

# pH determines the energetic efficiency of the cyanobacterial CO<sub>2</sub> concentrating mechanism

Niall M. Mangan<sup>a,1</sup>, Avi Flamholz<sup>b,1</sup>, Rachel D. Hood<sup>b</sup>, Ron Milo<sup>c</sup>, and David F. Savage<sup>b,d,2</sup>

<sup>a</sup>Department of Applied Mathematics, University of Washington, Seattle, WA 98195; <sup>b</sup>Department of Molecular and Cell Biology, University of California, Berkeley, CA 94720; <sup>c</sup>Department of Plant and Environmental Sciences, Weizmann Institute of Science, Rehovot 76100, Israel; and <sup>d</sup>Department of Chemistry, University of California, Berkeley, CA 94720

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Many carbon-fixing bacteria rely on a CO<sub>2</sub> concentrating mechanism (CCM) to elevate the CO<sub>2</sub> concentration around the carboxylating enzyme ribulose biphosphate carboxylase/oxygenase (RuBisCO). The CCM is postulated to simultaneously enhance the rate of carboxylation and minimize oxygenation, a competitive reaction with O<sub>2</sub> also catalyzed by RuBisCO. To achieve this effect, the CCM combines two features: active transport of inorganic carbon into the cell and colocalization of carbonic anhydrase and RuBisCO inside proteinaceous microcompartments called carboxysomes. Understanding the significance of the various CCM components requires reconciling biochemical intuition with a quantitative description of the system. To this end, we have developed a mathematical model of the CCM to analyze its energetic costs and the inherent intertwining of physiology and pH. We find that intracellular pH greatly affects the cost of inorganic carbon accumulation. At low pH the inorganic carbon pool contains more of the highly cell-permeable H<sub>2</sub>CO<sub>3</sub>, necessitating a substantial expenditure of energy on transport to maintain internal inorganic carbon levels. An intracellular pH  $\approx$  8 reduces leakage, making the CCM significantly more energetically efficient. This pH prediction coincides well with our measurement of intracellular pH in a model cyanobacterium. We also demonstrate that CO<sub>2</sub> retention in the carboxysome is necessary, whereas selective uptake of HCO<sub>3</sub><sup>-</sup> into the carboxysome would not appreciably enhance energetic efficiency. Altogether, integration of pH produces a model that is quantitatively consistent with cyanobacterial physiology, emphasizing that pH cannot be neglected when describing biological systems interacting with inorganic carbon pools.

carbon fixation | RuBisCO | cyanobacteria | inorganic carbon | systems biology

Cyanobacteria and many other autotrophs use a CO<sub>2</sub> concentrating mechanism (CCM) to increase the cellular pool of inorganic carbon and facilitate the Calvin–Benson–Bassham (CBB) cycle (1). Specifically, the CCM functions to supply CO<sub>2</sub> to ribulose biphosphate carboxylase/oxygenase (RuBisCO), the primary carboxylating enzyme of the CBB cycle. High levels of CO<sub>2</sub> are essential to cyanobacterial metabolism because RuBisCO has relatively slow carboxylation kinetics and is promiscuous, catalyzing an off-pathway reaction with O<sub>2</sub> called oxygenation (2–4).

RuBisCO oxygenation produces 2-phosphoglycolate (2PG), which is not part of the CBB cycle and must be recycled. Recycling 2PG through photorespiratory pathways is costly, consuming reduced carbon and energy resources (5, 6). The problem of RuBisCO's limited specificity is all the more pronounced because there is  $\approx$  20 times more O<sub>2</sub> than CO<sub>2</sub> in aqueous solutions equilibrated with present-day atmosphere (*SI Appendix, Fig. S1*). CCMs overcome these problems by concentrating CO<sub>2</sub> near RuBisCO, favorably increasing the ratio of CO<sub>2</sub> to O<sub>2</sub>. High concentrations of CO<sub>2</sub> maximize the rate of carboxylation and competitively inhibit oxygenation. Indeed, it is widely thought that the evolution of CCMs served to ameliorate energetic costs associated with large photorespiratory fluxes in the present-day atmosphere (7).

Based on diverse experimental studies, a convincing model of the bacterial CCM has emerged (Fig. 1) wherein the CCM has two primary components: active accumulation of inorganic carbon (Ci) in the cytosol and organization of RuBisCO with carbonic anhydrase (CA) inside proteinaceous organelles called carboxysomes (8). Perturbations to either component disrupt the CCM and produce mutants that require elevated CO<sub>2</sub> for growth (9, 10). Two energetically activated transport mechanisms—HCO<sub>3</sub><sup>-</sup> transport and facilitated uptake of CO<sub>2</sub>—enable accumulation of bicarbonate (HCO<sub>3</sub><sup>-</sup>) in the cytosol (8). HCO<sub>3</sub><sup>-</sup> transport is generally coupled to Na<sup>+</sup> gradients or ATP hydrolysis and facilitated uptake is hypothesized to couple oxidation of NAD(P)H to unidirectional hydration of CO<sub>2</sub> (Fig. 1) (8). Accumulation of charged HCO<sub>3</sub><sup>-</sup> is preferable to accumulation of CO<sub>2</sub> because HCO<sub>3</sub><sup>-</sup> escapes much less readily through the cell membrane, as we discuss below. Together, these uptake systems generate a cytosolic HCO<sub>3</sub><sup>-</sup> concentration >10 mM, which is  $\approx$  30 times the equilibrium concentration of HCO<sub>3</sub><sup>-</sup> in water at neutral pH at 25 °C (*SI Appendix, Fig. S1*) (11).

Carboxysomes are icosahedral compartments approximately 100 nm in diameter and composed of a protein shell surrounding an enzyme-filled lumen (12). The carboxysome lumen is densely packed (>400 mg protein/mL) with about 2,000 RuBisCO and 100 CA active sites (12). Because CA activity is absent from the cytosol and the spontaneous dehydration of HCO<sub>3</sub><sup>-</sup> to CO<sub>2</sub> is relatively slow (13), HCO<sub>3</sub><sup>-</sup> does not equilibrate with CO<sub>2</sub> in the cytosol (10). Rather, HCO<sub>3</sub><sup>-</sup> enters the carboxysome where CA activity readily equilibrates it with CO<sub>2</sub> (10). Crucially, the carboxysome shell

## Significance

Cyanobacteria are responsible for roughly 10% of global photosynthetic primary production of reduced carbon. Although cyanobacteria are incredibly diverse, all known species contain a complex protein system called the CO<sub>2</sub> concentrating mechanism (CCM), which enables rapid growth even in environments with extremely limited CO<sub>2</sub>. The CCM enables cyanobacteria to accumulate HCO<sub>3</sub><sup>-</sup> and convert this inorganic carbon pool to utilizable CO<sub>2</sub>. We demonstrate here that a quantitative description of the CCM must include the effect of pH on the abundance of HCO<sub>3</sub><sup>-</sup> and H<sub>2</sub>CO<sub>3</sub>. This pH-dependent description is consistent with cyanobacterial physiology. Furthermore, the model predicts that alkaline cytosolic pH reduces the energetic cost of the CCM, consistent with pH measurements of photosynthesizing cyanobacteria.

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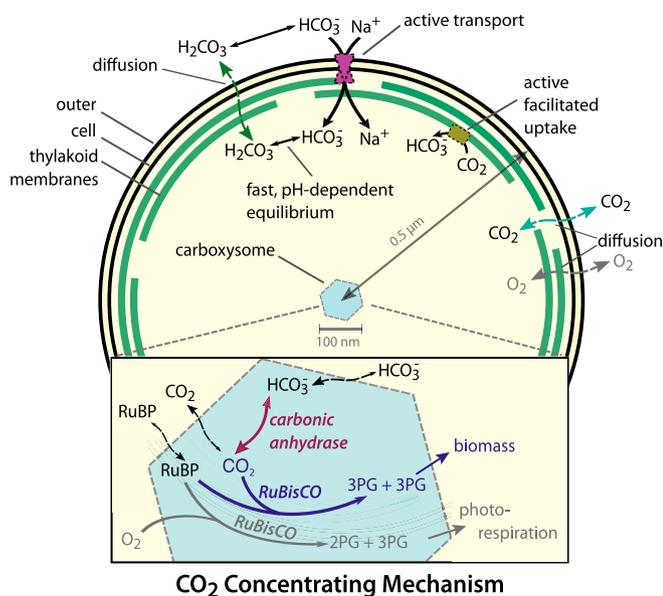
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<sup>1</sup>N.M.M. and A.F. contributed equally to this work.

<sup>2</sup>To whom correspondence should be addressed. Email: savage@berkeley.edu.

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**Fig. 1.** Schematic of the generally accepted model of the cyanobacterial CCM. The cyanobacterial CCM concentrates  $\text{HCO}_3^-$  in the cytosol via two classes of uptake systems: transporters and facilitated uptake systems. We focus on  $\text{Na}^+$ -activated transporters, which transport one  $\text{Na}^+$  with each  $\text{HCO}_3^-$ . Facilitated uptake of  $\text{CO}_2$  is catalyzed by proteins on the thylakoid membrane and is thought to couple NAD(P)H oxidation to the vectorial conversion of  $\text{CO}_2$  into  $\text{HCO}_3^-$ . Roughly 250 RuBisCOs (2,000 active sites) and 100 CAs are localized to the carboxysome.  $\text{HCO}_3^-$  concentrated in the cytosol enters the carboxysome, where it is converted to a high  $\text{CO}_2$  concentration by CA activity. This elevated  $\text{CO}_2$  concentration increases the rate of RuBisCO carboxylation and competitively inhibits oxygenation, increasing the overall efficiency of carbon fixation. For parameter values and model details see *SI Appendix*. References for each model component are given in the main text. 3PG, 3-phosphoglycerate.

must slow the diffusive loss of  $\text{CO}_2$  so that CA activity produces a locally elevated carboxysomal  $\text{CO}_2$  concentration (9). At sufficiently high  $\text{CO}_2$  concentrations, RuBisCO is saturated, oxygenation is inhibited, and carboxylation proceeds at the maximum rate (1).

To define the regimes wherein the cyanobacterial CCM leads to efficient carbon fixation, we previously developed a reaction-diffusion model of the CCM (14). Even when presented with very low extracellular  $\text{CO}_2$  concentrations (i.e., very high relative  $\text{O}_2$  concentrations), the modeled CCM can saturate RuBisCO and drastically reduce oxygenation (14). Surprisingly, the model suggested that the CCM does not require selective uptake of  $\text{HCO}_3^-$  into the carboxysome, selective retention of  $\text{CO}_2$  inside the compartment, or exclusion of  $\text{O}_2$ . Rather, a nonspecific permeability barrier at the carboxysome shell could give rise to  $\text{CO}_2$ -concentrating activity. These results built upon previous models (7, 15–17) and further explained how CCM activity, which makes cyanobacterial growth largely insensitive to the environmental concentration of Ci, could arise from its known protein components.

An unexplained observation of our previous work was substantial leakage of  $\text{HCO}_3^-$  across the cell membrane, with >99% of carbon import leaking out of the cell as  $\text{HCO}_3^-$  (14). Because  $\text{HCO}_3^-$  accumulation is energetically driven, large leakage fluxes consume substantial energy and require an implausible fraction (>50%) of the membrane surface for transporters (*SI Appendix*). Here, we identify the cell membrane permeability to  $\text{HCO}_3^-$  as a key parameter determining leakage. All previous models of the CCM tracked only  $\text{HCO}_3^-$ , implicitly ignoring other species of hydrated Ci ( $\text{H}_2\text{CO}_3$ ,  $\text{HCO}_3^-$ , and  $\text{CO}_3^{2-}$ , which we collectively term  $\text{H}_{\text{total}}$ ) and their contribution to cell permeability (14–19). This implicit assumption is at odds with biochemical intuition

that charge is a major determinant of membrane permeability (20). Indeed, the often-cited permeability coefficient of  $\approx 3 \times 10^{-4}$  cm/s is representative of the uncharged  $\text{H}_2\text{CO}_3$  but three to four orders of magnitude too high for  $\text{HCO}_3^-$  and  $\text{CO}_3^{2-}$  (*SI Appendix*) (21, 22). A recent model of the minimal CCM of *Prochlorococcus* MED4 made the inverse assumption: that the cell membrane is negligibly permeable to  $\text{HCO}_3^-$ , implicitly ignoring the rapid interconversion of  $\text{HCO}_3^-$  with the uncharged and highly permeable  $\text{H}_2\text{CO}_3$  (23).

To reconcile these varying treatments and conduct a careful accounting of Ci species, we take advantage of pH as a key physiological parameter governing the composition of the Ci pool. The relative concentration of species in  $\text{H}_{\text{total}}$  ( $\text{H}_2\text{CO}_3$ ,  $\text{HCO}_3^-$ , and  $\text{CO}_3^{2-}$ ) depends strongly on pH (*SI Appendix*, Fig. S1). Because these species differ in their net charge, pH will influence the rate of Ci leakage from the cell and the energetic costs associated with carbon accumulation. Because RuBisCO and CA activities are pH-dependent, the pH will also affect enzymatic rates inside the carboxysome. We have integrated these effects into our previous analytical and numerical models of the CCM (14) to produce a “pH-aware” model of the CCM, which is described in mathematical detail in *SI Appendix*.

The pH-aware model is now consistent with cyanobacterial physiology in a number of important ways. In optimal conditions, the model produces absolute fluxes that are similar to measured values and consistent with cyanobacterial growth rates. Unlike in previous models, these fluxes can be supported by transporters occupying a very small fraction of membrane surface area (<1%), leaving space for the essential biochemistry of transport, photosynthesis, and chemiosmosis (*SI Appendix*). Finally, characteristic differences in the Ci transport modalities used by oceanic and freshwater cyanobacteria can be explained through the pH-aware model by the characteristic pH and salinity differences between ocean and freshwater (*SI Appendix*). Given this broad consistency with cyanobacterial physiology and genetics, the pH-aware model can also be used to examine open questions related to the CCM.

Our updated, pH-aware model also enables us to test the hypothesis that the CCM reduces the energetic costs associated with fixing carbon. We calculate the effect of pH on the energetic cost of carbon fixation, carbon concentration, and photorespiration. According to our calculation, the CCM requires considerably less energy than implied by our previous model (*SI Appendix*). We further demonstrate that a selective carboxysome that prefers to take up  $\text{HCO}_3^-$  and retain  $\text{CO}_2$  is not required to produce an energy-efficient CCM. Rather, a low absolute permeability to  $\text{CO}_2$  is the crucial characteristic of an energy-efficient carboxysome. Moreover, the pH-aware model predicts an intracellular pH range that optimizes CCM efficiency in cyanobacteria actively fixing carbon. We validate this prediction by measuring the intracellular pH in live cyanobacterial cells (*Synechococcus elongatus* PCC 7942). Thus, the CCM offers another example where the properties of complex systems central to bacterial growth are well-explained by the principle of energetic cost minimization (24–26), in this case explaining the remodeling of cytosolic pH and transport modalities to minimize the cost of Ci accumulation for the CCM.

## Results

**The Effect of pH on the Permeability of Ci to the Cell Membrane.** All cells regulate their cytosolic pH due to the inherent pH dependence of biochemical reactions (27). However, cytosolic pH varies substantially between organisms and growth conditions (28, 29). Here, we use a mathematical model to examine how the cyanobacterial CCM functions over a range of cytosolic pH values. We include the effect of pH on the permeability of the cell membrane to constituents of the Ci pool and on the enzymatic activities located within the carboxysome.

The equilibrium composition of the Ci pool ( $\text{CO}_2$ ,  $\text{H}_2\text{CO}_3$ ,  $\text{HCO}_3^-$ , and  $\text{CO}_3^{2-}$ ) is highly pH-dependent (*SI Appendix*, Fig. S1). Whether these species reach equilibrium with each other, however, depends on how the rate of uncatalyzed interconversion compares to the rates of other processes (e.g., transport and enzymatic catalysis) that produce and consume specific species. The spontaneous dehydration of  $\text{H}_{\text{total}}$  to  $\text{CO}_2$  [ $T_{1/2} > 10$  s (13)] is much slower than diffusion and transport, and so the CCM can maintain  $\text{H}_{\text{total}}$  out of equilibrium with  $\text{CO}_2$  in the cytosol (10). Equilibration between  $\text{HCO}_3^-$ ,  $\text{H}_2\text{CO}_3$ , and  $\text{CO}_3^{2-}$  within the  $\text{H}_{\text{total}}$  pool is, however, extremely fast [ $T_{1/2} < 1$   $\mu\text{s}$  (30)]. As such, the dominant species among  $\text{HCO}_3^-$ ,  $\text{H}_2\text{CO}_3$ , and  $\text{CO}_3^{2-}$  will be determined by the pH, and so the contribution of each species to the cell permeability of  $\text{H}_{\text{total}}$  must be examined individually.

Due to the energetic penalty associated with the passage of charge into the membrane, small, charged molecules typically have membrane permeability coefficients  $10^4$  to  $10^5$  times smaller than uncharged molecules of comparable size (20). Consequently,  $\text{HCO}_3^-$  and  $\text{CO}_3^{2-}$  are dramatically less cell-permeable than the uncharged  $\text{H}_2\text{CO}_3$ . In addition to having a low membrane permeability,  $\text{CO}_3^{2-}$  contributes negligibly (<5%) to the  $\text{H}_{\text{total}}$  pool below pH 9 and can be neglected (*SI Appendix*). As such,  $\text{H}_2\text{CO}_3$  can be treated as a monoprotic acid equilibrating quickly with  $\text{HCO}_3^-$ . The primary literature on the permeability of small molecules gives permeability coefficients of  $\approx 10^{-3}$  cm/s for  $\text{H}_2\text{CO}_3$  and  $\approx 10^{-7}$  cm/s for  $\text{HCO}_3^-$  (21, 22).

Given these values, we assume  $k_m^{\text{H}_2\text{CO}_3} \ll k_m^{\text{HCO}_3^-}$  and derive that the rate of  $\text{H}_{\text{total}}$  diffusion across the membrane is dominated by the diffusion of uncharged  $\text{H}_2\text{CO}_3$

$$\text{diffusive } H_{\text{total}} \text{ flux} = k_m^{\text{H}_2\text{CO}_3} \Delta H_2\text{CO}_3 + k_m^{\text{HCO}_3^-} \Delta \text{HCO}_3^- \approx k_m^{\text{H}_2\text{CO}_3} \Delta H_2\text{CO}_3.$$

Here,  $\Delta H_2\text{CO}_3$  and  $\Delta \text{HCO}_3^-$  are the concentration differences of  $\text{H}_2\text{CO}_3$  and  $\text{HCO}_3^-$  across the cell membrane (see *SI Appendix* for derivation). To a first approximation,  $\text{H}_2\text{CO}_3$  is the only species of  $\text{H}_{\text{total}}$  that will cross the cell membrane diffusively at an appreciable rate, regardless of the relative concentrations of  $\text{H}_2\text{CO}_3$  and  $\text{HCO}_3^-$ .

The above equation describes the diffusion of  $\text{H}_{\text{total}}$  into the cell as a function of the  $\text{H}_2\text{CO}_3$  concentration gradient. However, the CCM model tracks  $\text{HCO}_3^-$  and not  $\text{H}_2\text{CO}_3$  because  $\text{HCO}_3^-$  is the substrate of CA. To integrate this equation into the CCM model, therefore, we assume fast equilibrium of the  $\text{H}_{\text{total}}$  pool and calculate the equilibrium ratio  $[\text{HCO}_3^-]/[\text{H}_2\text{CO}_3] = 10^{p\text{H} - pK_1}$  to determine  $\Delta H_2\text{CO}_3$  across the cell membrane. Because the concentration and composition of  $\text{H}_{\text{total}}$  may differ markedly across the cell membrane (due to differences in pH, ionic strength, and the action of Ci transporters), this substitution yields separate terms for the inward (first term) and outward (second term) diffusional velocities

$$\text{diffusive } \text{HCO}_3^- \text{ flux} = \left( [\text{HCO}_3^-]_{\text{out}} k_m^{\text{H}_2\text{CO}_3} 10^{(pK_1 - p\text{H}_{\text{out}})} - [\text{HCO}_3^-]_{\text{cytosol}} k_m^{\text{H}_2\text{CO}_3} 10^{(pK_1 - p\text{H}_{\text{cytosol}})} \right).$$

Here,  $k_m^{\text{H}_2\text{CO}_3} = 3 \times 10^{-3}$  cm/s is the velocity of  $\text{H}_2\text{CO}_3$  permeation and  $10^{(pK_1 - p\text{H})}$  is the ratio of  $\text{H}_2\text{CO}_3$  to  $\text{HCO}_3^-$  as a function of the pH and the first  $pK_a$  of  $\text{H}_2\text{CO}_3$  ( $pK_1 \approx 3.2$ ) (22, 31). This equation holds across the entire pH range considered here ( $6.5 \leq \text{pH} \leq 9$ ; see *SI Appendix* for full derivation). If the cytosolic and extracellular pH are equal, the pH-dependent velocity of  $\text{HCO}_3^-$  membrane permeation equals  $k_m^{\text{H}_2\text{CO}_3} 10^{(pK_1 - p\text{H})}$ , recovering a functional form equivalent to the previous model. At pH 7, this equation yields a velocity of  $\approx 5 \times 10^{-7}$  cm/s, 1,000-fold smaller

than the commonly used value of  $3 \times 10^{-4}$  cm/s (32, 33). Indeed, this higher effective velocity implies an implausible cytosolic pH of about 4 (*SI Appendix*).

**Functional Form of the pH-Aware CCM Model.** The pH-aware CCM model is a system of coupled reaction-diffusion differential equations in spherical coordinates. The equations describe the entry of Ci into the cell and the carboxysome as well as diffusion and the chemical reactions within the carboxysome. This system can be solved both numerically and analytically at steady state (14). We write the fluxes for  $\text{CO}_2$ ,  $C$ , and  $\text{HCO}_3^-$ ,  $H$ , at the cell membrane,  $r = R_b$ , as

$$D \frac{\partial C}{\partial r} = -\alpha C_{\text{cytosol}} + k_m^C (C_{\text{out}} - C_{\text{cytosol}})$$

$$D \frac{\partial H}{\partial r} = j_c H_{\text{out}} + \alpha C_{\text{cytosol}} + \left( [\text{HCO}_3^-]_{\text{out}} k_m^{\text{H}_2\text{CO}_3} 10^{(pK_1 - p\text{H}_{\text{out}})} - [\text{HCO}_3^-]_{\text{cytosol}} k_m^{\text{H}_2\text{CO}_3} 10^{(pK_1 - p\text{H}_{\text{cytosol}})} \right).$$

Here  $D$  is the diffusion constant for small molecules in water ( $10^{-5}$  cm<sup>2</sup>/s),  $j_c$  is the velocity of active  $\text{HCO}_3^-$  transport,  $\alpha$  is the velocity of  $\text{CO}_2$  to  $\text{HCO}_3^-$  conversion, and  $k_m^C$  and  $k_m^{\text{H}_2\text{CO}_3}$  are the permeability of the cell membrane to  $\text{CO}_2$  and  $\text{H}_2\text{CO}_3$ , respectively.  $k_m^C$  is set to 0.3 cm/s and  $k_m^{\text{H}_2\text{CO}_3} = 3 \times 10^{-3}$  cm/s as described above.

As previously discussed, the spontaneous dehydration of  $\text{HCO}_3^-$  is slow, so we assume no relevant chemical reactions in the cytosol (Fig. 1). We evaluate this assumption through a consistency check on the resulting model concentrations and fluxes and find it to be reasonable (*SI Appendix*). Therefore, diffusion sets the steady-state concentrations of  $\text{CO}_2$  and  $\text{HCO}_3^-$  in the cytosol via  $\nabla^2 C = 0$ ,  $\nabla^2 H = 0$ , where  $\nabla^2$  is the second derivative in spherical coordinates. Assuming the same carboxysome permeability,  $k_c$ , for both  $\text{CO}_2$  and  $\text{HCO}_3^-$ , diffusive leakage at the carboxysome shell is expressed as

$$D \frac{\partial C}{\partial r} = k_c (C_{\text{cytosol}} - C_{\text{carboxysome}})$$

$$D \frac{\partial H}{\partial r} = k_c (H_{\text{cytosol}} - H_{\text{carboxysome}})$$

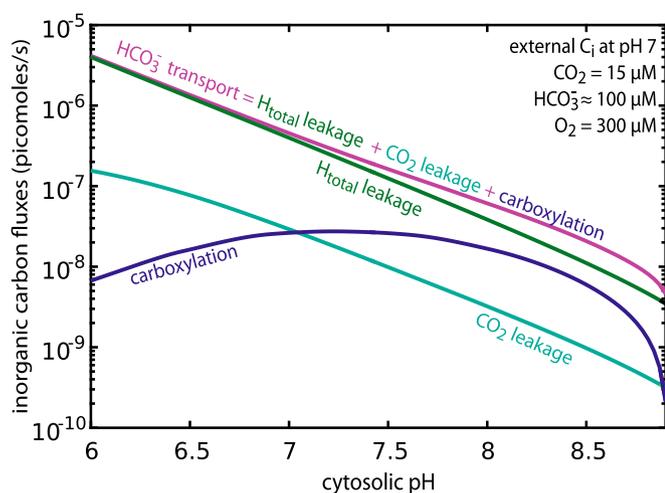
at  $r = R_c$ , the boundary of the carboxysome. The pH-aware model can also be used to consider differential carboxysome permeability to  $\text{CO}_2$  and  $\text{HCO}_3^-$ , as described in *Discussion* and *SI Appendix*. Inside the carboxysome, the model considers diffusion of substrates as well as CA ( $R_{CA}$ ) and RuBisCO ( $R_{\text{Rub}}$ ) activities. The balance of enzymatic and diffusive rates set the steady-state concentrations of  $\text{CO}_2$  and  $\text{HCO}_3^-$  in the carboxysome as

$$D \nabla^2 C + R_{CA} - R_{\text{Rub}} = 0$$

$$D \nabla^2 H - R_{CA} = 0,$$

where the enzymatic rates  $R_{CA}$  and  $R_{\text{Rub}}$  are depend on pH in the manner described below.

**The Effect of pH on Enzymatic Activity in the Carboxysome.** The enzymatic mechanisms of RuBisCO and CA are inherently pH-dependent (34), and so it is critical to include the pH dependence of these enzymes in describing the pH dependence of the CCM. The carboxysomal CA is an efficient enzyme, well described by reversible Michaelis–Menten kinetics, with a dehydration  $k_{\text{cat}} \approx 5 \times 10^5$  s<sup>-1</sup> (35). When the intrashellular CA is saturated,



**Fig. 2.** Increased cytosolic pH reduces Ci fluxes required to achieve efficient  $\text{CO}_2$  fixation. Ci fluxes are plotted as a function of pH. As carbon is conserved, the  $\text{HCO}_3^-$  transport flux (purple) equals the sum of  $H_{\text{total}}$  leakage (green),  $\text{CO}_2$  leakage (teal), and carboxylation (blue). RuBisCO achieves a maximum carboxylation rate near pH 7.5. Carboxysome permeability was set to  $3 \times 10^{-5}$  cm/s and  $\text{HCO}_3^-$  transport rate was set to yield 30 mM cytosolic  $\text{HCO}_3^-$  at each pH. The extracellular Ci pool was assumed to be in equilibrium with the external pH, which was fixed at 7 for this analysis. These fluxes neglect the uncatalyzed dehydration of  $\text{HCO}_3^-$ , which would act to increase  $\text{CO}_2$  leakage. Compensating for increased leakage would require a small increase in  $\text{HCO}_3^-$  transport (*SI Appendix*).

increased  $\text{HCO}_3^-$  transport has no effect on the carboxysomal  $\text{CO}_2$  concentration. As a result, saturated CA implies that  $\text{HCO}_3^-$  uptake could be lower without affecting the carboxylation rate (14). Therefore, efficient CCM function occurs, in part, when CA is not saturated. Because CA is a fast enzyme with  $\approx 100$  active sites in the carboxysome,  $\text{CO}_2$  and  $\text{HCO}_3^-$  are held in equilibrium within the carboxysome when CA is not saturated (*SI Appendix*). In this pseudoequilibrium condition, the ratio of  $\text{CO}_2$  to  $\text{HCO}_3^-$  in the carboxysome is determined by the pH dependence of the reaction equilibrium constant  $K'_{\text{eq}}(\text{pH}) = [\text{HCO}_3^-]/[\text{CO}_2]$ . We calculate the pH dependence of  $K'_{\text{eq}}$  from the Gibbs formation energies of the relevant species (27, 36). For reversible reactions such as the dehydration of bicarbonate, a modest change in the pH can have a large effect on  $K'_{\text{eq}}$ —about 10-fold between pH 7 and 8 (*SI Appendix*).

RuBisCO activity also varies with pH, with the carboxylation  $k_{\text{cat}}$  reaching maximum near pH 7.5 (34). We describe the RuBisCO reaction with irreversible Michaelis–Menten kinetics and assume RuBisCO kinetic parameters measured at pH 7.8 for the *S. elongatus* PCC 6301 RuBisCO. The pH dependence of RuBisCO kinetics was modeled by rescaling the Michaelis–Menten kinetic constants by the pH dependence observed for the cyanobacterial RuBisCO from *Anabaena variabilis* (*SI Appendix*, Fig. S4).

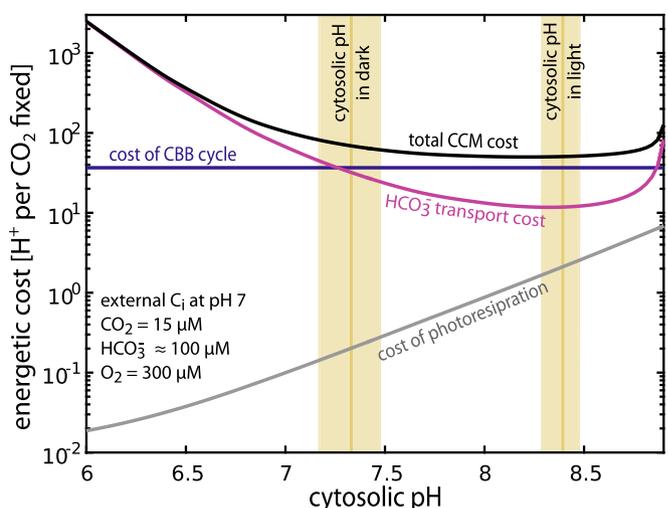
**A pH-Aware CCM Model.** With the pH dependence of permeability and enzymatic activity integrated into the model, we asked a simple question: What is the role of cytosolic pH in shaping the flow of carbon through the CCM? To answer this question, we calculated the  $\text{HCO}_3^-$  transport flux required to achieve the measured  $\approx 30$  mM cytosolic  $\text{HCO}_3^-$  concentration (37–39) across a range of cytosolic pH values (Fig. 2). For this calculation, the carboxysome permeability was set to  $3 \times 10^{-5}$  cm/s (optimum for cytosolic pH 8; *SI Appendix*) and facilitated  $\text{CO}_2$  uptake was set to zero for simplicity. The carboxysome permeability represents the velocity at which  $\text{CO}_2$  and  $\text{HCO}_3^-$  traverse the carboxysome shell, including both transit of pores found in

shell proteins and any “leakiness” of the shell itself. Carbon is conserved and so fluxes importing Ci into the cell (active  $\text{HCO}_3^-$  transport) must equal the sum of fluxes consuming Ci within the cell:  $H_{\text{total}}$  leakage,  $\text{CO}_2$  leakage, and carboxylation. This conservation law is captured by the equation shown in Fig. 2.

Analyzing the pH dependence of carbon fluxes shows that CCM performance is expected to improve dramatically with increasing cytosolic pH (Fig. 2). Indeed, the amount of active transport required to maintain 30 mM cytosolic  $\text{HCO}_3^-$  decreases exponentially with increasing pH (i.e., linearly on a log scale). At pH 7 and below, more than 85% of the  $\text{HCO}_3^-$  influx leaks out of the cell. Above pH 7,  $\text{CO}_2$  leakage and carboxylation fluxes contribute more prominently to the flux balance, with leakage representing  $\approx 65\%$  at pH 8. The log-linear relationship between pH and  $H_{\text{total}}$  leakage arises from the exponential (power-law) dependence of  $H_{\text{total}}$  permeability on pH described above.  $\text{HCO}_3^-$  transport fluxes also display a log-linear relationship with cytosolic pH (Fig. 2) and absolute transport rates at pH 8 are on the order of  $10^{-7}$  pmol per cell per s, approaching the  $\approx 10^{-8}$  pmol per cell per s uptake flux measured in the marine cyanobacterium *Prochlorococcus* MED4 (23).

In Fig. 2, the carboxylation rate declines above pH 7.5 because RuBisCO achieves maximal catalytic rate at that pH (34). At a cytosolic pH of 8  $\approx 30\%$  of Ci uptake is ultimately fixed by RuBisCO, compared with  $\approx 1\%$  in the previous model. Economic operation of the CCM is strongly dependent on the cytosolic pH, with pH  $\approx 8$  curtailing diffusive loss of  $H_{\text{total}}$ . Although greatly reduced, loss of  $\text{HCO}_3^-$  (through  $\text{H}_2\text{CO}_3$  leakage) remains a substantial flux and cannot be neglected even above pH 8. A full description of the model, including all kinetic parameters and pH dependencies, is given in *SI Appendix*.

**The Energetic Cost of  $\text{CO}_2$  Fixation.** The pH-aware model can also be used to calculate the energetic cost of fixing carbon through the CCM. This cost is composed of three components: the cost of transport, the cost of the CBB cycle, and the cost of photorespiratory pathways recycling 2PG (Fig. 3). The per-fixation



**Fig. 3.** Energetic costs associated with the CCM depend strongly on the cytosolic pH. The total energetic cost of concentrating  $\text{CO}_2$  per  $\text{CO}_2$  fixation (black) is plotted for cytosolic pH ranging from 6 to 9. The purple line denotes the cost of  $\text{HCO}_3^-$  transport and the blue line gives the per-fixation cost of the CBB cycle, which is assumed to be independent of pH. The gray line gives the cost of recycling 2PG through the  $\text{C}_2$  photorespiratory pathway. The measured cytosolic pH of *S. elongatus* 7942 is shown as gold bars with bar width denoting the SE (*Methods*). The extracellular Ci pool was assumed to be in equilibrium with the external pH, which was fixed at 7 for this analysis.

cost of the CBB cycle is approximately constant, but the costs of transport and photorespiration depend on the pH and the efficacy of the CCM (i.e., how much carboxylation and oxygenation take place). Here, we express the cost of fixation in units of  $H^+$  gradient dissipation—the number of  $H^+$  transported along the concentration gradient (i.e., the fundamental currency of the electrochemical potential). Cyanobacteria convert a proton gradient into ATP by means of the  $F_1F_0$  ATP synthase, which synthesizes one ATP for every four  $H^+$  translocated (40, 41).

Active transport of  $Cl^-$  is the chief energetic cost associated with the CCM. The biochemical mechanism of facilitated  $CO_2$  uptake is not known and so we focus on the primary cyanobacterial  $HCO_3^-$  transporters,  $Na^+$  symporters, which import one  $Na^+$  with each  $HCO_3^-$ . In model cyanobacteria like *S. elongatus*, antiporters exchange  $Na^+$  and  $H^+$ , and so sodium and proton gradients are interchangeable (7, 42). This allows  $HCO_3^-$  transport cost to be expressed in units of  $H^+$  transported across the membrane per  $CO_2$  fixed. We assume a cost of four  $H^+$  per  $HCO_3^-$  transported (*SI Appendix*) to calculate the per-fixation cost of  $HCO_3^-$  transport shown in Fig. 2.

The cost of the CBB cycle and the  $C_2$  photorespiratory pathway can be estimated from their known stoichiometry. We calculate the cost of the CBB cycle as  $\approx 37 H^+$  per  $CO_2$  fixed and the cost of the  $C_2$  pathway  $\approx 26 H^+$  per 2PG recycled (*SI Appendix*). The total cost of  $CO_2$  fixation and 2PG recovery will depend on the relative amount of oxygenation according to the formula

$$\text{fixation and recovery cost} = \frac{(37 + 26 R_O)}{1 - \frac{R_O}{2}},$$

where  $R_O$  is the ratio of oxygenation to carboxylation rates ( $R_O = V_o/V_c$ ),  $37 H^+$  is the per-carboxylation cost of the CBB cycle, and  $26 H^+$  is the per-oxygenation cost of  $C_2$  photorespiration. The cost has units of  $H^+$  per carboxylation. This formula accounts for the fact that each turn of the  $C_2$  cycle releases one  $CO_2$ , which must be fixed again to maintain carbon balance (*SI Appendix*). In the limit of low photorespiration,  $R_O$  approaches zero and the above formula converges to  $\approx 37 H^+$  per  $CO_2$ , the calculated cost of fixation through the CCB cycle. As the modeled CCM strongly limits oxygenation, the “fixation and recovery cost” is dominated by the cost of the CBB cycle, which is roughly constant (blue line in Fig. 3). The rate and cost of photorespiration, in contrast, is tied to the ratio of  $CO_2$  to  $O_2$  in the carboxysome (i.e., CCM efficacy) and so depends on pH (gray line in Fig. 3).

The projected cost of transport (purple line) falls beneath that of the CBB cycle (Fig. 3) as the cytosolic pH surpasses 7. The modeled cyanobacterial CCM approaches a total cost of  $\approx 50 H^+$  per fixation near pH 8. At pH  $\approx 8$ , active transport costs about 10-fold less than the CBB cycle and, we calculate, requires  $<1\%$  of cell surface area (*SI Appendix*). Notably, photorespiratory costs increase at elevated pH (Fig. 3) and oxygenation could account for as many as 2% of RuBisCO turnovers near pH 8. This might explain the absolute requirement for photorespiratory pathways in model cyanobacteria (43). Increased photorespiration can be understood as follows: CA equilibrates  $CO_2$  with  $HCO_3^-$  in the carboxysome and increased pH favors  $HCO_3^-$  over  $CO_2$  (*SI Appendix*, Fig. S1). As such, the carboxysomal  $CO_2$  concentration decreases as the pH increases, increasing the  $O_2:CO_2$  ratio and, consequently, photorespiration. So long as the pH remains beneath 8.5, the cost of photorespiration never exceeds 3% of total. Taken together, these cost calculations suggest that a cytosolic  $7.5 < pH < 8.5$  minimizes total energetic costs without requiring substantial photorespiratory flux. At a cytosolic pH  $< 6.2$  transport is prohibitively costly, at least an order of magnitude more so that carbon fixation itself.

***S. elongatus* Cytosolic pH is Within the Optimal Range for CCM Operation.** Increased cytosolic pH decreases the permeability of the bicarbonate pool to the cell membrane, reduces the amount

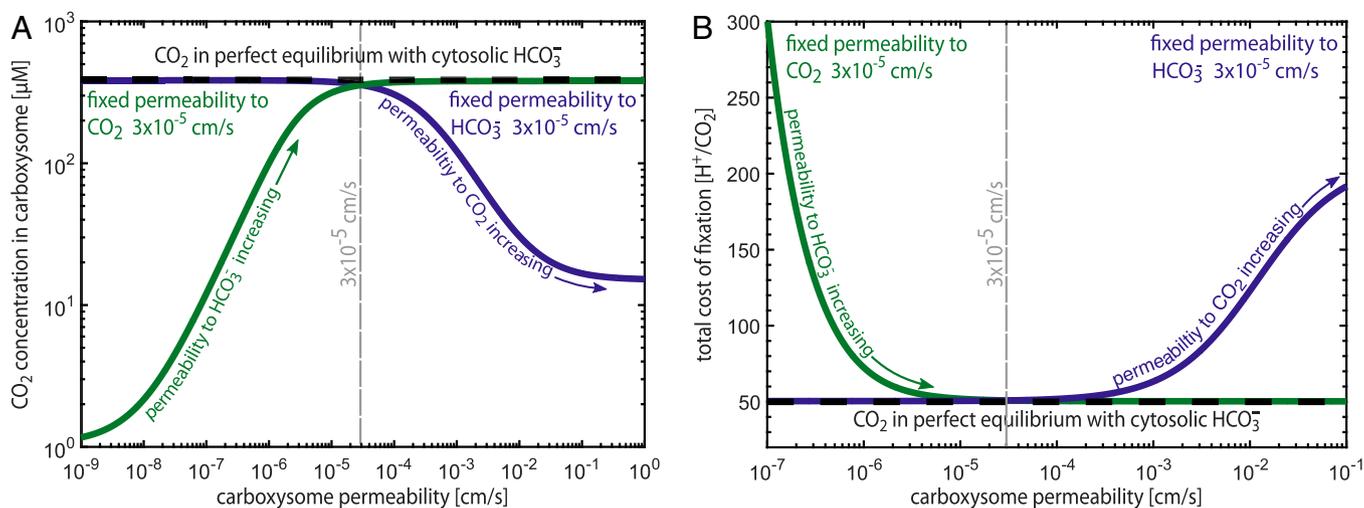
of  $HCO_3^-$  transport required per  $CO_2$  fixation, and decreases the total cost of  $CO_2$  fixation through the CCM. Our model predicts an optimal cytosolic pH range of 7.5–8.5 to minimize the total energetic cost of fixing carbon through the CCM. To test the prediction of an optimal cytosolic pH range, we measured the cytosolic pH of light- and dark-acclimated cyanobacteria (*S. elongatus* PCC 7942) using the ratiometric pH-sensitive dye BCECF-AM (*Methods*). As shown in Fig. 3, cytosolic pH differs between dark-acclimated cells, which do not grow or fix  $CO_2$  appreciably, and light-acclimated cells, which fix carbon and grow. Strikingly, the cytosolic pH of *S. elongatus* increases from  $7.3 \pm 0.2$  in the dark to  $8.4 \pm 0.1$  in the light (Fig. 3 and *SI Appendix*, Fig. S8). This is expected because the photosynthetic light reactions pump  $H^+$  from the cytosol into the thylakoid lumen (44) and the pH values are consistent with previous measurements of cytosolic pH in cyanobacteria (45–48). The pH in the light coincides well with our prediction of an optimal cytosolic pH range for carbon-fixing cyanobacteria.

## Discussion

Here, we demonstrate that CCM function is strongly dependent on pH. Most importantly, we show that  $Cl^-$  leakage is dominated by  $H_2CO_3$  within the physiological pH range (*SI Appendix*). Elevated cytosolic pH increases the relative abundance of charged  $HCO_3^-$  and so reduces leakage and the energetic cost of maintaining a high cytosolic concentration of  $H_{total}$ . This mirrors heterotrophic transport strategies such as the phosphorylation of glucose after uptake, which serves to “trap” glucose in the cell. We predict an optimal cytosolic pH range of 7.5–8.5 for carbon-fixing cyanobacteria. At pH 7.7 the total energetic cost of fixing carbon through the CCM is minimized, with higher pH offering diminishing returns (Fig. 3). We experimentally verified that cyanobacteria (*S. elongatus* 7942) achieve a cytosolic pH in this range while fixing carbon (Fig. 3). Moreover, *S. elongatus* cytosolic pH in the light (during carbon fixation) is  $\approx 8.4$  and differs markedly from the pH  $\approx 7.3$  measured in dark-acclimated cells (Fig. 3).

Notably, efficient operation of the CCM depends on two crucial unknown parameters: the velocity of active  $HCO_3^-$  transport and the permeability of the carboxysome to  $CO_2$  and  $HCO_3^-$  (14). These parameters are interdependent: Changing the carboxysome permeability alters the  $HCO_3^-$  transport flux required to concentrate  $CO_2$  in the carboxysome, as shown in *SI Appendix*, Fig. S6. Integrating pH into the model does not qualitatively change the interdependence of carboxysome permeability and active  $HCO_3^-$  transport. However, at pH 8, the pH-aware CCM model demands  $10^2$  to  $10^4$  times less active  $HCO_3^-$  transport than our previous model to achieve efficient  $CO_2$  fixation (Fig. 2). We defined the optimum permeability as the value that minimizes the active  $HCO_3^-$  transport flux required to saturate RuBisCO. The optimal carboxysome permeability at pH 8 is also 30-fold lower than previously reported ( $3 \times 10^{-5}$  instead of  $10^{-3}$  cm/s), but carboxysome permeabilities as high as  $10^{-2}$  cm/s can support  $CO_2$ -concentrating activity (*SI Appendix*, Fig. S6).

This updated, pH-aware model now agrees with cyanobacterial physiology in several ways. In optimal pH conditions the predicted fluxes for  $HCO_3^-$  transport, leakage, and carboxylation are all within an order of magnitude of measured values (23). In contrast to earlier models, which required  $>50\%$  of the cell membrane surface for  $Cl^-$  transport, these fluxes demand less than 1% of cell membrane surface area (*SI Appendix*). The pH-aware model also helps rationalize the distribution of  $Cl^-$  transport systems among cyanobacteria. Freshwater cyanobacteria, which live near neutral pH, typically have genes coding for both facilitated  $CO_2$  uptake and energetically activated  $HCO_3^-$  transport systems. Oceanic cyanobacteria, which live at pH  $\approx 8$ , typically encode only  $HCO_3^-$  transporters (23, 32). Based on our analysis of the pH-aware model, a sizable fraction of  $Cl^-$  can be taken up as  $CO_2$  in a near-neutral pH



**Fig. 4.** A selective carboxysome would not substantially improve CCM efficiency. The  $\text{CO}_2$  concentration in the carboxysome is maximized when it is brought into equilibrium with the cytosolic  $\text{HCO}_3^-$  pool, shown as the black dashed line in *A* and *B*. A CCM using the single optimal permeability computed through the pH-aware model (dashed gray line) achieves a carboxysomal  $\text{CO}_2$  concentration within 5% of this maximum. Selectivity at the carboxysome shell is thought to increase  $\text{HCO}_3^-$  permeability relative to  $\text{CO}_2$  by means of charge interactions in the pores of the carboxysome shell. Selectivity might intuitively result in greater trapping of  $\text{CO}_2$  (tracing the purple curve toward lower permeabilities) or faster uptake of  $\text{HCO}_3^-$  (tracing the green curve toward higher permeabilities), but neither of these strategies can increase the carboxysomal  $\text{CO}_2$  concentration above equilibrium. As shown in *B*, selectivity would not substantially reduce the total cost of fixing carbon through the CCM, which is already nearly minimized at the single optimal permeability of  $3 \times 10^{-5}$  cm/s. Increasing the  $\text{CO}_2$  permeability beyond  $10^{-4}$  cm/s, however, exponentially increases the cost of fixation due to leakage of  $\text{CO}_2$  from the carboxysome to the cytosol.

environment like freshwater, whereas in an environment at pH 8  $\text{CO}_2$  uptake would contribute negligibly to the overall  $\text{C}_i$  uptake rate (*SI Appendix, Fig. S9*).

**Selectivity at the Carboxysome Shell.** Throughout the text, we assumed that the carboxysome is equally permeable to  $\text{CO}_2$  and  $\text{HCO}_3^-$ . However, recent structures of carboxysome shell proteins offer a potential mechanism for differential permeability of  $\text{CO}_2$  and  $\text{HCO}_3^-$ : The pores of shell proteins typically carry positive charge, which might increase the rate of  $\text{HCO}_3^-$  transit relative to  $\text{CO}_2$  (12, 49). Indeed, recent experimental evidence suggests that protein compartments can be selectively permeable (50, 51). Intuitively, it seems that a very high  $\text{HCO}_3^-$  permeability and a very low  $\text{CO}_2$  permeability would be best for the efficient operation of the CCM. Such permeabilities would maximize  $\text{HCO}_3^-$  uptake and minimize loss of  $\text{CO}_2$ , ensuring that every carbon entering the carboxysome is ultimately fixed.

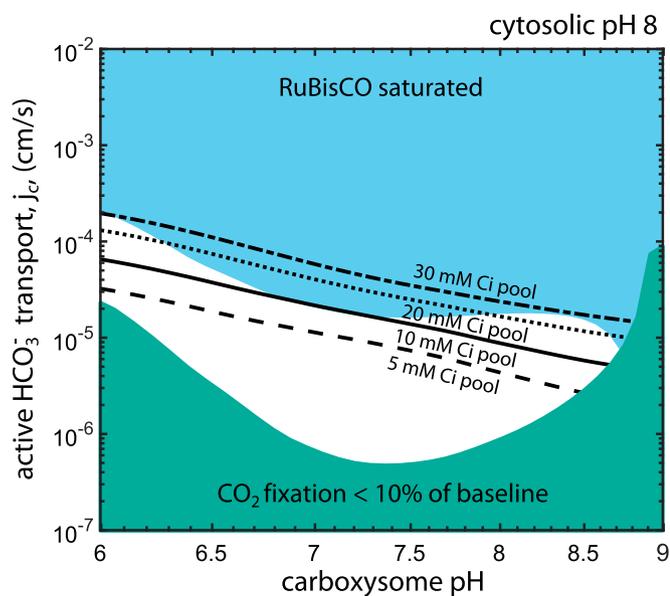
We used the pH-aware model to examine this intuition. As shown in Fig. 4, selectivity does not substantially improve the performance of the CCM. Rather, we find that a low permeability for  $\text{CO}_2$  ( $<10^{-4}$  cm/s) is a critical requirement for CCM function. To explain this nonintuitive result, note that the best possible case for the CCM is that the carboxysomal CA brings the cytosolic  $\text{HCO}_3^-$  pool into perfect equilibrium with  $\text{CO}_2$  inside the carboxysome (i.e., with negligible leakage of carboxysomal  $\text{CO}_2$ ; dashed black line in Fig. 4*A*). Because no energetic coupling is known or hypothesized to exist inside the carboxysome, equilibration of cytosolic  $\text{HCO}_3^-$  with carboxysomal  $\text{CO}_2$  would maximize the carboxysomal  $\text{CO}_2$  concentration. Indeed, the optimal single carboxysome permeability  $k_c = 3 \times 10^{-5}$  cm/s very nearly achieves this equilibrium  $\text{CO}_2$  concentration (within 5%; gray dashed line in Fig. 4*A*).

Whereas a selective system could reduce the amount of active  $\text{HCO}_3^-$  transport required per fixation (*SI Appendix*), transport costs represent  $\sim 20\%$  of the total cost at a cytosolic pH of 8 (Fig. 3) and so selectivity would have only a very small effect on the total cost of fixation in these conditions ( $<2\%$ ; gray dashed line in Fig. 4*B*). Increasing the permeability of the carboxysome to  $\text{CO}_2$  beyond  $10^{-4}$  cm/s, however, exponentially increases the cost of fixation irrespective of the  $\text{HCO}_3^-$  permeability (Fig. 4*B* and

*SI Appendix*). As a result, we find that selectivity is not necessary to produce a functional and energetically efficient CCM and suggest that future research should focus on understanding how the carboxysome maintains a permeability barrier to  $\text{CO}_2$  (*SI Appendix*).

**A Relatively Acidic Carboxysome Would Benefit the CCM.** It has been suggested that the carboxysome might maintain a pH gradient, with the cytosolic and carboxysomal pHs differing (37, 52). Altering the pH in the carboxysome would influence CCM efficiency in two ways. pH affects the equilibrium composition of  $\text{C}_i$  and the kinetics of the carboxysomal enzymes. A more acidic pH  $<8$  would increase the equilibrium  $\text{CO}_2$  concentration relative to the cytosol (*SI Appendix, Fig. S1*) and increase RuBisCO's maximum carboxylation rate (*SI Appendix, Fig. S4*). Indeed, because the combined action of CA and RuBisCO produces a net  $\text{H}^+$ , it may be possible for the cell to maintain a steady state where the carboxysomal pH differs from the cytosol (*SI Appendix*).

Fig. 5 shows that, within limits, a relatively acidic carboxysome would result in a higher degree of RuBisCO saturation at the same rate of cellular  $\text{HCO}_3^-$  uptake, with a carboxysomal pH  $\approx 7$  minimizing the amount of  $\text{HCO}_3^-$  uptake required to saturate RuBisCO (blue region). If the carboxysome is too acidic, however, it can deleteriously affect RuBisCO kinetics (*SI Appendix, Fig. S4*). An alkaline carboxysomal pH  $>8.5$  would encumber the CCM on two fronts: As the pH increases, the equilibrium  $\text{CO}_2$  concentration decreases exponentially and RuBisCO's maximum carboxylation rate vanishes (34). Furthermore, we find that a cytosolic  $\text{HCO}_3^-$  concentration beneath  $\approx 10$  mM is insufficient to saturate the carboxysomal RuBisCO (Fig. 5 and *SI Appendix*). This can be seen by calculating the  $\text{CO}_2$  concentration that would be achieved by equilibrating 5 mM  $\text{HCO}_3^-$ ,  $[\text{CO}_2] = [\text{HCO}_3^-]10^{(pK_{\text{eff}} - \text{pH})} \approx 5 \text{ mM} \times 10^{6.1-7} \approx 600 \text{ } \mu\text{M}$ , where  $pK_{\text{eff}} = 6.1$  is the effective  $pK_a$ , between aqueous  $\text{CO}_2$  and  $\text{HCO}_3^-$  (*SI Appendix*). The modeled RuBisCO, by contrast, has a carboxylation  $K_m$  that increases with decreasing pH, reaching  $\sim 1$  mM at pH 7 (*SI Appendix, Fig. S4*), and so cannot be saturated by 5 mM cytosolic  $\text{HCO}_3^-$ . Although the absolute carboxylation  $K_m$  varies between RuBisCO forms (2), the plant enzyme displays a similar



**Fig. 5.** A relatively acidic carboxysome would improve CCM performance. The phase space depicts the effect of varying carboxysomal pH and  $\text{HCO}_3^-$  transport on the degree of RuBisCO saturation in the carboxysome. The cytosolic pH was set to 8. The blue region denotes the portion of phase space wherein RuBisCO is saturated with  $\text{CO}_2$ . When the carboxysomal pH is relatively acidic (roughly pH 7) less  $\text{HCO}_3^-$  uptake is required to saturate RuBisCO because the equilibrium between  $\text{CO}_2$  and  $\text{HCO}_3^-$  favors  $\text{CO}_2$  more than at pH 8 (SI Appendix). Moreover, RuBisCO has an increased carboxylation  $k_{\text{cat}}$  at this pH. The minimum cytosolic  $\text{HCO}_3^-$  concentration (black lines) that allows for saturation of the carboxysomal RuBisCO is 10–20 mM, depending on RuBisCOs  $\text{CO}_2$  affinity, which also varies with pH (SI Appendix). The teal region denotes the portion of phase space where the total  $\text{CO}_2$  fixation flux is less than 10% of the flux in reference conditions (pH 8 in the cytosol and carboxysome). This region is labeled to emphasize that the fixation flux collapses at basic pH because the carboxylation  $k_{\text{cat}}$  is projected to vanish in this regime (SI Appendix, Fig. S4A).

pH dependence, with pH 7 resulting in at least twofold reduced  $\text{CO}_2$  affinity (34, 53, 54).

**Model Assumptions and Future Directions.** The major insight of the pH-aware model is that the effective permeability of the membrane to  $\text{H}_{\text{total}}$  depends on the relative abundance of the species comprising  $\text{H}_{\text{total}}$  ( $\text{HCO}_3^-$ ,  $\text{H}_2\text{CO}_3$ , and  $\text{CO}_3^{2-}$ ) and hence on the pH and ionic strength (SI Appendix). The model ignores the effect of  $\text{H}_2\text{CO}_3$  and  $\text{CO}_3^{2-}$  on all other CCM fluxes.  $\text{HCO}_3^-$  is the true substrate of CA, so it is reasonable to ignore the enzyme's interaction with other species (55). However, it is not known whether  $\text{HCO}_3^-$ ,  $\text{H}_2\text{CO}_3$ , and  $\text{CO}_3^{2-}$  are equally permeable to the carboxysome. As mentioned above, pores on the carboxysome shell often carry positive charge, so it is plausible that charge would affect the rate substrates enter the carboxysome (12, 49). Direct measurement of the permeability characteristics of the carboxysome would be of great help in understanding the CCM.

We further assume throughout this work that  $\text{CO}_2$  is the limiting substrate for RuBisCO carboxylation, that is, that the carboxylation rate does not depend on the concentration of the five-carbon carboxylation substrate ribulose-1,5-bisphosphate (RuBP). This assumption is supported by measurements of millimolar RuBP in *S. elongatus* (37), but it remains unclear how RuBP enters the carboxysome (49, 56). Similarly, we assume that  $\text{O}_2$  enters the carboxysome quickly enough to equalize concentrations across the carboxysome shell (SI Appendix), that is, that the CCM is not an “oxygen-blocking mechanism.”

In our analysis of the membrane permeability of  $\text{H}_{\text{total}}$ , we assumed that the permeability of  $\text{H}_2\text{CO}_3$  is well-approximated by those of formic and acetic acids ( $\text{H}_2\text{CO}_2$  and  $\text{H}_4\text{C}_2\text{O}_2$ , respectively;

SI Appendix). Model results are particularly sensitive to our assumptions about membrane and carboxysome permeabilities (SI Appendix, Fig. S11), emphasizing that quantitation of these permeability values is vital to understanding the cyanobacterial CCM. We further assume the cytosolic and carboxysomal pH are equal based on the observation of fast pH equilibration across the  $\alpha$ -carboxysome shell (52). However, it may be possible for the CCM to maintain a  $\Delta\text{pH}$  across the carboxysome shell (SI Appendix). Although the pH-aware model suggests that a relatively acidic carboxysomal pH  $\approx 7$  would enhance CCM efficiency (Fig. 5), it is difficult to imagine how the carboxysomal pH might be measured in vivo. Finally, we assume a 30 mM concentration of cytosolic  $\text{HCO}_3^-$  based on a number of measurements (37–39), and we ignored the effect of uncatalyzed dehydration on the cytosolic  $\text{HCO}_3^-$  concentration. In the SI Appendix we show that the spontaneous interconversion of  $\text{HCO}_3^-$  and  $\text{CO}_2$  has the same pH dependence as  $\text{H}_{\text{total}}$  permeability and including this reaction would result in a 15% increase in the  $\text{HCO}_3^-$  transport rate at most. As discussed above,  $\approx 10$  mM is the lowest cytosolic  $\text{HCO}_3^-$  concentration that would saturate the modeled carboxysomal RuBisCO with  $\text{CO}_2$  (Fig. 5 and SI Appendix).

A long history of research into photosynthetic physiology has shown that diverse phototrophs maintain a basic pH near 8 around RuBisCO while fixing carbon. Spinach chloroplasts, which contain no CCM, maintain a pH near 7 in the dark and shift to pH  $\approx 8$  in the light (57). As such, it is unclear whether the prevailing pH is an adaptation to the CCM or the CCM adapted to the pH. Indeed, active photosynthesis requires pumping of protons into the thylakoid and so it is sensible that the pH should increase in the stroma/cytoplasm (45, 58). We simply note that these explanations are not mutually exclusive (i.e., that it is possible that a pH  $\approx 8$  results from photosynthetic proton pumping and also optimizes CCM efficiency). Many eukaryotic algae have a CCM based on a structure called the pyrenoid that is evolutionarily distinct from, but physiologically similar to, the cyanobacterial CCM (7). Similar coordinated pH shifts are also known to occur in algal chloroplasts (59). Perhaps a shift from pH  $\approx 7$  in the dark to pH  $\approx 8$  in the light reflects a coordination of chloroplast pH with the algal CCM. We hope that future investigations into pH homeostasis and intracellular fluxes of carbon-fixing organisms help refine our understanding of the inner workings of CCMs.

## Methods

**Modeling.** The analytic equations of our previous model (14) were updated to account for the effect of pH on the composition of  $\text{H}_{\text{total}}$ ,  $\text{H}_{\text{total}}$  membrane permeability, and RuBisCO and CA activity. The pH-dependent composition of  $\text{H}_{\text{total}}$  was calculated using thermodynamic potentials derived by Noor et al. (36). Permeability coefficients for  $\text{CO}_2$ ,  $\text{H}_2\text{CO}_3$ , and  $\text{HCO}_3^-$  and were derived from literature values for those and similar molecules. The pH dependence of RuBisCO and CA kinetics were extracted from biochemical studies and scaled to match the carboxysomal enzymes. We further developed a mathematical framework to integrate the pH dependence of  $\text{H}_{\text{total}}$  permeability and selectivity at the carboxysome shell while preserving our capacity to solve the model analytically. In addition to the integration of detailed pH dependence, we described a carbon flux balance relation and model the energetic cost of all fluxes in the model except for facilitated  $\text{CO}_2$  uptake. To verify the accuracy of our analytic solutions, we compared them to results produced by simulating a numerical model. The updated model is described in detail in SI Appendix, implemented in MATLAB and freely available at <https://github.com/SavageLab/ccm/>.

***S. elongatus* pH Measurement.** The intracellular pH of *S. elongatus* 7942 was measured using the ratiometric pH dye 2',7'-bis(2-carboxyethyl)-5 (6)-carboxyfluorescein acetoxymethyl ester (BCECF-AM). The calibration curve was generated as follows. *S. elongatus* 7942 was grown to midlog phase, washed, and resuspended in BG11 media with 20  $\mu\text{M}$  BCECF-AM. Cells were incubated with BCECF-AM for 30 min in the light at 30  $^\circ\text{C}$  and then resuspended in BG11 of defined pH containing 20  $\mu\text{M}$  of the ionophore nigericin. After a 10-min incubation, four replicates of each pH condition were quickly loaded onto a 96-well plate and fluorescence was measured in a Tecan M1000 plate reader with

excitation/emission pairs 440/535 and 490/535. The 490:440 emission ratio was fit to a Boltzmann sigmoid to generate the calibration curve in *SI Appendix, Fig. S8*. *S. elongatus* 7942 in midlog phase was preincubated in light or in the dark for 9 h. These cultures were washed and resuspended in their spent growth media with 20  $\mu$ M BCECF-AM and incubated for 30 min at 30 °C in the light or dark as appropriate. For dark-treated cultures, all pipetting steps were carried out in a dark room with a low-intensity green LED light. Fluorescence was measured as above. Fluorescence ratios were calculated for each replicated and converted to pH values by inverting the calibration curve.

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