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Determination of Cell Doubling Times from the Return-on-Investment Time of Photosynthetic Vesicles based on Atomic Detail Structural Models

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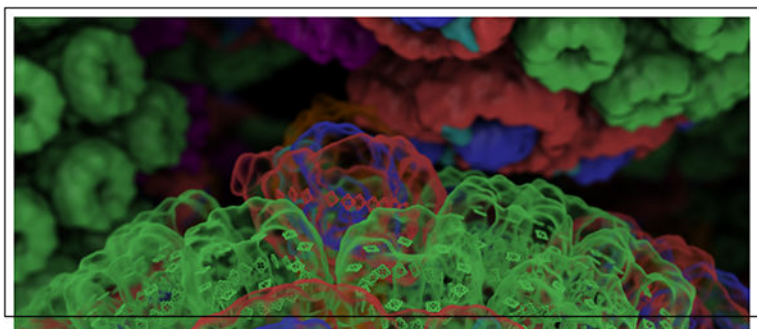
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Abstract

Cell doubling times of the purple bacterium *Rhodobacter sphaeroides* during photosynthetic growth are determined experimentally and computationally as a function of illumination. For this purpose, energy conversion processes in an intracytoplasmic membrane vesicle, the chromatophore, are described based on an atomic detail structural model. The cell doubling time and its illumination dependence are computed in terms of the return-on-investment (ROI) time of the chromatophore, determined computationally from the ATP production rate, and the mass ratio of chromatophores in the cell, determined experimentally from whole cell absorbance spectra. The ROI time is defined as the time it takes to produce enough ATP to pay for the construction of another chromatophore. The ROI time of the low light-growth chromatophore is 4.5–2.6 hours for a typical illumination range of 10–100 $\mu\text{mol photons m}^{-2} \text{s}^{-1}$, respectively, with corresponding cell doubling times of 8.2–3.9 hours. When energy expenditure is considered as a currency, the benefit-to-cost ratio computed for the chromatophore as an energy harvesting device is 2–8 times greater than for photovoltaic and fossil fuel based energy solutions, whereas the corresponding ROI times are approximately 3–4 orders of magnitude shorter for the chromatophore than for synthetic systems.

Graphical Abstract

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Introduction

Photosynthesis is a universal source of energy for life on Earth, spanning a wide range of time and length scales in its fundamental processes.¹ Bioenergetic processes in photosynthesis, ubiquitous across bacteria and plants, range in scale from electronic excitation migration (picoseconds)^{2–6} to organelle-scale diffusion of charge carriers^{7–9} and ATP synthesis^{10,11} (milliseconds) to adaptive response of protein composition to changing environmental conditions at the cell level (hours).^{12,13} These disparate length and time scales require a multitude of experimental and theoretical approaches for determining structure and function at atomic, supra-molecular, organelle, and cell levels of organization.

It is a persistent challenge to derive the emerging properties at higher organizational levels, such as for organelles and cells, from observed and computed properties determined at atomic and molecular detail. For a photosynthetic system, these emergent properties include the rate and overall efficiency of energy conversion into ATP.¹⁴ Such properties constitute performance metrics for comparison with different species as well as with synthetic systems;¹⁵ provide guidelines for the bioengineering of efficient crops and rational design of bio-inspired solar energy solutions;¹⁶ and relate the efficiency of a photosynthetic apparatus to its structural complexity¹⁷ and its evolutionary lineage.¹⁸ Purple bacteria considered in this study are reported to be the earliest emerging photosynthetic lineage.¹⁸

Determining a cell-scale observable directly from an atomic detail description within a single computational framework is prohibitive. For example, molecular dynamics currently permits simulation sizes of 10^8 – 10^9 atoms and timescales, for large simulations, of microseconds.¹⁹ Cell scale events, such as cell reproduction considered in this manuscript for a photosynthetic bacterium, require a further 3–4 orders of magnitude in simulation size and 8–10 orders of magnitude in timescale beyond what is currently reachable. Therefore, a cellular process that spans many length and time scales needs to be described via an integrative model that employs separate formulations for each subprocess such that the output of one subprocess is used as an input for the next in ascending order of scale.

An integrative model was employed in Ref.¹⁴ to describe photosynthetic energy conversion in the chromatophore, the primary photosynthetic unit in the purple bacterium *Rhodobacter (Rba.) sphaeroides*. The chromatophore is an intracytoplasmic membrane vesicle of 60 nm diameter²⁰ comprising over a hundred cooperating proteins^{21–25} for performing ATP

synthesis (Fig. 1). The rate and efficiency of ATP production in the chromatophore as a function of illumination are determined¹⁴ based on an atomic detail structural model²³ in a three stage formulation involving excitation energy transfer, the cycle of charge carriers between proteins, and ATP synthesis, each stage providing necessary input for the next as summarized in the Methods section. This formulation revealed that the chromatophore produces ATP efficiently under illumination conditions typical of purple bacterial habitat ($< 100 \mu\text{mol photons m}^{-2} \text{ s}^{-1}$), while a saturation in ATP turnover is observed at higher illuminations.¹⁴ Furthermore, the ATP production rate is seen to be *not* optimized with respect to vesicle composition under steady state illumination. The evolutionary pressures that shape vesicle composition appear to favor damage avoidance and robustness²⁶ under environmental strain over the optimality of performance under ideal conditions.¹⁴

The ATP production rate determined computationally makes it possible to evaluate the performance of the chromatophore as a light harvesting device under different illumination conditions. For this purpose, we introduce below the quantity of return-on-investment (ROI) time, defined as the time in which the chromatophore produces enough ATP, viewed as a currency in bioenergetic processes, to pay for the construction of another chromatophore. The concept of ROI, considered typically as integrated over the expected lifetime of a device and expressed as a benefit-to-cost ratio, is widely used as a performance measure in human decision making in areas ranging from industrial energy efficiency²⁷ to environmental conservation efforts.²⁸ It is natural to expect that a similar optimization criterion have influenced the fitness landscape that governs the evolution of terrestrial lifeforms.

The aim of the present study is to determine a cell scale observable, namely the doubling time of the purple bacterium *Rba. sphaeroides*, by direct experimental observation as well as by computation from the aforementioned structural and functional model of ATP production. The organization of this manuscript is as follows: the computation of ATP production rate in the chromatophore as a function of light intensity and stoichiometry is summarized as reported in Ref.;¹⁴ the corresponding ROI time is introduced and, in particular, expressed for a vesicle illuminated at the same light intensity as its growth condition in order to model constant illumination growth experiments considered herein; the growth of *Rba. sphaeroides*, observed at different light intensities, is used to determine the cell doubling time for a direct comparison with computed values and for estimating the ratio of chromatophore content in the cell; the use of ROI as a performance metric as well as the accuracy and limitations of the current framework for estimating cell doubling times are discussed.

Methods

In the following, computationally determined energy conversion processes are related to experimentally observed cell growth kinetics, as a function of light intensity. For this purpose, the ATP production rate, computed in Ref.¹⁴ based on an atomic detail structural model of the chromatophore, is employed to determine the ROI time, τ_{ROI} . Experimental observations are presented for the growth of *Rba. sphaeroides* at different light intensities, which is used to determine the cell doubling time during the exponential phase. The chromatophore count per cell at each light intensity is determined by spectroscopic

quantification of bacteriochlorophyll (BChl) concentrations, permitting the estimation of the mass ratio of chromatophores in the cell, η_{chrom} . The ROI time τ_{ROI} and the mass ratio of chromatophores η_{chrom} are used to estimate the time for the entire cell to pay the energy cost of producing another cell, accounting for base metabolism. The time for the cell to reproduce, thus computed, is compared to the observed cell doubling time as a function of illumination.

ATP production rate of the chromatophore

The ATP production rate $k_{\text{ATP}}(J)$ of the chromatophore at steady-state illumination I is reported in Refs.^{14,23} Below, a summary is provided for the energy conversion processes, which are divided into three stages: (i) excitation energy transfer and the formation of quinols; (ii) diffusion of charge carriers; (iii) ATP synthesis.

The first stage of energy conversion, namely, excitation energy transfer in the pigment network of the chromatophore, was described in Ref.¹⁴ using a generalized Förster formalism^{30–33} based on Refs.^{17,21,22} Excitations of LH1 and LH2 BChls form delocalized exciton states^{34,35} that are transferred coherently^{36,37} between complexes. The BChl exciton states of a complex J are the eigenstates of the effective Hamiltonian¹⁷

$$H^J = \sum_{i=1}^{N_J} E_i^J |i\rangle\langle i| + \sum_{i>j>0}^{N_J} V_{ij}^J (|i\rangle\langle j| + |j\rangle\langle i|), \quad (1)$$

which is related to the geometry of the pigment network via the excitonic couplings V_{ij}^J between pigments i and j of complex J computed in Ref.¹⁴ $|i\rangle$ corresponds to the Q_y excited state of BChl i ; J label one of 63 LH2s, 24 LH1s, and 24 RC complexes shown in Fig. 1B.

The quantum yield q is defined as the probability with which the absorption of a photon by any pigment of the chromatophore results in charge separation at any RC ready for excitation-induced electron transfer to a quinone or semiquinone. The quantum yield defined this way is independent of light intensity and is solely determined by the pigment geometry, given by¹⁴

$$q = -k_{\text{CS}}(1_{\text{RC}})^T \cdot \mathcal{K}^{-1} \cdot \mathbf{P}(0), \quad (2)$$

where $\mathbf{P}(0)$ denotes the state corresponding to an equal likelihood of initial excitation for all BChls; k_{CS} is the charge separation rate at the RC; the rate matrix \mathcal{K} is defined as

$$(\mathcal{K})_{JK} = k_{KJ} - \delta_{JK} \left(\sum_M k_{JM} + k_{\text{diss}} + k_{\text{CS}} \delta_{J,\text{RC}} \right), \quad (3)$$

where k_{JK} is the rate of excitation transfer between a donor complex J and an acceptor complex K computed in Ref.¹⁴ according to generalized Förster theory,^{30–33} following the

assumption of Boltzmann-populated exciton states;^{36,38} k_{diss} and k_{CS} are dissipation and charge separation rates, respectively; $\delta_{J,\text{RC}}$ equals 1 when J denotes a RC complex and 0 otherwise. The quantum yield q for the low light-growth vesicle shown in Fig. 1B computed according to Eq. (2) is 0.91.¹⁴

The rate of quinol formation at the RC $k_{\text{Q} \rightarrow \text{QH}_2}$ can be expressed in terms of the quantum yield q by

$$k_{\text{Q} \rightarrow \text{QH}_2}(I) = \frac{1}{2} I q p_{\text{RC}}(I), \quad (4)$$

where $p_{\text{RC}}(I)$ is the probability for the RC to hold a quinone Q or a semiquinone QH ready to accept an electron; the prefactor $\frac{1}{2}$ accounts for every quinol requiring two electron transfer events at the RC; I is the absorbed light power given in units of photons absorbed by the chromatophore per second,¹⁴ i.e., $I = \Phi \sigma_{\text{total}}$, where Φ is the flux of useable photons and σ_{total} is the total absorption cross-section of the chromatophore determined via the functional absorption cross-section reported in Ref.¹²

The probability $p_{\text{RC}}(I)$ is estimated in Ref.¹⁴ for the steady-state condition as

$$p_{\text{RC}}(I) = \left(1 + \frac{1}{2} I q \tau_{\text{RC}}(I) \frac{1}{n_{\text{RC}}} \right)^{-1}, \quad (5)$$

where n_{RC} is the number of RCs and $\tau_{\text{RC}}(I)$ is the so-called cycling time, namely, the mean time needed for a RC to become available for binding a new Q after it had accepted the previous Q.³⁹ The cycling time for quinol turnover $\tau_{\text{RC}}(I)$ is a rate limiting quantity for the energy conversion in the chromatophore¹⁴ as suggested by earlier studies.^{8,9}

The second stage of energy conversion, namely, diffusion of charge carriers and the turnover of quinols at the cytochrome bc_1 complex ($\text{cyt}bc_1$), was described in Ref.¹⁴ heuristically in terms of experimental observations^{12,40} of the cycling time $\tau_{\text{RC}}(I)$ at the low light and high light limits. The cycling time was estimated as an interpolation between low light and high light values as¹⁴

$$\tau_{\text{RC}}(I) = \tau_L + (\tau_H - \tau_L) \left(1 - e^{-\frac{1}{2} I q B^{-1}} \right), \quad (6)$$

where $\tau_L = 3$ ms is the low light limit^{12,40} and $\tau_H = (n_{\text{RC}}/n_B) \tau_B$ is the high light limit; n_B is the number of $\text{cyt}bc_1$ dimers ($n_B = 4$, for the vesicle shown in Fig. 1B); $\tau_B = 25$ ms is the quinol turnover time at a $\text{cyt}bc_1$;⁴¹ and $B = 2 \times n_B \tau_B^{-1}$ denotes the total turnover capacity of $\text{cyt}bc_1$ s.¹⁴

The third stage of energy conversion, namely ATP synthesis, was described in Ref¹⁴ under the steady state assumption by observing that $k_{\text{ATP}}(I) = k_{\text{Q} \rightarrow \text{QH}_2}(I)$. Here, a 12-subunit c-ring is assumed for the ATP synthase that consequently produces one ATP molecule from four protons; coincidentally, this is the same number of net protons released into the vesicle interior for each quinol \rightarrow quinone turnover at the *cytbc₁* complex.⁴¹ Therefore, the ATP production rate of the chromatophore k_{ATP} as a function of light intensity I , in units of ATP molecules per second, is given by

$$k_{\text{ATP}}(s; I) = \frac{1}{2} I q \left(1 + \frac{1}{2} I q \tau_{\text{RC}}(I) \frac{1}{n_{\text{RC}}} \right)^{-1}. \quad (7)$$

Here, the dependence of k_{ATP} on the vesicle composition $s = \{n_{\text{B}}, n_{\text{RC}}, n_{\text{LH2}}\}$ is expressed implicitly through the stoichiometry-dependence of the cycling time τ_{RC} and the total absorption cross section σ_{total} for BChls. The quantum yield q in Eq. (7) at stoichiometries different than for the vesicle shown in Fig. 1B is computed¹⁴ by an interpolation of the vesicle composition dependence of q reported earlier.²¹

The rate kinetics model described by Eq. (7) displays two limitations. First, the spatial details of the chromatophore are reflected directly only in the computation of the quantum yield q , but not in the cycling time $\tau_{\text{RC}}(I)$, since the direct computation, via molecular dynamics, of the rate limiting diffusive processes that govern the cycling time is currently prohibitive.¹⁴ Second, coupling to cytoplasmic reactions through enzymes such as NADH dehydrogenase and succinate dehydrogenase⁴² are not considered, since the respective proteins are currently not resolved in AFM data and, therefore, not included in the corresponding structural models.^{14,23}

In order to interpret the constant light growth experiments reported in this manuscript, the relation between the chromatophore composition and the light intensity at growth needs to be considered. The composition of a chromatophore varies gradually according to growth conditions with lower light intensities resulting in a higher LH2:RC ratio.^{12,21} The ATP production rate given by Eq. (7) considers the light intensity I and the vesicle composition s to be independent quantities. In other words, the light intensity present at the growth of the cell that determined the vesicle composition s is unrelated to the light intensity I acting upon the chromatophore momentarily; e.g., Eq. (7) can describe a low light-growth chromatophore illuminated at high light or vice versa. The growth experiments herein correspond to constant light conditions, i.e., a chromatophore is always illuminated at the same light intensity as that which determined its composition at time of growth. Therefore, it is of interest to describe the ATP production rate, Eq. (7), for a vesicle subjected to the same light intensity corresponding to its own specific growth condition.

For the purpose of describing constant light growth experiments, the vesicle stoichiometry itself is expressed in terms of the light intensity at growth, namely, by a function $\tilde{s}(I) = \{n_{\text{B}}(I), n_{\text{RC}}(I), n_{\text{LH2}}(I)\}$. The quantities, $n_{\text{B}}(I)$, $n_{\text{RC}}(I)$, $n_{\text{LH2}}(I)$, are not independent of one another. First, following Ref.,¹⁴ the number of LH2 complexes $n_{\text{LH2}}(n_{\text{B}}, n_{\text{RC}})$ is

determined directly by the excluded surface area left available after the assignment of *cytbc₁* and RC-LH1-PufX complexes; therefore, it is sufficient to describe only $n_B(I)$ and $n_{RC}(I)$. Second, the *cytbc₁*:RC stoichiometry, namely, $2n_B : n_{RC}$, is not arbitrary and is determined to be 1:3 based on mass spectrometry data.²³ Third, the LH2:RC stoichiometry is reported to change from 2.6 at low light to 1.5 at high light.²⁰ The stoichiometry of the low light-growth vesicle¹⁴ is $\tilde{s}_{\text{low}} = \{n_{B,\text{low}} = 4, n_{RC,\text{low}} = 24, n_{LH2,\text{low}} = 63\}$. With the aforementioned three constraints for the three quantities, $n_B(I)$, $n_{RC}(I)$, $n_{LH2}(I)$, the stoichiometry corresponding to the high light-growth vesicle becomes $\tilde{s}_{\text{high}} = \{n_{B,\text{high}} = 5, n_{RC,\text{high}} = 30, n_{LH2,\text{high}} = 47\}$. The values for $\tilde{s}(I)$ at intermediate illuminations are determined below by taking $n_{RC}(I)$ to be a logarithmic interpolation between the low light, taken to be $30 \mu\text{mol photons m}^{-2} \text{s}^{-1}$ (i.e., 3% of full sunlight; see Methods), and high light, taken to be $1000 \mu\text{mol photons m}^{-2} \text{s}^{-1}$ (i.e., 100% of full sunlight), illumination values, namely, $n_{RC;\text{low}} = 24$ and $n_{RC;\text{high}} = 30$, respectively; $n_B(I)$ and $n_{LH2}(I)$ are determined from $n_{RC}(I)$ according to the constraints listed above.

With the growth condition dependence of the vesicle stoichiometry $\tilde{s}(I)$ thus established, the stoichiometry-adjusted ATP production rate $\tilde{k}_{\text{ATP}}(I)$ at light intensity I for a vesicle that was also grown at the same light intensity I is given by

$$\tilde{k}_{\text{ATP}}(I) = k_{\text{ATP}}(\tilde{s}(I), I), \quad (8)$$

where the stoichiometry $s = \tilde{s}(I)$ is substituted into Eq. (7).

The ATP production rates $k_{\text{ATP}}(I)$ given by Eq. (7) for low light-growth, $s = \tilde{s}_{\text{low}}$, and high light-growth, $s = \tilde{s}_{\text{high}}$, vesicle compositions are shown in Fig. 2A.

Return-on-investment time of the chromatophore

The chromatophore can be regarded as a device that produces ATP and is, in turn, itself manufactured by the expenditure of ATP. The time it takes for the chromatophore, at a given illumination, to produce enough ATP to pay for its own manufacturing cost, i.e., to return the metabolic investment in ATP for its production, is defined to be the ROI time, τ_{ROI} . Thus, for a vesicle with stoichiometry s , the return-on-investment time τ_{ROI} at illumination I can be expressed as

$$\tau_{\text{ROI}}(s, I) = \frac{C_{\text{ATP}}}{k_{\text{ATP}}(s, I)}, \quad (9)$$

where C_{ATP} is the total cost in ATP molecules for the manufacturing of the chromatophore and $k_{\text{ATP}}(s, I)$ is the ATP production rate given by Eq. (7).

The ATP cost C_{ATP} is not computed by accounting for all metabolic processes involved in the manufacturing of chromatophore components. Instead, C_{ATP} is estimated from the total

dry mass of the chromatophore and the reported values for the so-called ATP yield Y_{ATP} , namely, the dry cell mass generated by ATP synthesis, in units of grams per mol ATP.⁴³ A set of Y_{ATP} values, corrected for the maintenance energy expenditure of the cell, are listed in Ref.⁴³ to range between 10–24 g/mol-ATP for various bacteria along with a theoretical maximum value of $Y_{\text{ATP}}^{\text{max}} = 32$ g/mol-ATP. The value of Y_{ATP} for *Rba. sphaeroides* for the growth environment discussed below and its dependence on light intensity at growth are currently unavailable. Therefore, we adopt a value from the aforementioned range as $Y_{\text{ATP}} = 22$ g/mol-ATP, chosen for a best fit to the observed doubling behavior at the low light illumination (i.e., $30 \mu\text{mol photons m}^{-2} \text{s}^{-1}$); Y_{ATP} is assumed to be the same at all growth light intensities. For comparison purposes, the theoretical maximum value $Y_{\text{ATP}}^{\text{max}}$ is also considered in the estimates of ROI and cell doubling time discussed below.

The ATP cost C_{ATP} for the production of the low light-growth chromatophore shown in Fig. 1B is thus estimated to be

$$C_{\text{ATP}} = \frac{M_{\text{chrom}}}{Y_{\text{ATP}}} = 1.3 \times 10^6 \text{ ATP molecules}, \quad (10)$$

where $M_{\text{chrom}} = 2.9 \times 10^7$ Da is the dry mass of the chromatophore. The ATP cost corresponding to the theoretical maximum ATP yield $Y_{\text{ATP}}^{\text{max}}$ is

$$C_{\text{ATP}}^{\text{max}} = M_{\text{chrom}} / Y_{\text{ATP}}^{\text{max}} = 0.9 \times 10^6 \text{ ATP molecules}.$$

The ROI time τ_{ROI} given by Eq. (9) for the low light-growth, $s = \tilde{s}_{\text{low}}$, and high light-growth, $s = \tilde{s}_{\text{high}}$, vesicles are shown in Fig. 2B.

Using the growth condition dependence of the vesicle stoichiometry $\tilde{s}(I)$ and the stoichiometry-adjusted ATP production rate $\tilde{k}_{\text{ATP}}(I)$ given by Eq. (8), a similarly stoichiometry-adjusted ROI time $\tilde{\tau}_{\text{ROI}}(I)$ can be computed for a vesicle that was grown at light intensity I and illuminated also at the same light intensity I , namely,

$$\tilde{\tau}_{\text{ROI}}(I) = \tau_{\text{ROI}}(\tilde{s}(I), I) \quad (11)$$

where the stoichiometry $s = \tilde{s}(I)$ is substituted into Eq. (9). The ATP cost of a vesicle C_{ATP} estimated from the vesicle mass in Eq. (10) is assumed to be independent of I as vesicle size does not change significantly between different growth conditions.²⁰

Growth of *Rhodobacter sphaeroides*

Rba. sphaeroides wild-type strain 2.4.1 was grown in M22+ medium⁴⁴ supplemented with 0.1% casamino acids. Growth was measured by monitoring the optical density at 680 nm (OD_{680}). Starter cultures were grown semi-aerobically in the dark in a rotary shaker at 34°C. Photosynthetic growth under anaerobic conditions was performed at room temperature in

completely full and sealed 17 ml sterile glass tubes inoculated to a starting OD_{680} of 0.03–0.05. Illumination at light intensities of 1, 10, 30, 100, 250, 500 and 1000 $\mu\text{mol m}^{-2} \text{s}^{-1}$ was provided using Osram 116 W Halogen bulbs. These light intensities were chosen to span a likely range of irradiation by sunlight. These values vary according to wavelength, position on the Earth's surface, time of year, and other factors, and lie between 200–500 W m^{-2} in the 750–950 nm wavelength range for standard incoming solar spectral irradiance distribution. We chose a conservative value of 200 W m^{-2} , equivalent to 1000 $\mu\text{mol m}^{-2} \text{s}^{-1}$ as our measure of 100% full sunlight. Light intensity was monitored using a LI-250A Light Meter equipped with a LI-190 Quantum Sensor (LI-COR Biosciences). Using thin glass tubes (~ 1 cm across) and culture mixing with magnetic stirrers ensured that self-shading was minimized during photosynthetic growth. Notable for the energy use estimates discussed below, the cells did not exhibit flagellar motility; nor did they have access to an energy source other than photosynthesis for metabolic activity, although the growth medium does supply sources of carbon for photoheterotrophic growth. The observed cell populations denoted by OD_{680} at each illumination are shown in Fig. 3A,B.

Spectroscopy and quantification of bacteriochlorophyll concentration

Cells grown at different light intensities were harvested by centrifugation (15,000 rpm, 20 min, 4°C) at an OD_{680} of 1.0. Cell pellets were resuspended in 20 mM HEPES pH 7.5 with 50% (v/v) glycerol, normalised by OD_{680} , and whole cell absorption spectra were measured at room temperature in a Cary 60 UV-Vis spectrophotometer (Agilent Technologies) with baseline correction using 20 mM HEPES pH 7.5 with 50% (v/v) glycerol. To determine the BChl concentration, pigment was extracted from 1 OD_{680} unit of cells, essentially as described in.⁴⁵ The cells were pelleted (15,000 rpm, 5 min, 4°C) and all the supernatant was removed. Cells were resuspended in 1 ml of methanol with 0.2% (v/v) ammonia, vortex mixed for 30 s and incubated on ice for 20 min in the dark. The extracts were clarified by centrifugation (15,000 rpm, 5 min, 4°C) and absorption spectra were measured immediately, using methanol with 0.2% (v/v) ammonia for baseline correction. The BChl content per cell was determined using a 771 nm extinction coefficient for BChl a in methanol of 54.8 $\text{mM}^{-1} \text{cm}^{-1}$,⁴⁶ and a conversion factor of 1.1×10^9 cells per OD_{680} unit.²⁰

A range of values for BChls per chromatophore vesicle were used in order to estimate the number of vesicles per cell, ranging from 2469 BChls per chromatophore for a low light growth vesicle (30 $\mu\text{mol photons m}^{-2} \text{s}^{-1}$)¹⁴ to 2342 BChls per chromatophore for a moderate high light growth vesicles (500 $\mu\text{mol photons m}^{-2} \text{s}^{-1}$), the latter value determined by stoichiometry interpolation as discussed above. The observed spectra at each illumination are shown in Fig. 3C,D and the corresponding vesicle counts in Fig. 3E.

Observed and computed cell doubling times

The experimentally determined cell doubling times are obtained directly from the cell growth curves shown in Fig. 3A,B. The exponential growth phase was identified at each light intensity as indicated by a linear fit in the semi-log plot. The corresponding cell doubling times are given by the inverse-slope of each linear fit.

In the following, the cell doubling times are also determined computationally from a model of cell-wide ATP production and expenditure in *Rba. sphaeroides*. In accordance with the growth conditions described above, it is assumed that: (i) The cell's sole input of energy is via photosynthesis, i.e., no source of energy is present in the growth medium; though, the medium supplies carbon for photoheterotrophic growth. (ii) The cell's sole output of energy, adjusted after base metabolism, is reproduction, i.e., no flagellar motility is present. With these assumptions, the cell doubling time τ_D is estimated as the time it takes for the cell to produce enough ATP, beyond base metabolism, to pay for the manufacture of another cell. Thus, the doubling time τ_D can be expressed in terms of the ratio of the total ATP cost of manufacturing a new cell and the total ATP production rate in the entire cell; the former is given by the total dry mass of the cell M_{cell} divided by the ATP yield Y_{ATP} ; the latter is the product of the number of chromatophores per cell and the ATP production rate per chromatophore. It follows that

$$\tau_D(I) = \frac{M_{\text{cell}}(I)/Y_{\text{ATP}}}{N_{\text{chrom}}(I)\tilde{k}_{\text{ATP}}(I)}, \quad (12)$$

where N_{chrom} is the number of chromatophores per cell; both M_{cell} and N_{chrom} are assumed to be dependent on light intensity during growth. In Eq. (12), the stoichiometry-adjusted rate $\tilde{k}_{\text{ATP}}(I)$ from Eq. (8) is employed for the ATP production rate per chromatophore because illumination levels were constant during each cell growth cycle, i.e., the instantaneous illumination incident on a vesicle at a given moment was always identical to the illumination that determined the vesicle stoichiometry at the time of the vesicle's growth.

In Eq. (12), the number of chromatophores per cell $N_{\text{chrom}}(I)$ is determined directly from the vesicle counts obtained from whole cell spectra shown in Fig. 3C, using a nonlinear interpolation for intermediate illumination values (see Fig. 3E). As observed also in tomography images,^{29,47} the chromatophore count per cell depends on the light intensity at growth, corresponding to a near-dense packing of vesicles at low light-growth (see Fig. 1A).

The dry cell mass M_{cell} used in Eq. (12) is assumed to be dependent on the chromatophore content in the cell as follows

$$M_{\text{cell}}(I) = M_0 + N_{\text{chrom}}(I)M_{\text{chrom}}, \quad (13)$$

where M_0 denotes the dry mass of the non-chromatophore portion of the cell. The dry cell mass corresponding to the dense packing of chromatophores at low light-growth shown in Fig. 1A is estimated from the volume of a *Rba. sphaeroides* cell, considered to be a cylinder with a diameter of $0.6 \mu\text{m}$ and a length of $1.5 \mu\text{m}$ ⁴⁷ and a dry mass ratio of 0.3 ,⁴⁸ which yields a value of 1.3×10^{11} Da. The term M_0 is estimated by considering the low light limit of Eq. (13): at a growth illumination of $1.5 \mu\text{mol m}^{-2} \text{s}^{-1}$ the observed pigment count corresponds to $N_{\text{chrom}} = 2927$ vesicles (see Fig. 3C,E); substituting this value into Eq. (13) yields $M_0 = 4.0 \times 10^{10}$ Da.

With the illumination dependence of the terms, $M_{\text{cell}}(I)$, $N_{\text{chrom}}(I)$, $\tilde{k}_{\text{ATP}}(I)$, thus determined, Eq. (12) permits an estimation of the doubling time of *Rba. sphaeroides* at different growth light intensities. Comparing Eq. (12) with Eqs. (9–11), the cell doubling time τ_D can be expressed in terms of the stoichiometry-adjusted ROI time $\tilde{\tau}_{\text{ROI}}$ of the chromatophore and the mass ratio of chromatophore vesicles in the cell

$$\tau_D(I) = \frac{\tilde{\tau}_{\text{ROI}}(I)}{\eta_{\text{chrom}}(I)}, \quad (14)$$

where the chromatophore mass ratio η_{chrom} is given by

$$\eta_{\text{chrom}}(I) = \frac{M_{\text{chrom}} N_{\text{chrom}}(I)}{M_{\text{cell}}(I)}. \quad (15)$$

The estimate for $\eta_{\text{chrom}}(I)$ using Eqs. (15,13) based on the observed chromatophore count $n_{\text{chrom}}(I)$ (Fig. 3E) is shown in Fig. 3F.

The cell doubling time τ_D computed according to Eq. (14) is shown in Fig. 4 (solid line), along with τ_D values corresponding to the theoretical maximum ATP yield $Y_{\text{ATP}}^{\text{max}}$ (dotted line), and compared with the experimentally observed doubling times (circles) obtained from the exponential phase of growth curves at each light intensity from Fig. 3A,B.

Results and Discussion

Based on the experimental and computational framework outlined above, the performance of the chromatophore as a solar energy harvesting device is quantified and related to the reproductive success of its host organism as measured by the cell doubling time. A comparison is provided between the ROI time and the benefit-to-cost ratio for the chromatophore and for photovoltaic and fossil fuel based energy systems.

Return-on-investment as a performance metric of a photosynthetic system and comparison with artificial energy solutions

The ROI time of the chromatophore, computed according to Eq. (9), is $\tau_{\text{ROI}} = 4.5\text{--}2.6$ hours in the illumination range of $10\text{--}100 \mu\text{mol photons m}^{-2} \text{ s}^{-1}$, respectively, for the low light-growth vesicle stoichiometry \tilde{s}_{low} ; $\tau_{\text{ROI}} = 4.4\text{--}2.1$ hours in the same illumination range for the high light-growth vesicle stoichiometry \tilde{s}_{high} (see Fig. 2B). Further increase of illumination does not correspond to a significant reduction of the ROI time for either vesicle, which attains at the illumination of $1000 \mu\text{mol photons m}^{-2} \text{ s}^{-1}$ the lower limit of 2.3 hours for the low light-growth vesicle and 1.9 hours for the high light-growth vesicle. At an extreme low illumination of $1 \mu\text{mol photons m}^{-2} \text{ s}^{-1}$, the corresponding ROI times are 33.0 hours and 40.2 hours, respectively.

The ROI time τ_{ROI} can be considered as a performance metric with lower return times representing a greater advantage for the host organism. Accordingly, based on the aforementioned τ_{ROI} values, the low light-growth vesicle performs 10% better than the high light-growth vesicle at $1 \mu\text{mol photons m}^{-2} \text{ s}^{-1}$, whereas the high light-growth vesicle performs 24% better than the low light-growth vesicle at $1000 \mu\text{mol photons m}^{-2} \text{ s}^{-1}$.

The ROI times for the low light-growth and high light-growth vesicles at the specific illuminations corresponding to their own growth conditions are given by the stoichiometry-adjusted ROI time $\tilde{\tau}_{\text{ROI}}$ according to Eq. (11). Assuming values for the low light illumination of $30 \mu\text{mol photons m}^{-2} \text{ s}^{-1}$ and for the high light illumination of $1000 \mu\text{mol photons m}^{-2} \text{ s}^{-1}$ results in stoichiometry-adjusted ROI times of $\tilde{\tau}_{\text{ROI,low}} = 3.1$ hours and $\tilde{\tau}_{\text{ROI,high}} = 1.9$ hours, respectively; i.e., when considered at their native illumination conditions the high light-growth vesicle performs 63% more effectively than the low light-growth vesicle in returning ATP investment.

The value assumed for the so-called ATP yield Y_{ATP} ,⁴³ in grams of dry cell mass generated per mol-ATP, is a direct multiplicative factor in determining τ_{ROI} as discussed in the Methods section. Employing the theoretical upper limit $Y_{\text{ATP}}^{\text{max}}$ instead of Y_{ATP} would correspond the lowering of the aforementioned values of τ_{ROI} and $\tilde{\tau}_{\text{ROI}}$ by a uniform factor of 1.5. In principle, the growth condition dependence of $Y_{\text{ATP}}(I)$, currently assumed to be constant, with respect to changes in cell composition as a function of illumination needs to be considered in estimating $\tilde{\tau}_{\text{ROI}}$, when such data becomes available.

The concept of ROI is used frequently as a decision making tool for evaluating the performance of human-engineered systems.^{27,28} In such a context, it is customary to express ROI as a benefit-to-cost ratio obtained by integrating the rate of return over the expected lifetime of the system, i.e., the ratio of the total return to the initial investment. For a photosynthetic system, such a benefit-to-cost ratio R can be expressed in comparison with Eq. (9), if the expected lifetime T of the vesicle is known, as follows

$$R(I) = \frac{T}{\tau_{\text{ROI}}(I)}. \quad (16)$$

It is difficult to determine the lifetime T of a chromatophore in order to compute its benefit-to-cost ratio R . Chromatophore vesicles appear to have lifetimes that exceed the doubling time of the cell as daughter cells inherit intact chromatophores from the parent cell.; changes in chromatophore activity and composition in response to changes in growth conditions are observed for time ranges from hours to days with chromatophore activity lasting up to 11 days.¹² As an example, let us consider the low light-growth chromatophore (Fig. 1B) under a typical low light illumination of $30 \mu\text{mol photons m}^{-2} \text{ s}^{-1}$, which, as indicated previously, corresponds to $\tilde{\tau}_{\text{ROI,low}} = 3.1$ hours. Assuming a vesicle lifetime of $T = 10$ days¹² in Eq. (16), along with the aforementioned value for $\tilde{\tau}_{\text{ROI,low}}$, yields a benefit-to-cost ratio of $R = 77$; i.e., the low light-growth chromatophore considered above generates, during its typical

operational lifetime, enough ATP to produce almost 80 other chromatophores. The high light-growth vesicle, \tilde{s}_{high} , operating under an illumination of $1000 \mu\text{mol photons m}^{-2} \text{s}^{-1}$ corresponds to a value of $R = 126$, if the same value of T is used for the vesicle lifetime.

The aforementioned values of R represent energy returned per energy invested for the manufacturing of the chromatophore only, i.e., they do not take into account metabolic processes in the rest of the cell that produces the chromatophore. The cost of the non-chromatophore portions of the cell are accounted in the determination of the cell doubling time, as discussed in the Methods section (Eqs. (12)–(15)) as well as the following section. It is expected that for a biological system to be viable, its benefit-to-cost ratio R is required to be above 1 and that the selective pressure of evolution would drive R progressively higher as a result of competition between species.

Using energy as a currency for a cost-benefit analysis permits a direct comparison between biological and synthetic energy solutions. The benefit-to-cost ratio R in Eq. (16) is akin to the so-called ‘energy return on energy investment’ (EROI) used to evaluate photovoltaic and fossil fuel based energy systems.⁴⁹ Currently, the EROI for global oil is estimated to be $R \sim 10\text{--}30$; for photovoltaic systems the corresponding value is $R \sim 19\text{--}38$.⁴⁹ When these R values are compared with the aforementioned value of $R = 77$ for a low light-growth chromatophore operated at a low light intensity, the chromatophore appears to display a performance that is 2–8 times better than photovoltaic or fossil fuel based energy systems as measured by the return on energy investment. Notably, the ROI in the case of photovoltaic systems is based on an operational lifetime of 30 years,⁴⁹ which corresponds to a $\tau_{\text{ROI,PV}} \sim 0.8\text{--}1.6$ years, i.e., approximately 3–4 orders of magnitude longer than the τ_{ROI} values presented above for the chromatophore.

The comparisons thus provided between biological and synthetic systems based on the ROI time τ_{ROI} and the benefit-to-cost ratio R for energy expenditure should be regarded with caution. Efficiency for biomass production in plants is significantly lower than the thermodynamic efficiency of energy conversion into ATP.¹⁵ Furthermore, a photosynthetic vesicle is not a stand-alone device, but must be considered in the context of its host organism, effectively paying for the overhead costs for other cellular processes, thereby lowering its apparent efficiency.

Cell doubling time as a function of illumination

The cell doubling time τ_D of *Rba. sphaeroides* determined in this study is shown in Fig. 4 for both experimentally obtained values (circles), based on the exponential phase of growth curves at each illumination measured through OD_{680} (Fig. 3A,B), and for computationally obtained values (solid line), based on Eq. (14), as discussed in the Methods section. The computationally expressed value of the cell doubling time τ_D can be viewed as the stoichiometry-adjusted ROI time for the entire cell instead of a single, isolated chromatophore. In other words, in the absence of any energy input other than photosynthesis and any energy output beyond base metabolism other than reproduction, the cell doubling time equals the time it takes for the cell to pay the investment cost in energy for the construction of another cell. Thus, Eq. (14) expresses τ_D in terms of $\tilde{\tau}_{\text{ROI}}$, modified by the

mass ratio η_{chrom} of the photosynthetic apparatus of the cell, with the latter quantity determined experimentally (Fig. 3C–F). As in the case of $\tilde{\tau}_{\text{ROI}}$, the computed values for τ_D are multiplicatively dependent on the value assumed for the ATP yield Y_{ATP} . For comparison, the cell doubling time values corresponding to the theoretical upper limit of the ATP yield $Y_{\text{ATP}}^{\text{max}}$ are also shown in Fig. 4 (dotted line). The effect of possible light condition dependence of Y_{ATP} on τ_D is not considered.

Maximal levels of cell growth are seen for illuminations greater than $100 \mu\text{mol photons m}^{-2} \text{s}^{-1}$ (Fig. 4), which matches the saturation behavior displayed by the ROI time τ_{ROI} for the same illumination threshold in case of both low light-growth and high light-growth vesicle compositions (Fig. 2B). A similar saturation behavior is also partly present for the number of chromatophore vesicles in the cell, which gradually approach a lower limit with increasing light intensity (Fig. 3E). Notably, the residual increase in ATP production per chromatophore between illumination values of $100\text{--}1000 \mu\text{mol photons m}^{-2} \text{s}^{-1}$, given by Eq. (8), corresponds to a comparable decrease in the chromatophore count per cell, given in Fig. 3E. This results in the aforementioned saturation of the cell doubling time, as governed by Eq. (14), at illuminations above $100 \mu\text{mol photons m}^{-2} \text{s}^{-1}$ for both experimentally determined and computed values (Fig. 4).

For the low illumination range of $10\text{--}100 \mu\text{mol photons m}^{-2} \text{s}^{-1}$ the computed cell doubling time τ_D is within approximately 40% of the experimentally observed values of 8.2–3.9 hours, respectively (Fig. 4). At extreme low and high illumination values, Fig. 4 displays systematic deviations between the experimentally observed and computed values of the cell doubling time. At the high light limit ($1000 \mu\text{mol photons m}^{-2} \text{s}^{-1}$), the observed cell doubling time is 3.7 hours whereas the computed cell doubling time is 6.4 hours, which constitutes an overestimation by the computed value of a factor 1.7. At extreme low light illumination ($1 \mu\text{mol photons m}^{-2} \text{s}^{-1}$), the observed cell doubling time is 20.3 hours whereas the computed cell doubling time is 45.1 hours, which constitutes an overestimation by the computed value of a factor 2.2.

The deviations between the observed and computed values of cell doubling time at the extreme low light and high light limits are likely a combination of multiple factors. First, the atomic detail structural model that is used as the basis of the current study¹⁴ is specifically a low light-growth vesicle (Fig. 1B); the effects of growth-dependent vesicle composition on the ATP production rate are incorporated only as interpolations¹⁴ upon this known vesicle composition and are subject to deviations at both ends of the growth conditions. Second, the value of the so-called ATP yield Y_{ATP} is assumed to be constant for all growth conditions as well as being uniform across all cellular compartments, whereas it is plausible that the efficiency of biomass generation represented by this quantity is, in fact, dependent on growth condition and corresponding cell composition. Third, the model presented here for relating energy expenditure to cell doubling (Eq. (14)) assumes the absence of any energy input other than photosynthesis and any energy consumption other than reproduction and base metabolism, which is difficult to control physiologically.

Conclusions

The fundamental energy conversion processes in the purple bacterium *Rba. sphaeroides* are described in an integrative structure-function formulation as a function of illumination, starting from the atomic detail structural models of the photosynthetic vesicle, chromatophore, determined over a decade of combined experimental and computational inquiries.^{14,21–23} The model presented allows the computation of: first, the ATP production rate per vesicle; second, the energy ROI paid back when the vesicle is considered as an energy harvesting device; third, the cell doubling time of the bacterium for photosynthetic growth expressed as the time it takes for the entire cell to pay the energy investment necessary to construct a new cell.

The results presented in this study constitute a rare circumstance where a cell scale observable, namely the cell doubling time, is directly derivable from a structural and functional model that incorporates atomic detail descriptions of constituent components. The approach presented comprises a modular, multi-scale description of energy conversion subprocesses that permit the enhancing of the detail level of any subprocess as the corresponding experimental data and computational frameworks improve. For example, the rate limiting energy conversion step of charge carrier diffusion,^{8,9,14} currently incorporated heuristically based on experimental observations of quinol cycle time^{12,40} in a steady-state, spatially homogenous description, can be replaced by an explicit diffusion model as future computational capabilities permit. Similarly, the approach employed in this study can be used to determine cell doubling times in other photosynthetic species as structural and functional models become available for cyanobacterial and plant cells, and for non-photosynthetic species, if the energy conversion models presented herein are replaced with appropriate metabolic models for energy conversion.

By considering energy as a unit of currency, the ROI formulation employed in this study provides an integrative performance metric for bioenergetic systems and permits a quantitative comparison of bioenergetic systems, from organelles to whole cells, between different species as well as with human-engineered energy harvesting systems. The ROI time τ_{ROI} , essentially the time for the payback of energy investment, for a chromatophore is 3–4 orders of magnitude shorter than the corresponding ROI time for photovoltaic systems. The benefit-to-cost ratio R , expressed as the return on energy investment integrated over the lifetime of the system, is 2–8 times greater for the chromatophore, operating under low light conditions typical of the purple bacterial habitat, than the corresponding values for photovoltaic and fossil fuel based energy harvesting systems. It is plausible that the photosynthetic mechanisms employed by cyanobacteria and plants display substantially improved values of τ_{ROI} and R over that of the purple bacterial values presented here. A rationale for evolutionary selection can be formulated through a quantification of performance via the ROI formulation thus presented.

Rational design of bioengineered energy solutions can be enhanced by considering the performance of a photosynthetic device quantified in terms of ROI time τ_{ROI} and the benefit-to-cost ratio R formulated here. Pigment and protein level innovations for bio-hybrid systems eventually need to be considered in terms of their system-level impact and evaluated

in regard to improvements in overall performance as measured by the return on the initial investment in energy.

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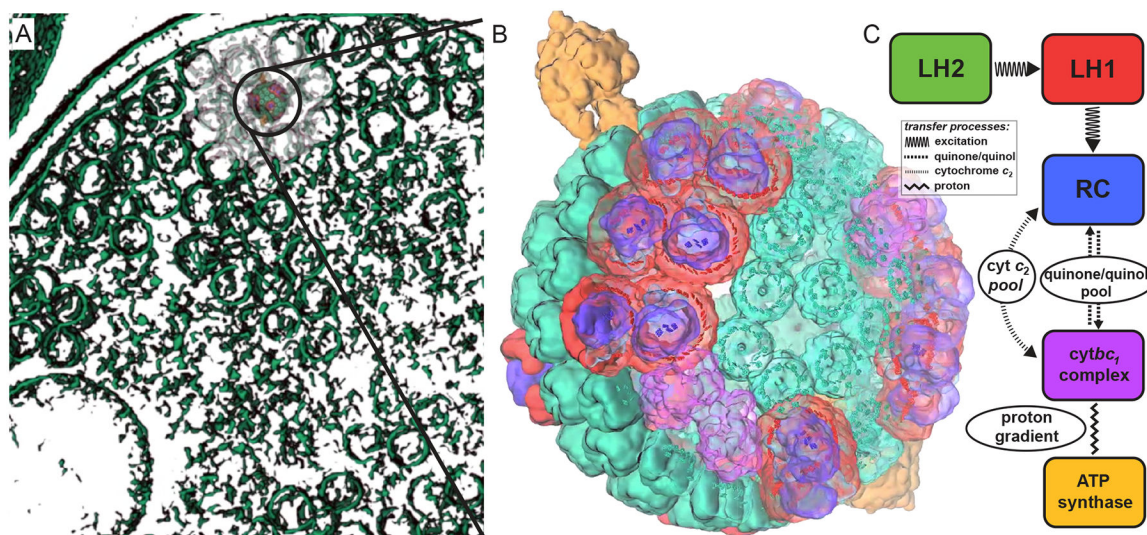


Figure 1:

Organization of the photosynthetic apparatus of *Rba. sphaeroides*. (A) Under low light conditions the bacterium displays a dense packing of chromatophore vesicles²⁰ as seen in this tomography images from Ref.²⁹ (B) The atomic detail structural model of the low light-adapted chromatophore¹⁴ shown contains 63 LH2 complexes (green), 11 dimeric and 2 monomeric RC-LH1-PufX complexes (LH1:red; RC:blue; PufX:lime), 4 cytochrome bc_1 dimers (magenta), and 2 ATP synthases (orange), shown in surface representation; bacteriochlorophylls are represented by their porphyrin rings. (C) Energy transfer and conversion processes in the chromatophore include excitation transfer, diffusion of the charge carriers, cytochrome c_2 and quinone, generation of a proton gradient, and ATP synthesis.

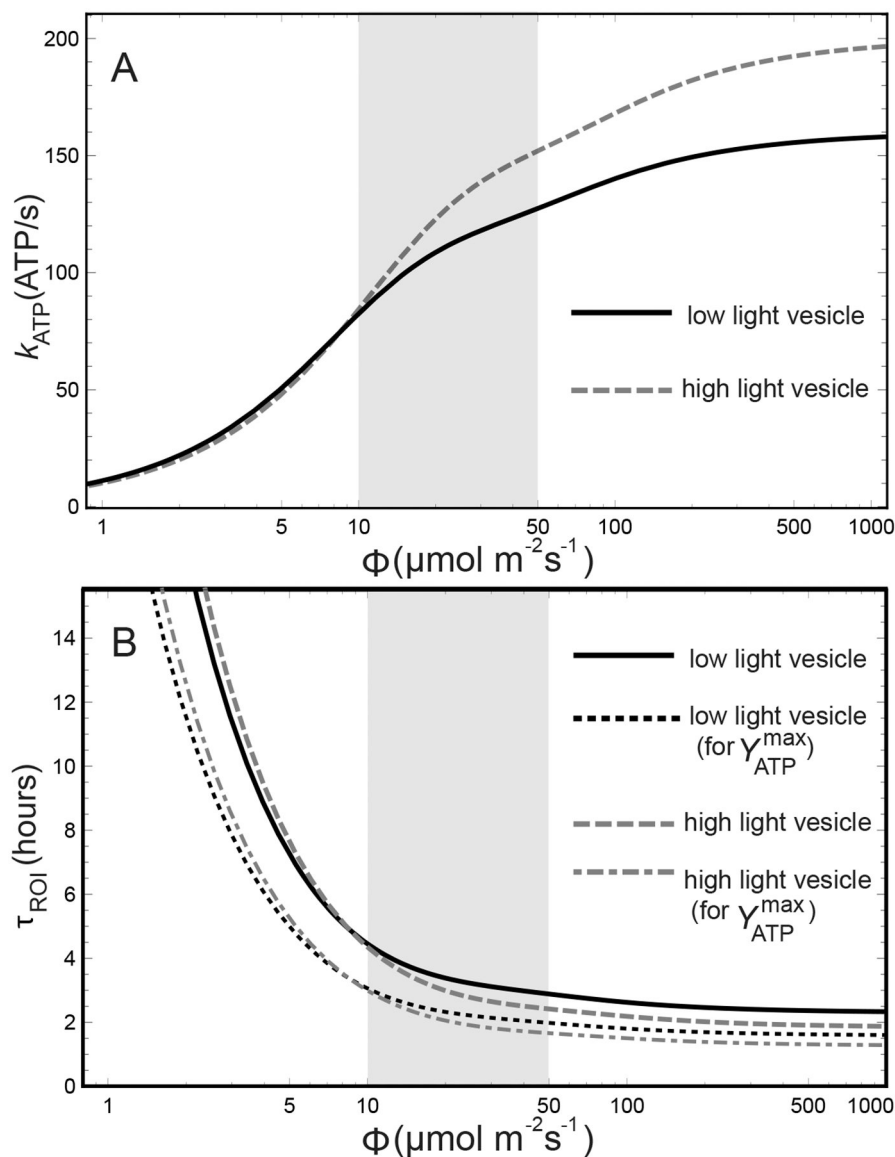


Figure 2:

ATP production rate and return-on-investment time of a chromatophore vesicle. (A) The ATP production rate k_{ATP} as a function of illumination Φ is computed following Ref.¹⁴ for the low light-growth vesicle (black, solid) as shown in Fig. 1B as well as a high light-growth vesicle (gray, dashed), comprising 15 LH1-RC-PufX dimers, 5 *cytbc*₁ dimers, and 47 LH2 complexes, corresponding to a BChl-per-RC ratio change of 0.53 from low light to high light as reported in Ref.¹² (B) The return-on-investment time, τ_{ROI} , namely, the time it takes for the chromatophore to make enough ATP for constructing another chromatophore, is shown for the aforementioned low light-growth (black, solid) and high light-growth (gray, dashed) vesicle compositions, computed according to Eq. (9). Also shown are the τ_{ROI} values corresponding to the theoretical maximum value of the ATP yield $\gamma_{\text{ATP}}^{\text{max}}$ as reported in Ref.⁴³ (black, dotted: low light-growth vesicle; gray, dot-dashed: high light-growth vesicle). The shaded region in both graphs indicates an illumination range of 10–50 $\mu\text{mol photons m}^{-2} \text{s}^{-1}$

corresponding to the typical low light habitat of purple bacteria, whereupon also the chromatophore structural model¹⁴ (Fig. 1B) is based.

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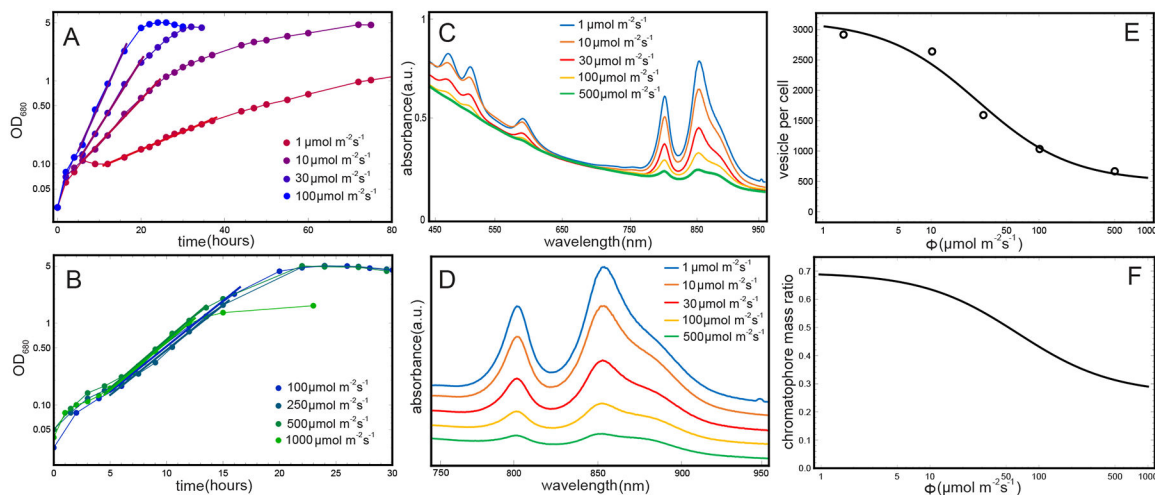


Figure 3:

The growth rate and chromatophore content of *Rba. sphaeroides* as a function of illumination. (A) Growth rate under anaerobic conditions at room temperature determined from OD_{680} for the illuminations $1 \mu\text{mol m}^{-2} \text{s}^{-1}$, $10 \mu\text{mol m}^{-2} \text{s}^{-1}$, $30 \mu\text{mol m}^{-2} \text{s}^{-1}$, $100 \mu\text{mol m}^{-2} \text{s}^{-1}$; for clarity, illumination values above $100 \mu\text{mol m}^{-2} \text{s}^{-1}$ are shown separately in (B). The exponential growth phase for each illumination is indicated by a linear fit, the inverse slope of which determines the cell doubling time (shown in Fig. 4). (B) Same as (A) but for the illuminations $100 \mu\text{mol m}^{-2} \text{s}^{-1}$, $250 \mu\text{mol m}^{-2} \text{s}^{-1}$, $500 \mu\text{mol m}^{-2} \text{s}^{-1}$, $1000 \mu\text{mol m}^{-2} \text{s}^{-1}$. It is seen that above $100 \mu\text{mol m}^{-2} \text{s}^{-1}$, the growth rate of *Rba. sphaeroides* saturates, resulting in near-identical doubling times (Fig. 4). (C) Whole cell absorbance spectra were obtained in order to determine the chromatophore content of *Rba. sphaeroides* at each illumination (see Methods). (D) Absorbance spectra of pigments from (C), separated for clarity. (E) The number of chromatophore vesicles per cell N_{chrom} (circles) estimated from the spectra shown in (C) and the nonlinear fit (solid line) used to interpolate N_{chrom} at intermediate illuminations. (F) The chromatophore mass ratio η_{chrom} of the cell estimated from the chromatophore count shown in (E) based on Eq. (15).

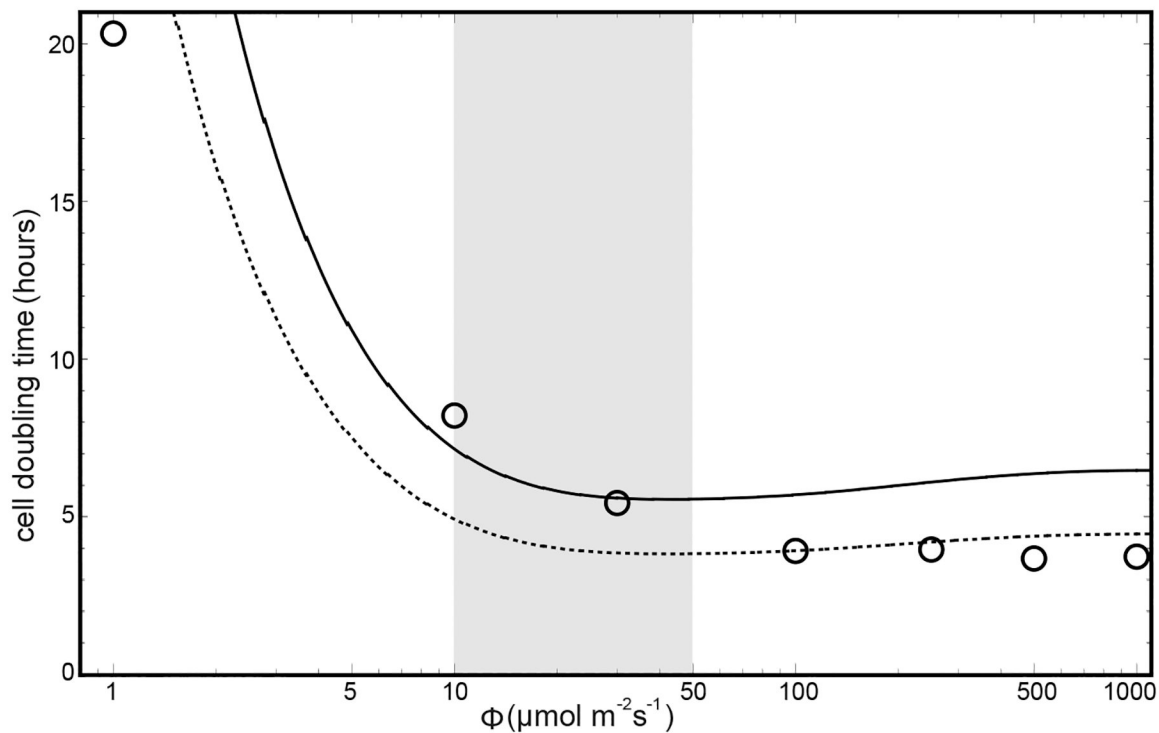


Figure 4:

The comparison of observed and computed cell doubling times for *Rba. sphaeroides* as a function of illumination. The observed doubling times (circles) are determined by the inverse slope of the linear fit to the exponential phase of each growth curve shown in Fig. 3A,B. The computed doubling time (solid line) is governed by Eq. (14). Also shown is the doubling time that corresponds to the theoretical maximum value of the ATP yield $Y_{\text{ATP}}^{\text{max}}$ reported in Ref.⁴³ (dotted line). The shaded region highlight the low light illumination range of 10–50 $\mu\text{mol photons m}^{-2} \text{s}^{-1}$ typical of purple bacterial growth.