



# Simplicity and Swarming in Motion of Pelagic Fish

## *Discrete and Time-Continuous Models*

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- The structure can be both simple and exceedingly complex
- Model of a primitive organism?

# The Discrete Model

The model was introduced by Vicsek, Czirók, Ben-Jacob, Cohen, and Shochet in 1995 [7, 2, 3, 4, 8]

$$\begin{pmatrix} x_i(t + \Delta t) \\ y_i(t + \Delta t) \end{pmatrix} = \begin{pmatrix} x_i(t) \\ y_i(t) \end{pmatrix} + v_i(t) \begin{pmatrix} \cos(\theta_i(t)) \\ \sin(\theta_i(t)) \end{pmatrix} \Delta t$$

# Alignment and Adjustment

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Direction Angle

$$\begin{pmatrix} \cos(\theta_i(t + \Delta t)) \\ \sin(\theta_i(t + \Delta t)) \end{pmatrix} = \frac{1}{n} \sum_{j=1}^n \begin{pmatrix} \cos(\theta_j(t)) \\ \sin(\theta_j(t)) \end{pmatrix}$$

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Speed

$$v_i(t + \Delta t) = \frac{1}{n} \sum_{j=1}^n v_j(t)$$

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Introducing complex coordinates

$$z_k = x_k + iy_k$$

$$\dot{z}_k = v_k e^{i\theta_k}$$



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In polar coordinates

$$z_k = r_k e^{i\theta_k}$$

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$$\dot{r}_k = \frac{v}{n} \sum_{j=1}^n \cos(\theta_k - \theta_j)$$

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We have made the choice

$$v = \lim_{n \rightarrow \infty} \frac{1}{n} \sum_{k=1}^n v_k$$

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1-d center manifold. Solutions are *stable* except for 1-d linear motion. Also H-stable



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1-d center manifold, 1-d unstable manifold  
corresponding to circular motion. *Stable*

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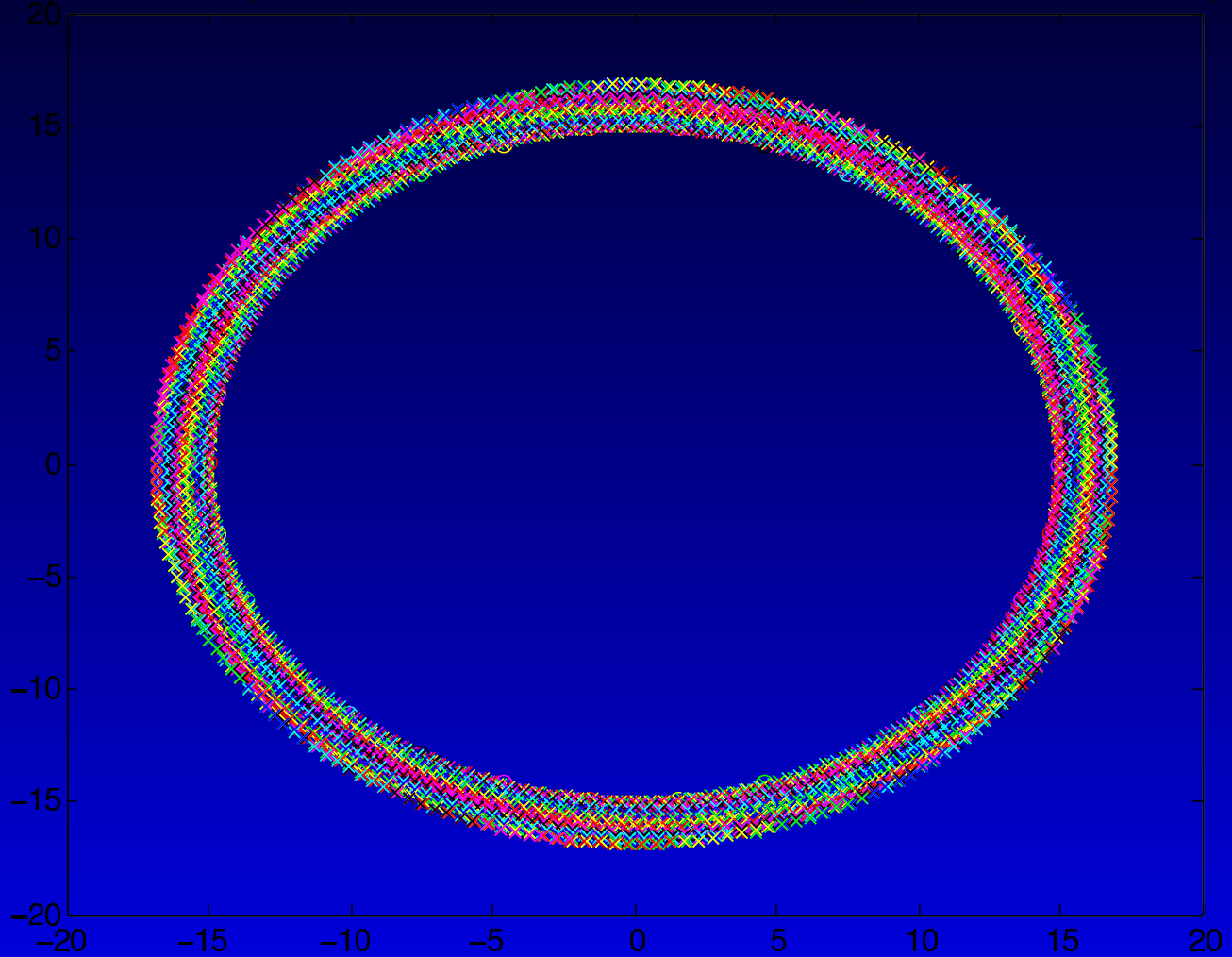
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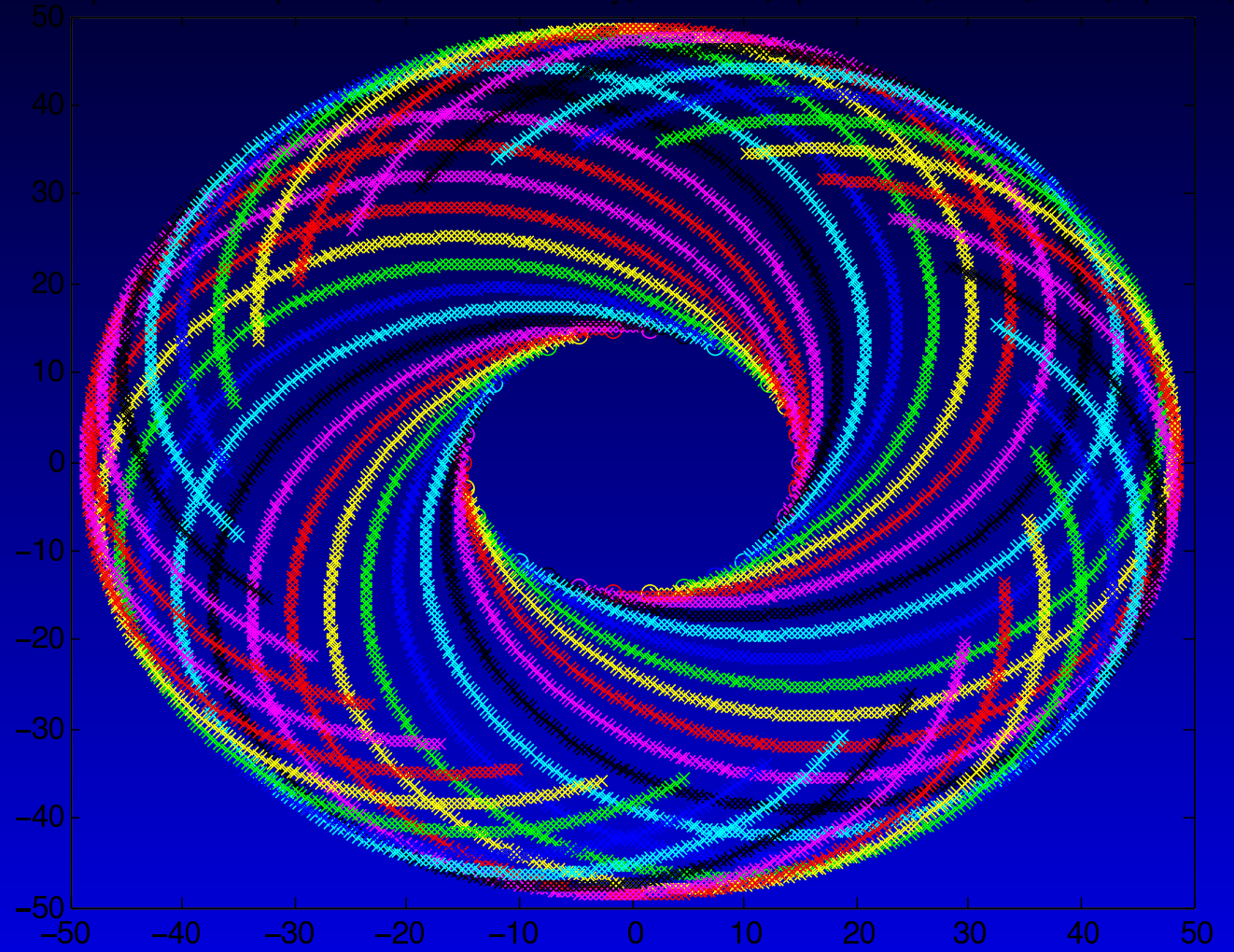
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- Other periodic orbits consists of pairs of fish distributed around the circle
- Incoherent oscillators,  $\omega_k/\omega_j$ ,  $j \neq k$  irrational, give a complex state as  $n \rightarrow \infty$

phiNoise = .01\*pi\*ones, 30th roots, circle of radius 15 start, epsilon =25, dt=.05, v=10, alpha=0, ite



$\phi_{\text{Noise}} = .05 * \pi * \text{ones}$ , 30th roots of unity, radius 15, epsilon=20, dt=.05, v=10, alpha=0, iter=30



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- They were modeling the migration of the capelin in the North Atlantic
- The capelin is a pelagic species that much of the larger fish, cod etc. feed on



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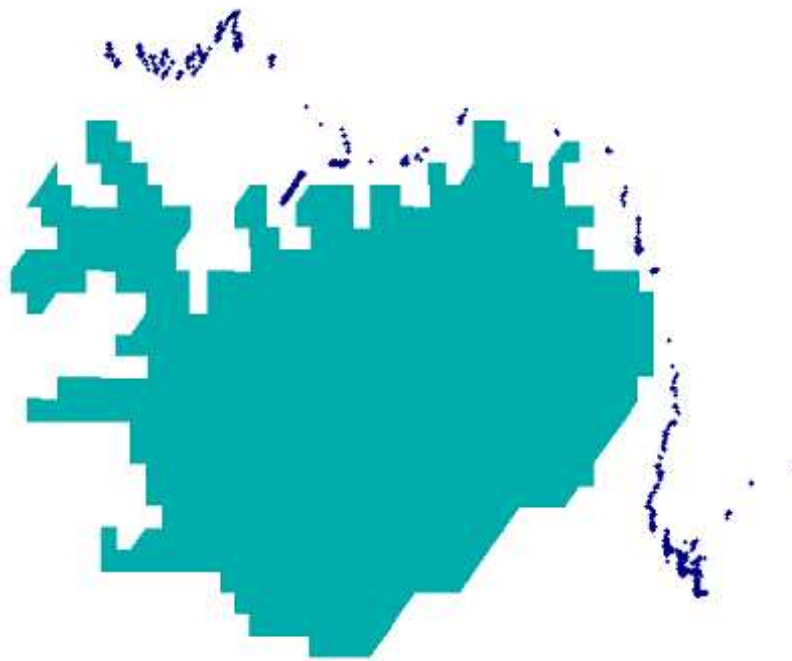
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- It migrates along the *west coast* of Iceland in the spring and returns along the *east coast* in the winter, after spawning it dies



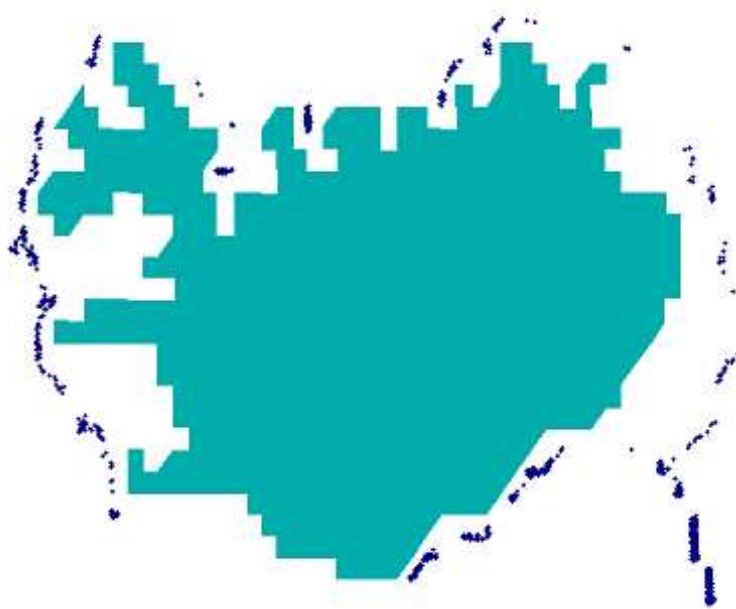
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- It migrates along the *west coast* of Iceland in the spring and returns along the *east coast* in the winter, after spawning it dies
- Is this migration entirely controlled by the environment, currents, food availability, temperature gradients and landmasses or is it genetic?



Februar  
1  
1995

Fish: 2428  
17.82



March  
1  
1995

Fish: 2428  
25.00

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- Migratory and circling solutions are easily found
- The migratory solutions consist of stable linear motion with constant speed
- The circling solutions consist of stable or unstable periodic orbits that exist for any number of fish
- Complex, incoherent, noise-driven, circling states exist as the number of fish in the school becomes large

# References

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