





Eukaryotic swimming cells are shaped by hydrodynamic constraints

Maciej Lisicki¹,[†],[‡], Marcos F. Velho Rodrigues²,[‡] and Eric Lauga²,[†]

¹Faculty of Physics, University of Warsaw, Warsaw, Pasteura 5, 02-093 Warsaw, Poland ²Department of Applied Mathematics and Theoretical Physics, University of Cambridge, Wilberforce Road, Cambridge CB3 0WA, UK

(Received 25 July 2023; revised 25 September 2023; accepted 3 October 2023)

Eukaryotic swimming cells such as spermatozoa, algae or protozoa use flagella or cilia to move in viscous fluids. The motion of their flexible appendages in the surrounding fluid induces propulsive forces that balance viscous drag on the cells and lead to a directed swimming motion. Here, we use our recently built database of cell motility (BOSO-Micro) to investigate the extent to which the shapes of eukaryotic swimming cells may be optimal from a hydrodynamic standpoint. We first examine the morphology of flexible flagella undergoing waving deformation and show that their amplitude-to-wavelength ratio is near that predicted theoretically to optimise the propulsive efficiency of active filaments. Next, we consider ciliates, for which locomotion is induced by the collective beating of short cilia covering their surface. We show that the aspect ratios of ciliates are close to that predicted to minimise the viscous drag of the cell body. Both results strongly suggest a key role played by hydrodynamic constraints, in particular viscous drag, in shaping eukaryotic swimming cells.

Key words: micro-organism dynamics, swimming/flying

1. Introduction

The cellular scale is home to a wide variety of biological swimmers, both in the prokaryote and eukaryote domains (Yates 1986). Examples that have long been studied comprise the spermatozoa of animals (including humans) (Gaffney *et al.* 2011), algae and planktonic aquatic organisms (Pedley & Kessler 1992; Guasto, Rusconi & Stocker 2012; Goldstein 2015), protozoa (Jahn & Votta 1972) and bacteria (Lauga 2016). Prokaryotic swimmers exploit the rotation of passive helical filaments to self-propel (Berg & Anderson 1973). In contrast, swimming eukaryotes employ a more complex propulsion machinery in which

flexible flagella actuated internally by molecular motors deform periodically in a wave-like motion (Bray 2000).

During recent decades, the biophysical and fluid mechanics communities have devoted considerable effort to quantify the interactions between cells and surrounding fluids (Lighthill 1975, 1976; Lauga 2020*a*). Most studies use mathematical, or computational, modelling to rationalise the dynamics of cells, from individual motion in bulk fluids to collective interactions in complex environments (Lauga & Powers 2009; Koch & Subramanian 2011; Elgeti, Winkler & Gompper 2015). These theoretical tools have in turn allowed the impact of fluid forces on shaping the geometry and kinematics of swimming cells to be explored, allowing in particular posing cellular swimming as an optimisation problem, with notable successes.

In the case of bacteria, in search of an optimal prokayotic flagellum, Purcell (1997) determined using simple arguments the shape of the most efficient helical propeller. A later theoretical study of the polymorphic forms of the flagellum commonly found in most bacteria by Spagnolie & Lauga (2011) showed that the so-called 'normal' helical form is the most efficient by some significant margin, suggesting that fluid mechanical forces may have played a role in the evolution of the flagellum. In addition to the flagellum, overall swimming efficiency is also impacted by the shape of the cell body, as first shown and optimised by Fujita & Kawai (2001) for a monotrichous bacterium. Recent work considered the impact of other biological constraints on bacterial shape (Schuech *et al.* 2019).

In eukaryotic cells, optimal propulsion strategies result from an interplay between fluid dynamics, elasticity and active driving mechanisms. In a study of over 400 mammalian species, Tam & Hosoi (2011a) discovered that spermatozoa have an optimal tail-to-head length ratio and that their most efficient swimming mode involves symmetrical, non-sinusoidal travelling waves in the tail. Such travelling waves have been shown in many contexts to lead to optimal motion in an active flagellum (Pironneau & Katz 1974, 1975; Lauga 2020b). Lighthill (1975) found the two-dimensional hydrodynamically optimal travelling-wave profile to be sawtooth-like, but the singular kinks are regularised by elastic stresses (Spagnolie & Lauga 2010) or by properly modelling the irreversible work of molecular motors within the active flagellum (Lauga & Eloy 2013). In ciliated organisms, the beating pattern of individual cilia has also been shown to be optimal for propulsion (Osterman & Vilfan 2011; Eloy & Lauga 2012). However, flagellar gaits may have local optima, suited e.g. to distinct feeding and swimming modes, as investigated by Tam & Hosoi (2011b) for biflagellated phytoplanktons. In larger organisms, multi-ciliated cells can increase their efficiency by choosing an optimal number of cilia (from hundreds to thousands) (Omori, Ito & Ishikawa 2020) and both optimal swimming and feeding have been shown to involve surface metachronal waves (Michelin & Lauga 2010, 2011).

Beyond biological systems, the question of optimality has received a lot of attention in the realm of biomimetic and engineered artificial swimmers. For example, swimming gaits and shapes maximising swimming efficiency have been determined for simple swimmers with only a few degrees of freedom (Tam & Hosoi 2007; Alouges, DeSimone & Lefebvre 2008; Golestanian & Ajdari 2008; Alouges, DeSimone & Lefebvre 2009; Nasouri, Vilfan & Golestanian 2019), two-dimensional cell shapes (Avron, Gat & Kenneth 2004; Montenegro-Johnson & Lauga 2014) and idealised kinematics of treadmilling (Leshansky *et al.* 2007) or surface slip flow driven swimmers (Vilfan 2012). Other studies have sought shapes that would minimise absolute dissipation (Nasouri, Vilfan & Golestanian 2021).

In this paper, we use data analysis to discover remarkable optimal properties of the geometry of cell shapes. We rely on our recently assembled BOSO-Micro database (Rodrigues, Lisicki & Lauga 2021): a comprehensive collection of data from the

experimental literature on cellular swimming that contains data on swimming speed and morphological characteristics of 382 unicellular organisms, including spermatozoa. Building on the data, we first demonstrate that the amplitude-to-wavelength aspect ratios of flagellated eukaryotes, including spermatozoa, are very close to the optimum predicted by hydrodynamic theory. Next, we demonstrate that the aspect ratios (length-to-width) of ciliate cell bodies are well predicted by the classical result for the shape of minimum drag force subject to a fixed-volume constraint.

2. Results

The BOSO-Micro database (Rodrigues *et al.* 2021) provides us with novel means to examine swimming and morphological relationships across species. The open-source database contains swimming and morphological data published in scientific literature to date; we refer to the original paper for all details on data-gathering. Apart from swimming speed, many past investigations also contain data on the basic morphology of organisms, such as the size and shape of the cell body, or the length and number of flagella or cilia. Note that, in the database, the measurements and characterisation of organisms have been performed under different physiological conditions and in various environments, and therefore they do not represent a uniform sample. In cases where multiple values were reported for the morphology of swimming cells, we used average values.

2.1. Propulsion of flagellated eukaryotes

First, we focus on studies providing the details of actuation in flagellated eukaryotes and spermatozoa. We assume that the waveform of their flagellar oscillations can be captured by a characteristic amplitude *h* and wavelength λ , as sketched in figure 1(*a*). The database contains 23 different species of flagellated eukaryotes and 28 different species of spermatozoa for which we found measurements of *h* and λ ; note that these values were either directly reported in each paper, or were estimated by us using experimental images, see details in Rodrigues *et al.* (2021).

For all our data, we plot in figure 1(b) the histogram of the amplitude-to-wavelength aspect ratio, h/λ . This ratio does not exceed 0.6 in the data set, with most organisms showing the value below 0.25; hence the amplitude of a flagellar beat rarely exceeds a quarter of the wavelength. For further insight, we plot the amplitude h against the wavelength λ in figure 1(c). When multiple values are inferred for the same species, we plot in figure 1(c) the average value but include error bars to reflect the variability within the data reported for each species. Square markers represent flagellated eukaryotes, which are generally smaller in size as compared with spermatozoa, marked with circles.

It is clear from the data in figure 1(c) that there is a systematic increase of flagellar amplitude with wavelength. To rationalise and interpret these results, we performed a least-squares linear fit of the h/λ = constant relationship to the data. The solid line shows the result of fitting, with the 95 % confidence interval shaded in grey. For comparison with theoretical predictions, we use the work of Lauga & Eloy (2013) who computed numerically the optimal shape of an active flagellum. They considered an internally forced, elastic planar flagellum deforming periodically and moving at a constant speed through a viscous fluid and found the shape of the flagellum that maximises the swimming speed at a fixed energetic cost, representing irreversible work of molecular motors. They concluded that the optimal shape of the beating flagellum depends on a single dimensionless combination of parameters, termed the Sperm number *Sp* (Lauga 2020*a*), and defined



Figure 1. Aspect ratio of eukaryotic flagellar waves. (a) Sketch of flagellated eukaryotic cell with wave amplitude h and wavelength λ . (b) Histogram of aspect ratios h/λ from experiments gathered in the BOSO-Micro database (Rodrigues *et al.* 2021). (c) Mean value of h vs λ for all flagellated eukaryotes in our database. Spermatozoa are marked with circles, while the remaining flagellated eukaryotes are marked with squares. The solid line shows the least-square fit to the data and the shaded area is the 95 % confidence interval. The dashed line shows the prediction from the optimal theory from Lauga & Eloy (2013) for Sp = 4 and the dotted line for Sp = 6. Cells from the same class in the tree of life are plotted using the same colour scheme, with all classes represented here listed in the inset of (b).

as the ratio of the wavelength λ to the elasto-hydrodynamic penetration length ℓ ,

$$Sp = \frac{\lambda}{\ell}, \quad \text{with } \ell = \left(\frac{TB}{\zeta_{\perp}}\right)^{1/4},$$
 (2.1)

where *T* is the period of oscillatory actuation, *B* the bending rigidity of the flagellum, and ζ_{\perp} the perpendicular resistance coefficient of the flagellum (i.e. the hydrodynamic force exerted on the flagellum per unit length for motion in the fluid perpendicular to its centreline). Thus the flagellum shape results from an interplay between the stiffness of the filament, viscous drag of the medium and internal forcing. Accordingly, decreasing the value of *Sp* results in flatter, smoother kinks in the flagellar beating (Lauga & Eloy 2013).

The typical values of the dimensionless *Sp* number for eukaryotes and spermatozoa have been reported to be within the range of 1–10 (Kumar *et al.* 2019). For sea-urchin *Arbacia punctulata* spermatozoa, Pelle *et al.* (2009) reported a bending rigidity of $B \approx 0.4-0.9 \times 10^{-21}$ Nm², while Howard (2001) assumes it to be the upper limit of that range. In direct measurements, Okuno & Hiramoto (1979) found the stiffness of echinoderm sperm flagella to be in the range of $B \approx 0.3-1.5 \times 10^{-21}$ Nm², while for *Strongylocentrotus purpuratus*, Okuno *et al.* (1981) estimated $B \approx 0.8 \times 10^{-21}$ Nm². Mechanical measurements for the flagella of wild-type *Chlamydomonas* yield B = $(0.84 \pm 0.28) \times 10^{-21}$ Nm² (Xu *et al.* 2016), with similar values for mutant strains. In water, we have $\zeta_{\perp} \approx 2 \times 10^{-3}$ Pa s, and the typical periods *T* vary across species from 0.02 to 0.05 s (Brennen & Winet 1977; Gray 1955; Rodrigues *et al.* 2021). From these numbers, and typical lengths of dozens of μ m (Rodrigues *et al.* 2021), we therefore estimate the values of *Sp* to be in the range of *Sp* $\approx 2-7$.

To compare the experimental measurements to predictions from theory, we use the work of Eloy & Lauga (2012) where, for a given value of Sp, the shape of the optimal flagellum was computed; for each optimal shape, we can then extract the corresponding optimal



Figure 2. Aspect ratio of ciliates cell body. (*a*) Sketch of ciliate body showing the cell width *W* and length *B*. (*b*) Histograms of cell aspect ratios W/B from experimental data gathered in the BOSO-Micro database (Rodrigues *et al.* 2021). (*c*) Mean value of body length *B* (in µm) plotted as a function of width *W* (in µm) for all species in our database. The solid line shows the least-square fit to the data while the shaded area is the 95 % confidence interval. The dashed line shows the prediction from the theory of fixed-volume drag minimisation (B/W = 1.952) (Pironneau 1973) while the dotted line shows the drag minimum for a given surface area (B/W = 4.037) (Montenegro-Johnson & Lauga 2015). Cells from the same class in the tree of life are plotted using the same colour scheme, with all classes represented here listed in inset of (*b*).

aspect ratio, h/λ . In figure 1(c) we plot the aspect ratio as a linear curve h/λ = constant for Sp = 4 ($h/\lambda = 0.163$, dashed line) and Sp = 6 ($h/\lambda = 0.194$, dotted line). Both lines lie within the 95% confidence interval of our dataset: the best fit for the data yields an aspect ratio $h/\lambda = 0.188$, with the lower and upper bound of the 95% confidence interval at 0.163 and 0.213, respectively ($R^2 = 0.562$).

2.2. Hydrodynamic drag force on ciliates

Ciliates constitute a large group of unicellular eukaryotic swimmers, characterised by the presence of hair-like cilia which cover their bodies in dense active carpets; a model organism, *Paramecium*, is sketched in figure 2(a). The internal structure of cilia is identical to eukaryotic flagella but they are typically shorter and used to propel cells with relatively much larger body sizes. This separation of scales has motivated mathematical models dating back to Blake (1971) to represent the action of cilia layers covering the cell bodies as a continuum boundary with prescribed actuation of the surrounding fluid. This surface forcing sets the fluid in motion, and leads to swimming. The balance of propulsion force and viscous drag force on the cell body determines the swimming speed U (Lauga 2020*a*). Because the latter results from the overall shape of the body, one possibility for cells to increase their swimming speed is to reduce the viscous drag opposing their propulsion by choosing the appropriate drag-minimising shape, which have been characterised theoretically (Pironneau 1973, 1974; Montenegro-Johnson & Lauga 2014).

To investigate if cells aligned with expectations from drag minimisation, we use our eukaryotic microswimmers database (Rodrigues *et al.* 2021) to quantify the extent to which the cell bodies of ciliates minimise drag forces. In figure 2(b), we plot the histogram for the aspect ratio of the cell bodies, B/W, of the 91 ciliates in our database. When multiple values were available for the same species, we use their average. Colours are used to code

different classes of organisms. Clearly, the reported cells are typically prolate, and most of them have a length of approximately twice their width, although more slender cell bodies are also observed.

To further explore the correlation between the two length scales characterising the cell bodies of ciliates, we present in figure 2(c) a scatter plot of the data, which suggests a linear correlation between cell body and width. We plot the linear least-square fit to the data with a solid line, corresponding to the slope B/W = 2.360 ($R^2 = 0.503$), while grey shading marks the 95 % confidence interval, for aspect ratios in the range (2.057, 2.664). Remarkably, these results are very close to the classical prediction of a minimal-drag shape in Stokes flow by Pironneau (1973), later computed by Bourot (1974), who demonstrated numerically that the aspect ratio B/W = 1.952 is hydrodynamically optimal for bodies with prescribed volumes (the corresponding optimal shape resembles a prolate spheroid with pointy ends). We mark this theoretical prediction with a dashed line in figure 2(c), and note that it lies just outside the confidence interval of our fit to data. In contrast, if instead one considers the shape that has minimum drag for a prescribed surface area (instead of a fixed volume), Montenegro-Johnson & Lauga (2014) found the optimal aspect ratio to be 4.037, marked in figure 2(c) with the dotted line; this lies well outside the data.

It is worth noting that the Stokes drag acting on an optimal fixed-volume prolate shape is only 4.5% less than that experienced by a sphere of the same volume, suggesting that the energetic cost of diverting from the optimum is actually relatively low. It is therefore perhaps all the more remarkable that such a small energetic gain seems to be reflected in the empirical data. The small magnitude of the energetic improvement might in turn allow a larger cell shape variability and explain the diversity of observed micron-scale shape features.

3. Discussion

In this paper, we used morphological data gathered for swimming eukaryotic microorganisms in the BOSO-Micro database which assembled published data from the literature (Rodrigues *et al.* 2021) to test two outstanding questions regarding hydrodynamic optimality of the geometric characteristics and shapes of the cells. First, we have shown that for 51 different species of flagellated unicellular eukaryotes and spermatozoa, which had the characteristics of their flagellar waves measured and reported in the literature, the ratio of the wave amplitude to the wavelength was close to the optimal hydrodynamic predictions for the shape of energetically optimal active filaments for Sperm numbers comparable to estimates for natural swimmers. Second, we have analysed a dataset of body widths and lengths of 91 species of ciliates and demonstrated that their cells have an aspect ratio close to the theoretical optimum for the minimal drag on a body of a fixed volume.

Our findings shed new light on the question of energetics of microscale swimming. There is a long-standing argument in biophysics that the energetic cost of locomotion is negligible when compared with metabolic constraints (Purcell 1977). Recent work focusing on 169 species of eukaryotes has estimated that the operating costs of flagella remain small, at a few per cent of the total energy budget, but flagellar construction costs can be quite significant (Schavemaker & Lynch 2022). The results in the current work strongly indicate that, in multiple species of swimming cells that span almost three orders of magnitude in length, cellular shapes are consistent with energetic optimisation. This remarkable agreement suggests that hydrodynamic forces might have played a key role in shaping biological active swimmers.

Clearly, not all swimmers in figures 1 and 2 follow exactly the theoretical curves. Outliers in figure 1 that are the furthest from the best-fit line are *Giardia lamblia*, cricket, worm, midge and rabbit spermatozoa (below the trend line), and *Poteriodendron*, stick insect and fly spermatozoa (above the line). In figure 2 the outliers are *Halteria grandinella*, *Mesodinium rubrum* (below the line) and *Spirostomum* spp. and *Trachelocerca* spp. (above the line). Upon examining the shape of these specific organisms we could not identify any systematic distinguishing features. Other factors are therefore at play in determining the morphology of some species. In the case of bacteria, it is known that cell shapes are the result of a delicate trade-off between efficient swimming, the chemotaxis budget, and the costs related to cell construction (Schuech *et al.* 2019), which points to the complexity of the overall energetic landscape.

Furthermore, in the case of ciliated organisms, minimising the drag force might not be sufficient for maximising propulsion, since swimming is a balance between drag and thrust. And yet, the available experimental data strikingly show that drag minimisation appears to be important for ciliates, independently of the details of their propulsion efficiency. We conjecture that this might stem from the necessity of these cells to not only self-propel but also to respond to the external environmental flows to which they are inevitably exposed.

Funding. This project has received funding from the European Research Council (ERC) under the European Union's Horizon 2020 research and innovation programme (grant agreement 682754 to EL), from the National Science Centre of Poland (grant Sonata no. 2018/31/D/ST3/02408 to M.L.) and from Campus France (Eiffel Scholarship no. 812884G to M.F.V.R.).

Declaration of interests. The authors report no conflict of interest.

Data availability statement. The data that support the findings of this study are openly available in the OSF repository https://osf.io/4tyx6. They are also available and editable on GitHub: https://github.com/marcos-fvr/BOSO-micro.

Author ORCIDs.

- Maciej Lisicki https://orcid.org/0000-0002-6976-0281;
- Marcos F. Velho Rodrigues https://orcid.org/0000-0002-8744-6966;
- Discrete End State State

Author contributions. M.L. and M.F.V.R. contributed equally to this work.

REFERENCES

- ALOUGES, F., DESIMONE, A. & LEFEBVRE, A. 2008 Optimal strokes for low Reynolds number swimmers: an example. J. Nonlinear Sci. 18, 277–302.
- ALOUGES, F., DESIMONE, A. & LEFEBVRE, A. 2009 Optimal strokes for axisymmetric microswimmers. *Eur. Phys. J.* E 28, 279–284.
- AVRON, J.E., GAT, O. & KENNETH, O. 2004 Optimal swimming at low Reynolds numbers. *Phys. Rev. Lett.* **93**, 186001.
- BERG, H.C. & ANDERSON, R.A. 1973 Bacteria swim by rotating their flagellar filaments. *Nature* 245, 380–382.
- BLAKE, J.R. 1971 A spherical envelope approach to ciliary propulsion. J. Fluid Mech. 46, 199-208.
- BOUROT, J.-M. 1974 On the numerical computation of the optimum profile in stokes flow. J. Fluid Mech. 65, 513–515.
- BRAY, D. 2000 Cell Movements. Garland.
- BRENNEN, C. & WINET, H. 1977 Fluid mechanics of propulsion by cilia and flagella. Annu. Rev. Fluid Mech. 9, 339–398.
- ELGETI, J., WINKLER, R.G. & GOMPPER, G. 2015 Physics of microswimmers—single particle motion and collective behavior: a review. *Rep. Prog. Phys.* 78, 056601.

ELOY, C. & LAUGA, E. 2012 Kinematics of the most efficient cilium. Phys. Rev. Lett. 109, 038101.

- FUJITA, T. & KAWAI, T. 2001 Optimum shape of a flagellated microorganism. JSME Intl J. Ser. C 44, 952-957.
- GAFFNEY, E.A., GADELHA, H., SMITH, D.J., BLAKE, J.R. & KIRKMAN-BROWN, J.C. 2011 Mammalian sperm motility: observation and theory. *Annu. Rev. Fluid Mech.* **43**, 501–528.
- GOLDSTEIN, R.E. 2015 Green algae as model organisms for biological fluid dynamics. Annu. Rev. Fluid Mech. 47, 343–375.
- GOLESTANIAN, R. & AJDARI, A. 2008 Analytic results for the three-sphere swimmer at low Reynolds number. *Phys. Rev. E* 77, 036308.
- GRAY, J. 1955 The movement of sea-urchin spermatozoa. J. Expl Biol. 32, 775-801.
- GUASTO, J.S., RUSCONI, R. & STOCKER, R. 2012 Fluid mechanics of planktonic microorganisms. Annu. Rev. Fluid Mech. 44, 373–400.

HOWARD, J. 2001 Mechanics of Motor Proteins and the Cytoskeleton. Sinauer Associates.

- JAHN, T.L. & VOTTA, J.J. 1972 Locomotion of protozoa. Annu. Rev. Fluid Mech. 4, 93-116.
- KOCH, D.L. & SUBRAMANIAN, G. 2011 Collective hydrodynamics of swimming micro-organisms: living fluids. Annu. Rev. Fluid Mech. 43, 637–659.
- KUMAR, M., WALKAMA, D.M., GUASTO, J.S. & ARDEKANI, A.M. 2019 Flow-induced buckling dynamics of sperm flagella. *Phys. Rev.* E 100, 063107.
- LAUGA, E. 2016 Bacterial hydrodynamics. Annu. Rev. Fluid Mech. 48, 105–130.
- LAUGA, E. 2020a The Fluid Dynamics of Cell Motility. Cambridge University Press.
- LAUGA, E. 2020b Traveling waves are hydrodynamically optimal for long-wavelength flagella. *Phys. Rev. Fluids* **5**, 123101.
- LAUGA, E. & ELOY, C. 2013 Shape of optimal active flagella. J. Fluid Mech. 730, R1.
- LAUGA, E. & POWERS, T.R. 2009 The hydrodynamics of swimming microorganisms. *Rep. Prog. Phys.* 72, 096601.
- LESHANSKY, A.M., KENNETH, O., GAT, O. & AVRON, J.E. 2007 A frictionless microswimmer. New J. Phys. 9, 126.
- LIGHTHILL, J. 1975 Mathematical Biofluiddynamics. SIAM.
- LIGHTHILL, J. 1976 Flagellar hydrodynamics-the John von Neumann lecture, 1975. SIAM Rev. 18, 161-230.
- MICHELIN, S. & LAUGA, E. 2010 Efficiency optimization and symmetry-breaking in an envelope model for ciliary locomotion. *Phys. Fluids* 22, 111901.
- MICHELIN, S. & LAUGA, E. 2011 Optimal feeding is optimal swimming for all Péclet numbers. *Phys. Fluids* 23, 101901.
- MONTENEGRO-JOHNSON, T.D. & LAUGA, E. 2014 Optimal swimming of a sheet. Phys. Rev. E 89, 060701.
- MONTENEGRO-JOHNSON, T.D. & LAUGA, E. 2015 The other optimal stokes drag profile. *J. Fluid Mech.* **762**, R3.
- NASOURI, B., VILFAN, A. & GOLESTANIAN, R. 2019 Efficiency limits of the three-sphere swimmer. *Phys. Rev. Fluids* 4, 073101.
- NASOURI, B., VILFAN, A. & GOLESTANIAN, R. 2021 Minimum dissipation theorem for microswimmers. *Phys. Rev. Lett.* 126, 034503.

OKUNO, M., ASAI, D.J., OGAWA, K. & BROKAW, C.J. 1981 Effects of antibodies against dynein and tubulin on the stiffness of flagellar axonemes. J. Cell Biol. 91, 689–694.

- OKUNO, M. & HIRAMOTO, Y. 1979 Direct measurements of the stiffness of echinoderm sperm flagella. J. Expl Biol. 79, 235–243.
- OMORI, T., ITO, H. & ISHIKAWA, T. 2020 Swimming microorganisms acquire optimal efficiency with multiple cilia. Proc. Natl Acad. Sci. USA 117, 30201–30207.
- OSTERMAN, N. & VILFAN, A. 2011 Finding the ciliary beating pattern with optimal efficiency. *Proc. Natl Acad. Soc. USA* **108**, 15727–15732.
- PEDLEY, T.J. & KESSLER, J.O. 1992 Hydrodynamic phenomena in suspensions of swimming microorganisms. Annu. Rev. Fluid Mech. 24, 313–358.
- PELLE, D.W., BROKAW, C.J., LESICH, K.A. & LINDEMANN, C.B. 2009 Mechanical properties of the passive sea urchin sperm flagellum. *Cell Motil. Cytoskel.* **66**, 721–735.
- PIRONNEAU, O. 1973 On optimum profiles in stokes flow. J. Fluid Mech. 59, 117–128.
- PIRONNEAU, O. 1974 On optimum design in fluid mechanics. J. Fluid Mech. 64, 97-110.
- PIRONNEAU, O. & KATZ, D.F. 1974 Optimal swimming of flagellated microorganisms. J. Fluid Mech. 66, 391–415.
- PIRONNEAU, O. & KATZ, D.F. 1975 Optimal swimming of motion of flagella. In Swimming and Flying in Nature (ed. T.Y. Wu, C.J. Brokaw & C. Brennen), vol. 1, pp. 161–172. Plenum.
- PURCELL, E.M. 1977 Life at low Reynolds number. Am. J. Phys. 45, 3–11.
- PURCELL, E.M. 1997 The efficiency of propulsion by a rotating flagellum. *Proc. Natl Acad. Sci. USA* 94, 11307–11311.

- RODRIGUES, M.F.V., LISICKI, M. & LAUGA, E. 2021 The bank of swimming organisms at the micron scale (BOSO-Micro). *PLoS One* 16, e0252291.
- SCHAVEMAKER, P.E. & LYNCH, M. 2022 Flagellar energy costs across the tree of life. eLife 11, e77266.
- SCHUECH, R., HOEHFURTNER, T., SMITH, D.J. & HUMPHRIES, S. 2019 Motile curved bacteria are pareto-optimal. Proc. Natl Acad. Sci. USA 116, 14440–14447.

SPAGNOLIE, S.E. & LAUGA, E. 2010 The optimal elastic flagellum. Phys. Fluids 22, 031901.

- SPAGNOLIE, S.E. & LAUGA, E. 2011 Comparative hydrodynamics of bacterial polymorphism. *Phys. Rev. Lett.* **106**, 058103.
- TAM, D. & HOSOI, A.E. 2007 Optimal stroke patterns for Purcell's three-link swimmer. Phys. Rev. Lett. 98, 068105.
- TAM, D. & HOSOI, A.E. 2011*a* Optimal kinematics and morphologies for spermatozoa. *Phys. Rev.* E 83, 045303.
- TAM, D. & HOSOI, A.E. 2011b Optimal feeding and swimming gaits of biflagellated organisms. Proc. Natl Acad. Soc. USA 108, 1001–1006.
- VILFAN, A. 2012 Optimal shapes of surface slip driven self-propelled microswimmers. Phys. Rev. Lett. 109, 128105.
- XU, G., WILSON, K.S., OKAMOTO, R.J., SHAO, J.-Y., DUTCHER, S.K. & BAYLY, P.V. 2016 Flexural rigidity and shear stiffness of flagella estimated from induced bends and counterbends. *Biophys. J.* 110, 2759–2768.
- YATES, G.T. 1986 How microorganisms move through water. Am. Sci. 74, 358-365.