heat equation):

$$\frac{\partial P}{\partial t} = D\Delta P, \quad P(z, 0) = \delta(z - z_0).$$

Consider the solution in a **wedge** of half-angle  $\alpha$ :



(Reflecting boundary condition at the walls.)

## Winding angle distribution: derivation (cont'd)



In polar form, Fokker–Planck PDE for  $P(r, \theta, t)$ :

$$\frac{\partial P}{\partial t} = D \left( \frac{1}{r} \frac{\partial}{\partial r} \left( r \frac{\partial P}{\partial r} \right) + \frac{1}{r^2} \frac{\partial^2 P}{\partial \theta^2} \right), \quad \partial_{\theta} P(r, \pm\alpha, t) = 0.$$

The solution is a standard eigenfunction expansion, but then **take the wedge angle  $\alpha$  to  $\infty$  (!)**:

$$P(z, t) = \frac{1}{2\pi Dt} e^{-(r^2+r_0^2)/4Dt} \int_0^{\infty} \cos \nu(\theta - \theta_0) I_{\nu} \left( \frac{r r_0}{2Dt} \right) d\nu$$

where  $I_{\nu}$  is a **modified Bessel function of the first kind**.

For large  $t$  this **recovers the Cauchy distribution** for the angle.

**Key point:** by allowing the wedge angle to infinity, we are using **Riemann sheets** to keep track of the winding angle.



So Cauchy distribution is a bit **pathological**: **infinite variance**. This is a symptom of the point approximation for the winding center.

Instead of winding around a point, wind around a **disk of radius  $a$** .

The calculation is quite similar, but now we get convergence to a very different distribution:

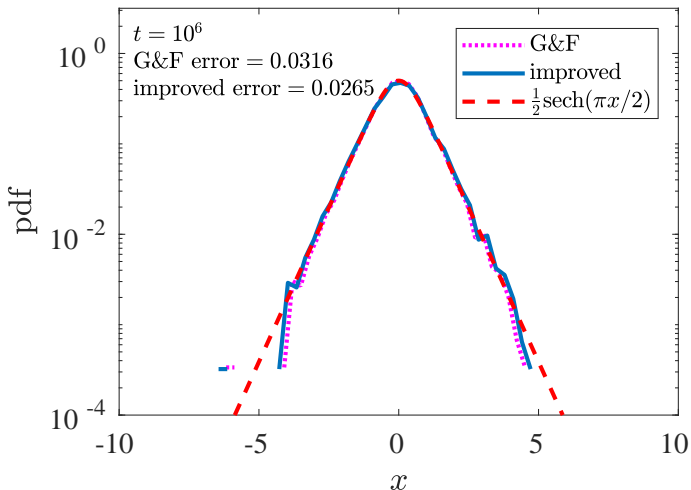
$$\frac{\Theta(t)}{\log(2\sqrt{Dt}/a)} \xrightarrow{d} X, \quad p_X(x) = \frac{1}{2} \operatorname{sech}(\pi x/2).$$

This has **exponential tails**: all the moments exist.

[Bélisle, C. (1989). *Ann. Prob.* **17** (4), 1377–1402

Grosberg, A. & Frisch, H. (2003). *J. Phys. A*, **36** (34), 8955–8981

Wen, H. & Thiffeault, J.-L. (2019). *Philos. Trans. Royal Soc. A*, **377**, 20180347]



The normalized variable is  $x = \theta / \log(2\sqrt{Dt}/a)$ .

[Wen, H. & Thiffeault, J.-L. (2019). *Philos. Trans. Royal Soc. A*, **377**, 20180347]

## Let's add drift!



So far the planar motion was pure Brownian motion. One natural extension is to add a **tangential drift**, which leads to the PDE

$$\frac{\partial p}{\partial t} + \Omega(r, t) \frac{\partial p}{\partial \theta} = D \Delta p.$$

In general, we cannot solve this equation analytically or even asymptotically in time.

Constant  $\Omega$  is uninteresting: it simply “shifts” the pdf in time by  $\Omega t$ .

Fortunately, a tractable case is the **point vortex** of fluid dynamics:

$$\Omega(r) = \beta/r^2.$$

The flow **promotes winding**, but falls off if the particle wanders too far.



The reason why the point vortex allows **analytical treatment** is that the eigenvalue problem arising from the boundary value problem is

$$\rho'' + \frac{1}{r}\rho' + \left(\lambda^2 - \frac{k_\mu^2}{r^2}\right)\rho = 0, \quad k_\mu = \sqrt{\mu^2 + i\beta\mu}$$

which is still a Bessel equation, though the drift makes the parameter  $k_\mu$  **complex**. The asymptotic analysis is thus considerably more challenging.

I spare you the details, which are in

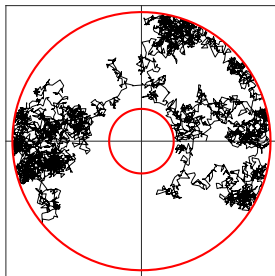
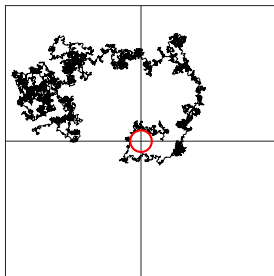
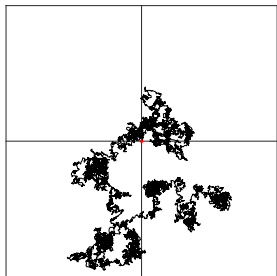
[Wen, H. & Thiffeault, J.-L. (2019). *Philos. Trans. Royal Soc. A*, **377**, 20180347].

Let's examine the limiting distributions in a few cases.

# Winding with drift: The three cases

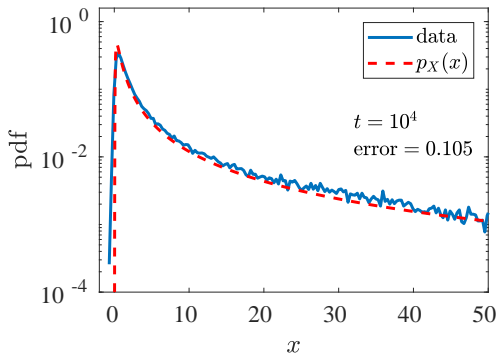


Point, disk, and annulus:



Notice that the particle now winds preferentially counterclockwise, because of the drift  $\Omega = \beta/r^2$ ,  $\beta > 0$ .

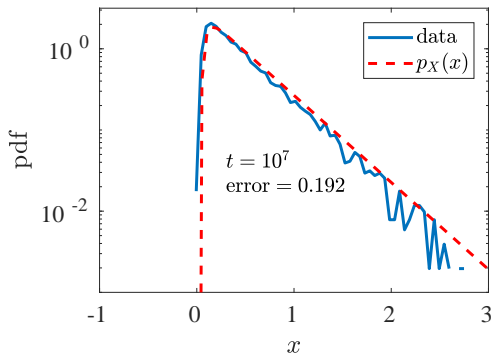
# Winding with drift around a point



$X^{-1}$  converges to a  $\text{Gamma}(\frac{1}{2}, \frac{1}{2})$  distribution:

$$\frac{8\Theta(t)}{\beta \log^2(4t/r_0^2)} \xrightarrow{d} X, \quad p_X(x) = \frac{1}{\sqrt{2\pi}} x^{-3/2} e^{-1/2x} \chi_{(x>0)}.$$

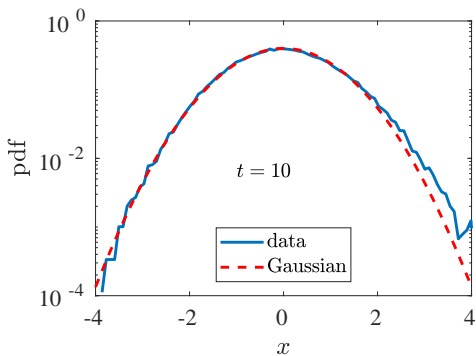
$\chi$  is the indicator function: angle is **non-negative**.



Now the asymptotic distribution involves a **second elliptic theta function**:

$$\frac{4\Theta(t)}{\beta \log^2(4t/a^2)} \xrightarrow{d} X, \quad p_X(x) = -\frac{\pi}{2} \vartheta_2' \left( \frac{\pi}{2}, e^{-\pi^2 x} \right) \chi_{(x>0)}.$$

Angle is again **non-negative**.



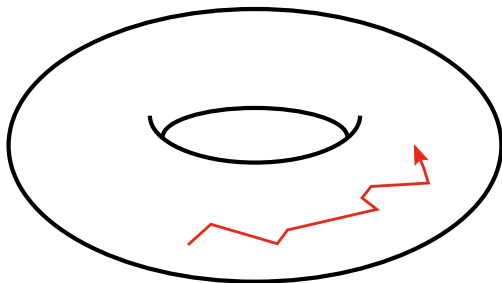
The bounded region is **strongly recurrent** and leads to a **Gaussian form**:

$$\frac{\Theta(t) - A(t)\beta}{\sqrt{2A(t)}} \xrightarrow{d} N(0, 1), \quad A(t) = \frac{2t}{b^2 - a^2} \log(b/a).$$

Now the mean angle increases linearly with time.

The Gaussian form is generic in bounded regions [Geng, X. & Iyer, G. (2018)]

A Brownian motion on a torus can wind around the **two periodic directions**:



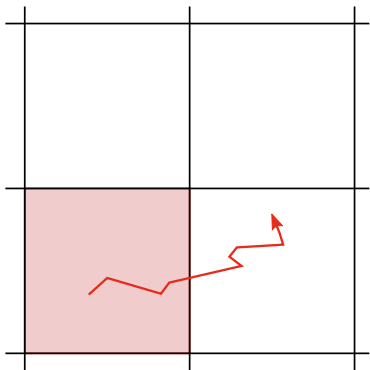
What is the **asymptotic distribution of windings**?

Mathematically, we are asking what is the **homology class** of the motion?

# Torus: universal cover



We pass to the **universal cover** of the torus, which is the plane:



The universal cover records the windings as paths on the plane. The original 'copy' is called the **fundamental domain**.

On the plane the probability distribution is the usual **Gaussian heat kernel**:

$$P(x, y, t) = \frac{1}{4\pi Dt} e^{-(x^2+y^2)/4Dt}$$

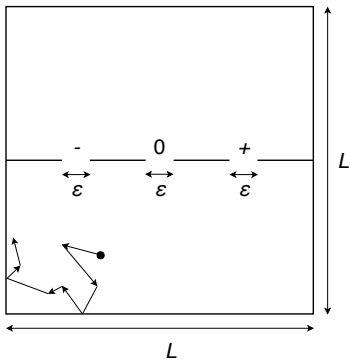
So here  $m = \lfloor x \rfloor$  and  $n = \lfloor y \rfloor$  will give the **homology class**: the number of windings of the walk in each direction.

We can think of the motion as **entangling with the space itself**.

# The $N$ -slit problem (w. G. Bonner and B. Valko)



Brownian motion in a square with  $N = 3$  narrow "slits" of width  $\varepsilon$ :



Similar to a particle winding around **two** obstacles.

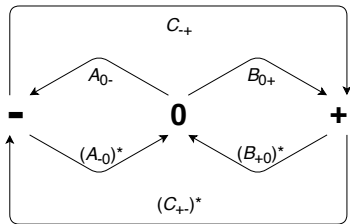
Problem is now **non-Abelian**: order matters.  
 $\pi_1(D_N)$  instead of homology.

**Angle** is no longer as relevant as a measure of entanglement.

**Narrow slit** approximation is crucial: the particle hits a slit uniformly, with expected time  $\sim (L^2/D) \log \varepsilon^{-1}$  between hits.



Write the history of the Brownian motion as a sequence of symbols.



These are **groupoid** elements: not all multiplications make sense.

$$A_{0-} C_{-+} (B_{+0})^* (A_{0-})^* \dots$$

The  $*$  denotes the lower-half plane.

Whenever the particle returns to slit 0 we have an element of  $\pi_1(D_N)$ .

The difficulty lies in keeping track of **cancellations**.

Each return corresponds to **one** or **two** letters:  $C_{-+} = A_{-0} B_{0+}$ .

# An explicit formula for the growth



The key quantity is the growth of **reduced word length** in the letters.  
Related to **growth in regular languages**.

Key is derive a certain **generating function** for last passage times for  $N$  slits:

$$R(\lambda) = \frac{1}{2(N-2)\lambda} \left( 2(N-1)^2(N-2) - (N-1)\lambda - \sqrt{D(N, \lambda)} \right)$$

with

$$D(N, \lambda) = (N-1) \left( (N-1)(\lambda - 2N(N-3) - 4)^2 - 4(N-2)^2\lambda^2 \right)$$

The growth is then  $R(1)/R'(1)$ .

[Gajrat, A., Malyshev, V. A., & Menshikov, M. V. (1993). Research Report RR-2202 INRIA

Gilch, L. A. (2008). In: *Proceedings to 5th Colloquium on Mathematics and Computer Science* pp. 2544–2560,]



Many people have worked on aspects of this problem:

- [Spitzer (1958); Durrett (1982); Messulam & Yor (1982); Berger (1987); Shi (1998)] [winding of Brownian motion around a point in  \$\mathbb{R}^2\$](#) .
- [Berger & Roberts (1988); Bélisle (1989); Bélisle & Faraway (1991); Rudnick & Hu (1987)] [winding of random walk around a point](#).
- [Drossel & Kardar (1996); Grosberg & Frisch (2003)] [finite obstacle, closed domain](#).
- [Itô & McKean (1974); McKean (1969); Lyons & McKean (1984)] [doubly-punctured plane](#).
- [McKean & Sullivan (1984)] [three-punctured sphere](#).
- [Pitman & Yor (1986, 1989)] [more points](#).
- [Watanabe (2000)] [Riemann surfaces](#).
- [Nechaev (1988)] [lattice of obstacles](#).
- [Nechaev (1996); Revuz & Yor (1999)] [comprehensive books](#).



- Entanglement at confluence of **dynamics**, **probability**, **topology**, and **combinatorics**.
- Instead of Brownian motion, can use orbits from a **dynamical system**. This yields dynamical information.
- More generally, study random processes on **configuration spaces** of sets of points (also finite size objects).
- Other applications: **Crowd dynamics** (Ali, 2013), **granular media** (Puckett *et al.*, 2012).
- With **Michael Allshouse**: develop tools for analyzing orbit data from this topological viewpoint (Allshouse & Thiffeault, 2012).
- With **Tom Peacock**, **Marko Budišić**, and **Margaux Filippi**: apply to orbits in a fluid dynamics experiments.

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