

Crowding of Molecular Motors Determines Microtubule Depolymerization

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ABSTRACT The assembly and disassembly dynamics of microtubules (MTs) is tightly controlled by MT-associated proteins. Here, we investigate how plus-end-directed depolymerases of the kinesin-8 family regulate MT depolymerization dynamics. Using an individual-based model, we reproduce experimental findings. Moreover, crowding is identified as the key regulatory mechanism of depolymerization dynamics. Our analysis reveals two qualitatively distinct regimes. For motor densities above a particular threshold, a macroscopic traffic jam emerges at the plus-end and the MT dynamics become independent of the motor concentration. Below this threshold, microscopic traffic jams at the tip arise that cancel out the effect of the depolymerization kinetics such that the depolymerization speed is solely determined by the motor density. Because this density changes over the MT length, length-dependent regulation is possible. Remarkably, motor cooperativity affects only the end-residence time of depolymerases and not the depolymerization speed.

INTRODUCTION

Microtubules (MTs) are cytoskeletal filaments that serve a central role in intracellular organization (1,2) and several cellular processes, including mitosis (3,4), cytokinesis (5), and intracellular transport (6). They can cope with these diverse tasks because they are highly dynamic structures that continually assemble and disassemble through the addition and removal of tubulin heterodimers at their ends. GTP hydrolysis is the energy source that drives switching between persistent states of growth and shrinkage, in a stochastic process termed dynamic instability (7–10). Each cellular process uses a specific set of MT-associated proteins (MAPs) to tightly regulate the rates of growth and shrinkage as well as the rate of transition between these states (11–13).

Depolymerases from the kinesin-8 and kinesin-13 protein families (e.g., Kip3p and MCAK, respectively) are important regulators of MT dynamics. They are thought to promote switching of MTs from growth to shrinkage (catastrophes) (12). Whereas MCAK lacks directed motility and diffuses along MTs (14), Kip3p is a highly processive plus-end-directed motor (15,16). Proteins from the kinesin-8 family are important for regulating MT dynamics in diverse organisms. Kif18A is a key component in chromosome positioning in mammalian cells (17–19), where it regulates plus-end dynamics. Its orthologs, the plus-end-directed motors Kip3p in budding yeast (16) and Klp5/6 in fission yeast (20–22), show depolymerizing activity. A notable feature shared by these MT plus-end depolymerases is that they depolymerize longer MTs more rapidly than they do shorter ones (15,17,21,23). A similar length-dependent regulation of MT assembly by kinesin-5 motors was observed in *in vivo* studies of chromosome congression in

budding yeast (24). The key experimental observations from *in vitro* studies of Kip3p (23) are that 1), the end-residence time of Kip3p at the tip depends on the bulk concentration of Kip3p and correlates inversely with the macroscopic depolymerization speed; and 2), the macroscopic depolymerization rate is directly proportional to the flux of Kip3p toward the MT plus-end.

It is thought that length-dependent depolymerization kinetics serves several purposes (2). For example, positioning of the nucleus at the cell center during interphase is achieved by growing MTs that push against the cell poles while remaining attached to the nucleus. A higher rate of catastrophes for longer MTs implies that shorter MTs have an increased contact time with the cell poles. Computer simulations show that this leads to a higher efficiency of nuclear positioning during interphase (25).

There is convincing experimental evidence that molecular traffic along MTs strongly affects the MT depolymerization dynamics. However, *in vitro* experiments cannot yet fully explore the underlying traffic dynamics. Theoretical investigations using individual-based models can be instrumental in furthering a mechanistic understanding of this process. Fortunately, such models can be constructed on the basis of substantial quantitative data available from *in vitro* experiments (15,23) characterizing the binding kinetics and the motor activity of plus-end-directed motors. Therefore, we sought to identify the molecular mechanisms underlying the observed correlation between depolymerization dynamics and molecular traffic along MTs.

In this study, we constructed an individual-based model for the coupled dynamics of MT depolymerization and molecular traffic of plus-end-directed motors. This model quantitatively reproduces previous experimental results (15,23). Moreover, we make precise quantitative predictions for the density profiles of molecular motors on the MT and

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demonstrate that molecular crowding and ensuing traffic jams regulate the depolymerization dynamics. We find two qualitatively distinct regimes of depolymerization dynamics: At low bulk concentrations of depolymerases, the depolymerization speed of MTs is density-limited and is a function of the bulk concentration and average motor speed alone. There is a sharp threshold in bulk depolymerase concentration above which macroscopic traffic jams emerge and the depolymerization speed is simply given by the microscopic depolymerization rate. Of note, none of these features are affected by the degree of cooperativity in the depolymerization kinetics. In contrast, the end-residence time of a depolymerase (i.e., the typical time it spends at the plus-end) is strongly correlated with cooperativity. We outline how these predictions from our theoretical analysis can be tested experimentally.

RESULTS

Model definition

We use an individual-based model, as illustrated in Fig. 1, to describe the dynamics of plus-end-directed depolymerases. Motor proteins, present at a constant bulk concentration c , are assumed to randomly bind to and unbind from the MT lattice with rates ω_a and ω_d , respectively. Bound motors are described as Poisson steppers (A more detailed biochemical model for motors on MTs has to await further experimental analysis. One of the different possible schemes has recently been studied by Klumpp et al. (26).) that processively walk along individual protofilaments toward the plus-end at an average speed u (27). These motors hinder each other sterically because individual binding sites $i = 1, \dots, L$ on each protofilament can be either empty ($n_i = 0$) or occupied by a single motor ($n_i = 1$). Because switching between protofilaments is rare (27), transport along each of the protofilaments can be taken as independent, and the model becomes effectively one-dimensional (28) (Fig. 1 B). Models of this type were recently discussed as minimal models for intracellular transport (29–32). In its given formulation, where the cytosol is considered as a homogeneous and constant reservoir of motors, it is equivalent to the driven lattice gas model known as the totally asymmetric simple exclusion process with Langmuir kinetics (TASEP/LK) (29). A central finding from this model is that the interplay between on-off (Langmuir) kinetics and directed transport along protofilaments can result in “traffic jams” in which the density profile of motors along a protofilament shows a sharp increase from a low-density to a crowded high-density regime (29,31). Crowding effects such as these (33,34) are important for a molecular understanding of MT dynamics. Previous theoretical studies on this topic largely disregarded crowding effects or considered parameter regimes in which they are unimportant (35–37). Depolymerization, including crowd-

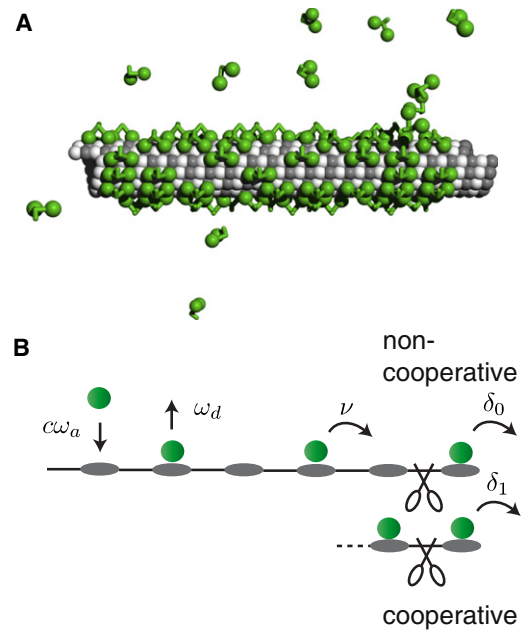


FIGURE 1 Illustration of MT and motor dynamics. Molecular motors present at concentration c randomly attach to unoccupied tubulin dimers along the MT lattice with rate ω_a . While bound, they processively move toward the plus-end at rate ν , and unbind with rate ω_d . Because motors do not switch lanes (protofilaments), the MT lattice (A) becomes effectively one-dimensional (B). Each lattice site n_i (with $i = 1, \dots, L$ numbering the sites) may be empty ($n_i = 0$) or occupied by a single motor ($n_i = 1$). At the plus-end, the motors act as depolymerases (indicated by scissors) either alone with rate δ_0 or cooperatively with rate δ_1 .

ing effects, has also been investigated for diffusive depolymerases such as MCAK (38).

At the plus-end of the systems, we consider depolymerization dynamics that arise due to the interaction of molecular motors with the MT tip. Motivated by recent experiments (23), we assume nonprocessive depolymerization, i.e., a molecular motor dissociates from the lattice after triggering depolymerization. Because the molecular mechanisms are not yet fully resolved, we study two scenarios of depolymerization (see Fig. 1 B). In the noncooperative scenario, the dissociation rate depends only on whether the last site is empty or occupied by a motor. If the last site is occupied, $n_L = 1$, the MT depolymerizes at rate δ_0 . However, recent single-molecule studies indicate that Kip3p may act cooperatively (23), which we consider as our second scenario. After arriving at the plus-end, the motor is observed to pause and depolymerize a tubulin dimer only after a second Kip3p has arrived behind it. In this scenario, a tubulin dimer is depolymerized with rate δ_1 if both the last and the second-to-last sites are occupied, $n_{L-1} = n_L = 1$. Therefore, the total depolymerization rate can be written as:

$$\Delta = \delta_0 n_L + \delta_1 n_{L-1} n_L. \quad (1)$$

For stabilized MTs, the spontaneous depolymerization rate is small (23) and thus is not considered here. The relative

magnitude of the noncooperative rate δ_0 and the cooperative rate δ_1 determines the degree of cooperativity of the depolymerization kinetics. In an average over many realizations of the stochastic process (ensemble average), the depolymerization speed V_{depol} depends on the occupation of the last two binding sites by depolymerases (Fig. 1 B):

$$V_{\text{depol}} = (\delta_0 \rho_+ + \delta_1 \kappa_+) a, \quad (2)$$

where a is the lattice spacing. Here $\rho_+ := \langle n_L \rangle$ is the probability that the last site is occupied (i.e., the expected motor density at the plus-end), and $\kappa_+ := \langle n_{L-1} n_L \rangle$ denotes the probability that both the last and second-to-last sites are occupied. We analyzed this model via stochastic simulations and analytic calculations (for further details, see the [Supporting Material](#)).

Validation of the model and its parameters

The model parameters are, as far as they are available, fixed by experimental data. The motor speed, u , the motor run length, ℓ , and motor association rate, ω_a , were measured previously (23):

$$u = 3.2 \mu\text{m min}^{-1},$$

$$\omega_a = 24 \text{ nM}^{-1} \text{ min}^{-1} \mu\text{m}^{-1},$$

$$\ell \approx 11 \mu\text{m}.$$

Using an MT lattice spacing of $a = 8.4 \text{ nm}$, we derive the corresponding parameters in our model as follows: The motor speed v corresponds to 6.35 lattice sites per second, i.e., a hopping rate of $v = u/a = 6.35 \text{ s}^{-1}$. The inverse hopping rate $\tau := v^{-1} = 0.16 \text{ s}$ and the size a of a tubulin dimer serve as our basic timescale and length scale, respectively. Then, the measured association rate corresponds to a rate $\omega_a \approx 5.3 \times 10^{-4} \text{ nM}^{-1} \text{ site}^{-1} \tau^{-1}$. The dissociation rate, $\omega_d = u/\ell$, is derived as the ratio of the mean motor speed, v , and the mean motor run length, ℓ . The latter equals 1310 lattice sites. Thus, the dissociation rate is expressed as $\omega_d \approx 7.6 \times 10^{-4} \text{ site}^{-1} \tau^{-1}$. In contrast to the transport behavior on the MT, the parameters concerning the depolymerization rates, $\delta_{0/1}$, cannot be directly extracted from experiments. However, there is evidence for a depolymerization rate as high as the motor speed, u (15,23). As a starting point for the following discussion, we tentatively take $\delta_0 = v$.

Using the above set of parameters, we now phenomenologically compare the results from numerical simulations of our model with observations from experiments. Specifically, we consider kymographs of the MT, which show how the MT length and the motor density on the MT evolve over time. For the simulation data shown in Fig. 2, we consider an MT consisting of 14 independent protofilaments and investigate the dynamics for the noncoopera-

tive scenario and a range of motor concentrations, $c = 1.2, 1.8, 2.6 \text{ nM}$ (Fig. 2, A–C). Surprisingly, as shown later, neither the cooperativity of the motors nor a decrease in the depolymerization rates led to different shapes of kymographs (see also Fig. S1).

We find an initial time period in which, starting from an empty MT lattice, the motors first fill up the lattice (39,40). This is followed by a time window in which the motor density exhibits a quasi-stationary profile, i.e., the density at a certain distance from the minus-end does not change except for boundary effects induced by the plus-end. The corresponding density profiles are illustrated in Fig. 2 E and discussed in more detail in the following section. In this quasi-stationary regime, the depolymerization dynamics shows qualitatively different behavior depending on the concentration of free motor molecules: At a low concentration, $c < 1.4 \text{ nM}$, and thus a low density of motors on the MT, depolymerization slows down gradually in the course of time (Fig. 2 A). When the motor concentration increases to larger values, $c > 1.4 \text{ nM}$, an intermediate regime emerges in which the depolymerization speed stays roughly constant (Fig. 2, B and C). Remarkably, we find that during this regime, the depolymerization speed is directly proportional to the motor density, $V_{\text{depol}}(L) = \rho_-(L) u$ (Fig. 2 D). At a third stage in the depolymerization process, there is a rather abrupt change in the depolymerization speed right where the density profile also shows a steep drop (Fig. 2, C–E). After we have elaborated more on the theoretical model, we will discuss why there is such a tight correlation between the depolymerization dynamics and the density profile.

All of these qualitative features of MT dynamics are identical to those found experimentally (15,23), and suggest that the density profile and, in particular, traffic jams formed on the MT lattice are the main determinants of the depolymerization dynamics. Moreover, the timescales of the dynamics agree quantitatively well with experimental results for the same motor concentrations (15,23). This validates our theoretical model because up to the depolymerization rate δ , all of the model parameters were derived from experimental data (23).

Density profiles at the minus-end (bulk density)

The above observations strongly point toward a tight correlation between the depolymerization speed and the motor density profile at the minus-end, $\rho_-(x)$, which we henceforth call the bulk (motor) density. The quasi-stationary bulk density profiles shown in Fig. 2 E were obtained by assuming very long lattices; effects caused by the plus-end are not visible in the vicinity of the minus-end. A more detailed discussion of these simulations can be found in the [Supporting Material](#). Because this bulk density will play an important role in the following analysis, we summarize its features here as obtained from analytical calculations detailed in the [Supporting Material](#).

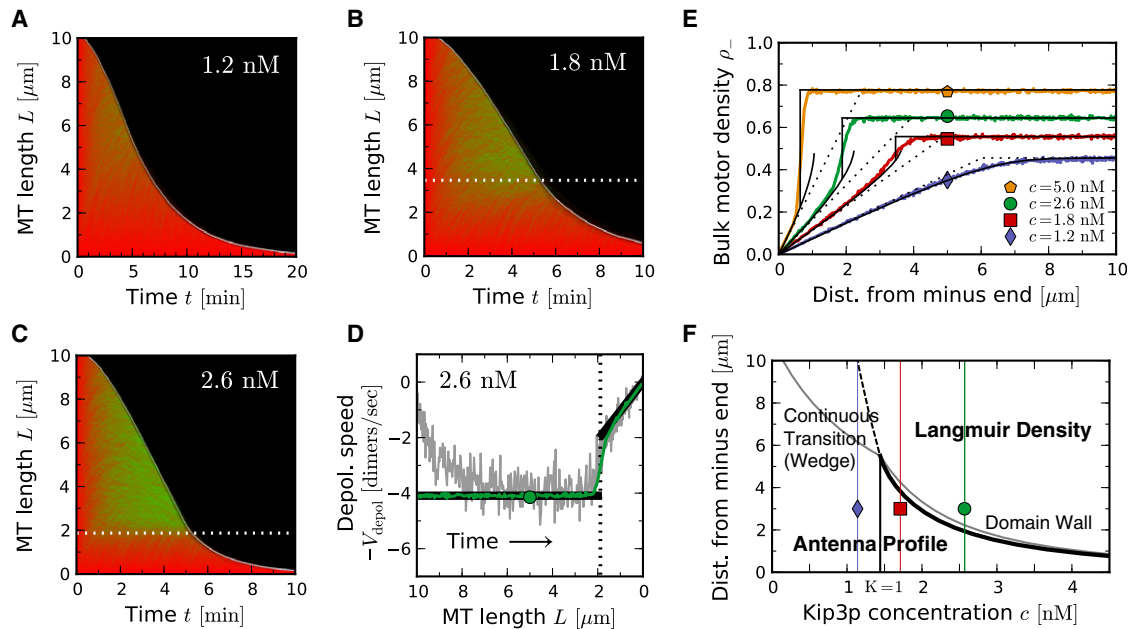


FIGURE 2 Validation of the theoretical model. (A–C) Time-space plots of stochastic simulations for a range of motor concentrations and depolymerization rate $\delta_0 = 6.35$ sites s^{-1} . The density of molecular motors is shown as the bright area (green), and the MT is shown as the dim area (red; for details, see Supporting Material). For low concentrations, $c < 1.4$ nM, depolymerization slows down gradually (23). At higher concentrations, $c > 1.4$ nM, there is a rather abrupt change in MT shortening. This change is correlated with a steep decrease in the motor density (DW), indicated as dotted lines. (D) The depolymerization speed, V_{depol} , as a function of the length of the shrinking MT $L(t)$, extracted from the simulation data shown in the kymograph (gray). The position of the DW (dotted), and the predicted depolymerization speed, $V_{\text{depol}} = u\rho(L)$ (see also Eq. 10), using the linear approximation for the motor density profile (black) and the density profile extracted from stochastic simulations (green), coincide very well with the observed depolymerization speed; $u = 6.35$ sites s^{-1} is the walking speed of the motors. (E) Density profiles at the minus-end from stochastic simulations (lines with symbols), exact solutions (solid), and linearized theory (dotted) are shown. (F) As a function of the motor concentration, c , and the distance from the minus-end, there are distinct types of density profiles. At motor concentration lower than $c = 1.4$ nM (thin black), the density of motors along the MT is low and the profile is smooth. The Langmuir density is reached continuously after a certain MT length (dashed, numerical). At high concentrations, $c > 1.4$ nM, there are two regions along the MT separated by an intervening DW (black, exact; see Supporting Material): an approximately linear antenna profile and a flat profile (Langmuir density). Linear approximations for the continuous and discontinuous transitions (Eq. 4) are shown as well (gray). Thin lines refer to the density profiles shown in E.

At the minus-end, the density profiles show an initial linear increase. This is an “antenna effect” (15), as illustrated in Fig. 3 A. Motors that attach in proximity to the MT minus-end immediately move toward the plus-end, thereby generating an approximately linearly increasing accumulation of motors. The slope is given by K/ℓ , where $K = c\omega_a/\omega_d$ denotes the binding constant. At sufficiently large distances from the minus-end, the density profile becomes flat and dominated by Langmuir kinetics with the ensuing Langmuir density:

$$\rho_{\text{La}} = \frac{K}{1+K} = \frac{c\omega_a}{c\omega_a + \omega_d}. \quad (3)$$

The full density profile is obtained by concatenating the antenna profile and the flat Langmuir profile such that the motor current is continuous along the MT. We find two qualitatively distinct scenarios (Fig. 2 E). For low concentrations of molecular motors, c , the antenna profile matches the asymptotic Langmuir density continuously, resulting in a wedge-like profile. In contrast, above a certain threshold value for the concentration, determined by the

binding constant $K_c^- = 1$, the two profiles can no longer be matched continuously and the density profile displays a sharp discontinuity, also termed a “domain wall” (DW) (29). In other words, if the Langmuir density rises above a critical value of $\rho_{\text{La}}^c = 0.5$, a crowding-induced traffic jam will result (41) (Fig. 3 A). The density profiles obtained from the analytic calculations and the stochastic simulations agree nicely, as illustrated in Fig. 2 E. In particular, the theoretical analysis gives an explicit expression for the width of the antenna-like profile:

$$\ell^- \approx \ell \begin{cases} \frac{1}{1+K} & \text{for } K < 1, \\ \frac{1}{K(1+K)} & \text{for } K > 1. \end{cases} \quad (4)$$

This result reduces to the average run length of molecular motors, $\ell = u/\omega_d$, in the limit of a very low binding constant, $K \ll 1$, where crowding effects can be neglected (37). However, with increasing K , the regime with an antenna-like profile becomes significantly shorter than ℓ (Fig. 2 F).

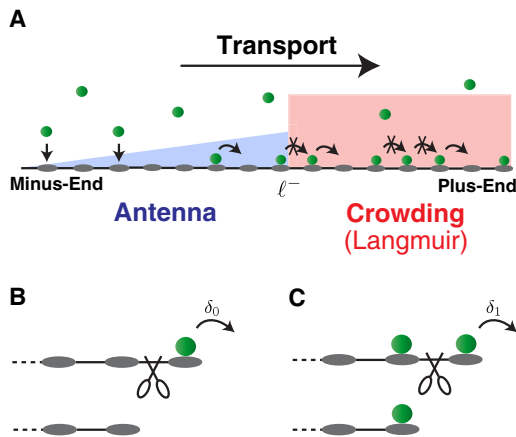


FIGURE 3 Illustration of the antenna and crowding regimes, and cooperativity. (A) Starting from an empty MT, motors start to accumulate on the MT lattice by attachment and subsequent transport to the plus-end. The combined effect of Langmuir kinetics and steric exclusion between the motors leads to two sharply separated regimes. Starting from the minus-end, the motor density increases linearly (antenna profile). At a certain critical length ℓ^- , a macroscopic traffic jam arises because particles hinder each other and crowding dominates the MT density. (B and C) Illustration of noncooperative (B, nc) and fully cooperative (C, fc) depolymerization kinetics. With regard to the depolymerization speed, both models are effectively equal (see main text).

Depolymerization dynamics is independent of cooperativity

We now address how the cooperativity of the depolymerization kinetics affects the macroscopic depolymerization speed. There are two limiting cases: noncooperative depolymerization (nc) with $(\delta_0, \delta_1) = (\delta, 0)$, and fully cooperative depolymerization (fc) with $(\delta_0, \delta_1) = (0, \delta)$ (for an illustration, see Fig. 3, B and C). Remarkably, we find from our stochastic simulations, shown in Fig. 4, that there is no difference in depolymerization speed for these two limiting cases. Even when the depolymerization dynamics contains cooperative as well as noncooperative terms, we do not find any significant differences in the depolymerization speed (Fig. 4 B).

This observation from our stochastic simulations can be explained by the following molecular mechanism: Consider a model with fully cooperative depolymerization kinetics. Then, after the first motor has arrived at the plus-end, the terminal site of the MT will remain occupied from that time on. Depolymerization only occurs if another motor arrives at the second-to-last site. In other words, while the last site remains occupied, the second-to-last site triggers the depolymerization. Hence, as far as the depolymerization speed is concerned, the fully cooperative model is identical to a noncooperative model with the same molecular rate δ . In the noncooperative model, the terminal tubulin dimer is removed at rate δ once a molecular motor has arrived at the last site (Fig. 3 B). In the fully cooperative model, the terminal tubulin dimer is removed once a molecular motor

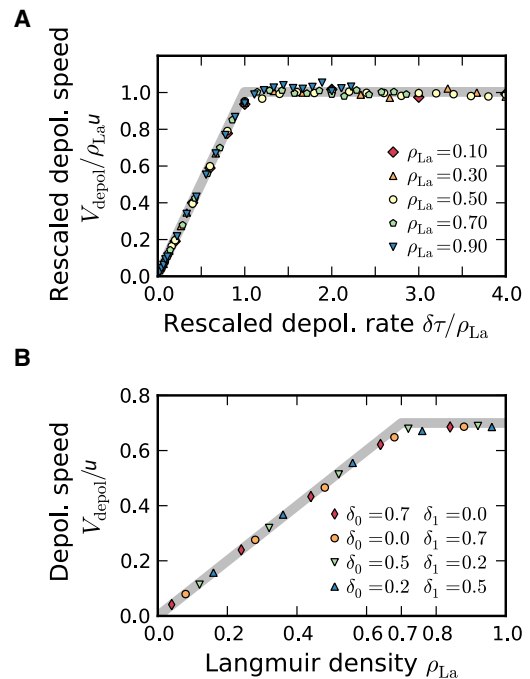


FIGURE 4 Scaling plot for the depolymerization speed V_{depol} . (A) Upon rescaling, both the macroscopic depolymerization speed, V_{depol} , and the microscopic depolymerization rate, δ , with the Langmuir density, ρ_{La} , all data collapse onto one universal scaling function \mathcal{V} (solid gray). A sharp transition at $\delta\tau = \rho_{\text{La}}^*$ distinguishes the rate-limited regime from the density-limited regime. (B) Comparison of cooperative and noncooperative depolymerization, with the macroscopic depolymerization speed V_{depol} as a function of Langmuir density ρ_{La} . For $\delta := \delta_0 + \delta_1 = 0.7\nu$ different degrees of cooperativity are displayed as indicated in the graph.

has arrived at the second-to-last site next to a permanently occupied last site (Fig. 3 C).

Depolymerization dynamics is strongly affected by crowding

To gain further insights in the correlation between the depolymerization speed and the density of motors on the MT, we performed stochastic simulations focusing on the MT plus-end by regarding the dynamics in a comoving frame. Instead of simulating the full-length MT with an antenna profile and a subsequent flat Langmuir density, we considered a reduced model in which the density at the left end is set equal to the Langmuir density ρ_{La} . For long MTs, the Langmuir density is always reached, so that the reduced system is fully equivalent to the original model. Our simulations show two clearly distinct regimes of depolymerization dynamics (Fig. 4): For small, microscopic depolymerization rates, $\delta\tau < \rho_{\text{La}}$, the polymerization speed is rate-limited: $V_{\text{depol}} = a\delta$. In contrast, for rates $\delta\tau > \rho_{\text{La}}$, the depolymerization speed is density-limited, and the Langmuir density is the limiting factor: $V_{\text{depol}} = \rho_{\text{La}}u$. The boundary between the two regimes is remarkably sharp and given by

$$\rho_{La}^* = \delta\tau. \quad (5)$$

This implies that the depolymerization speed can switch between being density-limited and rate-limited by changing the concentration c or the values of the biochemical rates of depolymerases binding to and unbinding from the MT lattice. Overall, the depolymerization speed obeys a scaling law

$$V_{\text{depol}} = \rho_{La} u \mathcal{V}\left(\frac{\delta\tau}{\rho_{La}}\right) = \begin{cases} a\delta & \text{for } \delta\tau \leq \rho_{La} \\ \rho_{La} u & \text{for } \delta\tau > \rho_{La} \end{cases}, \quad (6)$$

where $\mathcal{V}(x)$ is a universal scaling function with the simple form $\mathcal{V}(x) = x$ for $x < 1$ and $\mathcal{V}(x) = 1$ for $x > 1$. Experimentally, this implies that one should find data collapse when using such a scaling plot (Fig. 4 A).

To gain a molecular understanding of these remarkable features of the depolymerization speed, one needs to have a closer look at the density profile of the molecular motors at the MT tip. If the depolymerization rate is small, $\delta < v$, motors leave the tip more slowly than they arrive. Therefore, the MT tip acts as a bottleneck for molecular transport that disturbs the density profiles either locally or macroscopically. A weak bottleneck induces a local perturbation (“spike”) (33). These spikes are sharp changes of the density profile with a typical extension that scales with the size of a heterodimer. However, if the strength of a bottleneck exceeds a threshold value, the spike extends to a macroscopic perturbation (“traffic jam”) (33). Fig. 5 A illustrates how, for a given Langmuir density, $\rho_{La} = 2/3$, the effect on the density profile changes from a spike (blue) to an extended traffic jam (red and green) when the depolymerization rate is δ .

Let us now analyze the conditions and consequences of such bottlenecks in more detail. Suppose we are in a parameter regime where the plus-end disturbs the density profile only locally, i.e., on the scale of a heterodimer. Then, we may take the bulk density to be equal to the Langmuir density, ρ_{La} , up to the last site (the plus-end) where it jumps to some higher or lower value ρ_+ . The particle loss current at the plus-end due to MT depolymerization is then given by

$$J_{\text{depol}} = (1 - \rho_{La})\rho_+\delta. \quad (7)$$

The factor $1 - \rho_{La}$ arises because the particle number decreases only if a particle depolymerizes the MT and the second-to-last site, $L - 1$, is unoccupied. Otherwise, the depolymerization dynamics and the associated frame shift of the MT lattice do not change the occupation of the last site. This particle loss has to be balanced by the incoming particle flux,

$$J_{La} = \rho_{La}(1 - \rho_{La})v. \quad (8)$$

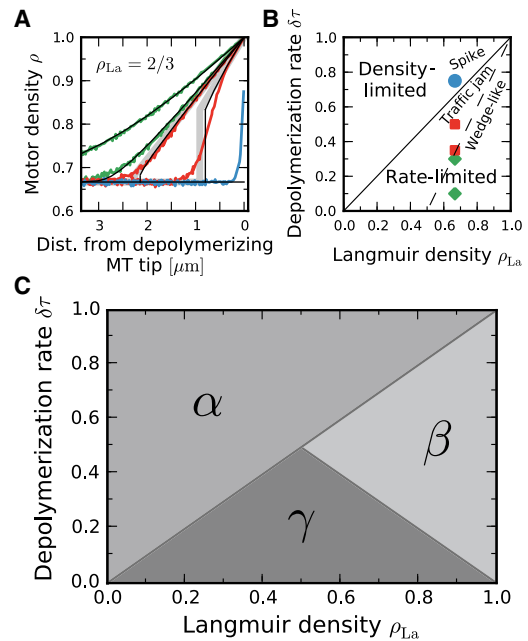


FIGURE 5 Density profiles at the plus-end, corresponding phase diagram, and depolymerization scenarios. (A) Density profiles at the MT plus-end in the comoving frame for $c = 2.9$ nM, and $\delta = 0.1, 0.3$ (left), $0.35, 0.5$ (middle), and $0.8v$ (right). The simulation results and analytical solutions (black; see Supporting Material) agree nicely. (B) Depending on the value of δ and the density of motors, ρ_{La} , there are three different classes of density profiles at the plus-end: wedge-like (diamonds), traffic jams with a DW (square), and spikes (circles). The transition between profiles with an extended traffic jam and a localized spike (solid line) also marks a qualitative change in the depolymerization speed. Whereas the depolymerization speed is density-limited in the spike regime, it is rate-limited in the DW and wedge regime. Symbols correspond to parameters as displayed in panel A. (C) Depending on the value of δ and the density of motors, ρ_{La} , there are three different regimes of depolymerization dynamics. In regime α , depolymerization is density-limited for arbitrary MT length. In contrast, depolymerization is rate-limited for long MTs and density-limited for short MTs in regimes β and γ . For details, see the main text.

Equating these particle fluxes (Eqs. 7 and 8) implies the following condition for the motor density at the plus-end:

$$\rho_+ = \begin{cases} \frac{\rho_{La}}{\delta\tau} & \text{for } \rho_{La} \leq \delta\tau \\ 1 & \text{for } \rho_{La} > \delta\tau \end{cases}, \quad (9)$$

where the fact that the motor density is bounded $\rho_+ \leq 1$ is already accounted for. The particle density on the last site, in turn, determines the depolymerization speed. For $\rho_{La} < \delta\tau$, one obtains according to Eqs. 2 and 9:

$$V_{\text{depol}} = \rho_+\delta a = \rho_{La}u. \quad (10)$$

Remarkably, here the effect of the depolymerization kinetics (δ) cancels out such that the macroscopic depolymerization speed is independent of the molecular details of depolymerization kinetics and is solely determined by the Langmuir density, i.e., the motor density in the bulk,

$\rho_-(x)$, and not at the tip of the MT. This result crucially depends on the presence of a microscopic spike. It explains the hitherto puzzling experimental result that the depolymerization speed is directly proportional to the bulk motor current along the MT (23) (Fig. S2).

Because the density is bounded, $\rho_+ \leq 1$, density profiles with a spike are only possible if the densities are not too large, $\rho_{La} < \delta\tau$. This is the case for the blue curve in Fig. 5 A. For densities exceeding the critical density, $\rho_{La}^* = \delta\tau$, the bottleneck-induced perturbation in the density profile can no longer remain a local spike, but has to become macroscopic in extent (33) (see *green and red curves* in Fig. 5 A and the Supporting Material).

One finds that over an extended region, the binding sites at the plus-end then remain permanently occupied such that $\rho_+ = 1$. This immediately implies that the depolymerization speed becomes density-independent and proportional to the microscopic depolymerization rate:

$$V_{\text{depol}} = a\delta. \quad (11)$$

There is a tight correlation between the shape of the density profiles and the macroscopic depolymerization speed. The analytic results explain the molecular mechanism behind the numerically observed scaling law (Eq. 6), with a sharp transition from density-regulated to rate-limited depolymerization dynamics at a critical value of $\rho_{La}^* = \delta\tau$ (cf. the classification of density profiles and depolymerization regimes shown in Fig. 5 B).

Actually, the above calculations can be generalized to the regime in which the motor density exhibits an antenna-like linear profile, i.e., for MT length shorter than ℓ^- . As detailed in the Supporting Material, we find that the depolymerization speed is rate-limited, $V_{\text{depol}} = a\delta$, if MTs are shorter than ℓ^- but still longer than a second threshold length:

$$\ell_d := \frac{\delta a}{c\omega_a} = \frac{\ell \delta\tau}{K}. \quad (12)$$

In contrast, for $\ell_d > \ell^-$, the depolymerization speed in the antenna regime is always length-dependent and strictly follows the shape of the antenna profile, $\rho_-(x)$:

$$V_{\text{depol}} = \rho_-(L)u. \quad (13)$$

Using Eq. 4, the condition $\ell_d > \ell^-$ on the threshold lengths is equivalent to $\delta\tau > \rho_{La}$ for $K < 1$, and to $\delta\tau > 1 - \rho_{La}$ for $K > 1$.

Combining all of the above results, we find three mechanisms that govern the depolymerization dynamics, as illustrated in Fig. 5 C:

α . For $\delta\tau > \rho_{La}$, the depolymerization speed is always density-regulated and given by $V_{\text{depol}}(L) = \rho_-(L)u$, where L is the time-dependent length of the MT. In this parameter regime, the depolymerization speed is a direct map of the bulk motor density profile on the

MT, $\rho_-(x)$, a feature that can be exploited experimentally to measure the profile.

- β . For $\rho_{La} > \delta\tau > 1 - \rho_{La}$, the depolymerization speed is rate-limited for MTs longer than ℓ^- , and becomes density-limited as soon as the MT length falls below ℓ^- , where the density profile is antenna-like. This implies that there is a discontinuous jump in the depolymerization speed right at $L = \ell^-$.
- γ . Finally, for all other values of $\delta\tau$, the depolymerization speed of the MT remains rate-limited for lengths larger than a threshold length ℓ_d . At ℓ_d , which is smaller than ℓ^- in this parameter regime, there is again a discontinuous jump to a density-limited depolymerization dynamics.

If the depolymerization rate is larger or equal to the hopping rate of molecular motors, $\delta\tau \geq 1$, then $\delta\tau > \rho_{La}$ is always obeyed simply because $\rho_{La} \leq 1$. In this regime, all of the molecular details of the depolymerization kinetics are irrelevant. Neither the cooperativity nor the actual value of the depolymerization rate matters in terms of the depolymerization speed; instead, only the bulk density regulates the speed. Note that this was the case for the data shown in Fig. 2, where we tentatively made the parameter choice $\delta\tau = 1$. If the motors are faster than the depolymerization process, $\delta\tau < 1$, we have to distinguish between the parameter regimes (α , β , and γ , Fig. 5 C). Here the value of the depolymerization rate matters if the bulk density exceeds a certain threshold concentration, $\rho_{La} > \delta\tau$, and the MTs are long enough. Finally, the depolymerization speed always becomes density-dependent and hence length-dependent if the MT length is short enough; the corresponding threshold length is $\ell_{\text{reg}} = \min[\ell^-, \ell_d]$.

The end-residence time strongly depends on cooperativity

In contrast to the depolymerization speed, the mean end-residence time τ_{res} is strongly affected by the degree of cooperativity. Fig. 6 displays τ_{res} as obtained from our stochastic simulations for noncooperative and fully cooperative depolymerization kinetics. Our simulations show that the end-residence time for the fully cooperative model is identical to the average lifetime of a terminal tubulin dimer $\tau_{\text{res}}^{\text{fc}} = \tau_d := a/V_{\text{depol}}$ (Fig. 6 A). Even for the noncooperative model, $\tau_{\text{res}}^{\text{nc}}$ equals τ_d for large residence times and deviates from it only at small values. The relatively sharp transition to a constant lifetime of the terminal tubulin dimer occurs right at $\tau_{\text{res}}^{\text{nc}} = \tau/\rho_{La}$, i.e., the end-residence time equals the waiting time for a molecular motor to arrive at the MT tip. For $\tau_{\text{res}}^{\text{nc}} < \tau/\rho_{La}$, the lifetime of the terminal tubulin dimer is identical to the arrival time (Fig. 6, A and B). Once the arrival time becomes shorter than the inverse depolymerization rate, the end-residence time levels off at $\tau_{\text{res}}^{\text{nc}} = 1/\delta$. These results show that the dependence of the end-residence time on density can be used to quantify the

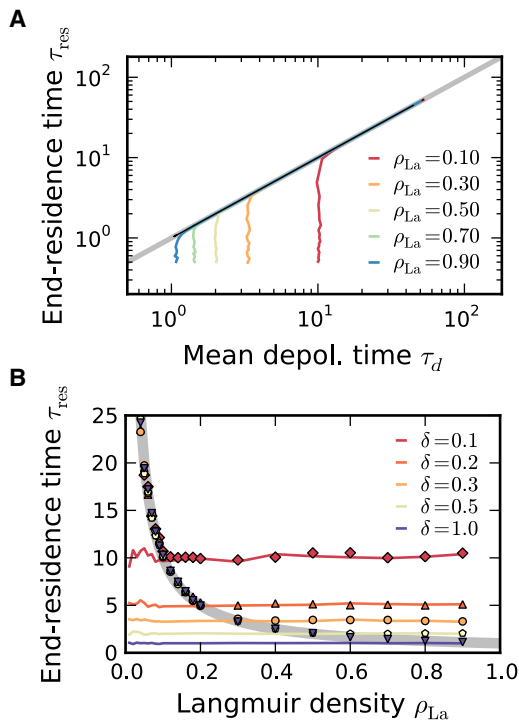


FIGURE 6 Motor end-residence times τ_{res} for cooperative and noncooperative depolymerization. (A) Mean end-residence time τ_{res} plotted against the mean depolymerization time τ_d . Data were recorded for a range of depolymerization rates $\delta = 0.02 \dots 2\nu$. Noncooperative (shaded) and cooperative (black) dynamics are shown for different densities. (B) Mean end-residence time τ_{res} as a function of the Langmuir density ρ_{La} for various depolymerization rates (in units of ν). For noncooperative depolymerization, τ_{res} is given by $1/\delta$ (shaded lines). For the fully cooperative scenario (symbols), τ_{res} depends on whether the system is in the density-limited ($\delta\tau > \rho_{\text{La}}$) or in the rate-limited ($\delta\tau < \rho_{\text{La}}$) regime. While, for $\delta\tau > \rho_{\text{La}}$, the end-residence time is given by $\tau_{\text{res}} = \tau/\rho_{\text{La}}$ (solid gray line), for $\delta\tau < \rho_{\text{La}}$, it is density-independent and determined by the microscopic depolymerization rate $\tau_{\text{res}} = 1/\delta$ (see also Eq. 16).

degree of cooperativity. This would require experiments with motor densities on the MT larger than those studied up to now (15,23).

The observation that the depolymerization speed is independent of the degree of cooperativity seems to be at odds with the experimental finding that the end-residence time, τ_{res} , of Kip3p depends on the total Kip3p concentration and is inversely proportional to the macroscopic depolymerization speed (23). Actually, however, there is no contradiction and the findings are readily explained within our theoretical model: For a noncooperative model, $\tau_{\text{res}}^{\text{nc}}$ is simply given by the depolymerization rate, because after they arrive, the particles stay at the tip until they depolymerize the MT:

$$\tau_{\text{res}}^{\text{nc}} = \frac{1}{\delta}. \quad (14)$$

For a fully cooperative model, $\tau_{\text{res}}^{\text{fc}}$ depends not only on δ but also on the rate at which the second-to-last site

becomes populated. Say the probability for the second-to-last site to be occupied is ρ_+ . Then, $\tau_{\text{res}}^{\text{fc}}$ is given by a sum of two contributions arising from the cases in which the second-to-last site is empty or occupied, respectively:

$$\tau_{\text{res}}^{\text{fc}} = (1 - \rho_+) \left(\frac{\tau}{\rho_{\text{La}}} + \frac{1}{\delta} \right) + \rho_+ \frac{1}{\delta}. \quad (15)$$

If the second-to-last site is empty (which is the case with probability $1 - \rho_+$) τ_{res} is the sum of arrival time τ/ρ_{La} and depolymerization time $1/\delta$. Otherwise, the end-residence time τ_{res} simply equals $1/\delta$.

As shown in the previous section, two distinct scenarios arise: For small bulk densities such that $\rho_{\text{La}} < \delta\tau$, the density profile at the plus-end exhibits a microscopic spike with $\rho_+ = \rho_{\text{La}}/\delta\tau$. For large densities, $\rho_{\text{La}} > \delta\tau$, a macroscopic traffic jam emerges such that $\rho_+ = 1$. This result obtained for the motor density at the MT tip (Eq. 9) may now be used to calculate $\tau_{\text{res}}^{\text{fc}}$ using Eq. 15:

$$\tau_{\text{res}}^{\text{fc}} = \begin{cases} \frac{1}{\delta} & \text{for } \rho_{\text{La}} > \delta\tau, \\ \frac{\tau}{\rho_{\text{La}}} & \text{else.} \end{cases} \quad (16)$$

This agrees well with the results from stochastic simulations displayed in Fig. 6. A comparison with Eq. 6 shows that the end-residence time equals the typical depolymerization time, i.e., the expected lifetime of a terminal tubulin dimer, $\tau_{\text{res}}^{\text{fc}} = \tau_d$. This is in agreement with experimental findings regarding the unbinding rate of motors at the plus-end (23) and strongly supports the conclusion that depolymerization of MTs by Kip3p is fully cooperative. Varga et al. (23) measured the end-residence time of motors on double stabilized MTs, i.e., where depolymerization is switched off. They observed that the end-residence time is inversely correlated with the concentration of Kip3p, and fit their data with an exponential using a cutoff. This is in accordance with our results shown in Fig. 6 B. However, because depolymerization has been switched off in the experiment, the rate δ , corresponding to the cutoff, now has to be interpreted as an unbinding-rate of motors at the plus-end. It would be highly interesting to design experiments in which the depolymerization kinetics remains switched on, because this would allow one to measure the magnitude of the microscopic depolymerization rate δ .

DISCUSSION

In this work, we analyzed the effect of crowding and cooperativity on the depolymerization dynamics of MTs. To that end, we constructed an individual-based model for the coupled dynamics of plus-end-directed motor traffic and MT depolymerization kinetics. The model is based on well-established molecular properties of motors from the

kinesin-8 family, i.e., the motors move on single protofilaments with high processivity at an average speed u , and exchange of motors between the bulk and the MT follows Langmuir kinetics. All parameters of the model, including the average walking speed, run length, and attachment rate, were directly extracted from available *in vitro* data (23). We validated our model by reproducing the onset of length-dependent depolymerization as studied recently (15,23). Without using any additional fitting parameter, we found the same regimes of density profiles and ensuing depolymerization dynamics as in the experiments, i.e., a linear antenna-profile with a length-dependent depolymerization speed and a flat profile with a constant depolymerization speed. Moreover, we identified a threshold density of motors above which a crowding-induced traffic jam emerges at the minus-end. The predicted shape and extent of these traffic jams should be amenable to experiments that raise the depolymerase concentration c or change its rates of binding to and unbinding from the MT.

The interplay between motor traffic and depolymerization kinetics at the MT plus-end leads to strong correlations between the depolymerization dynamics and density profiles of depolymerases. The plus-end acts as a bottleneck, and crowding effects cause traffic jams. We find two qualitatively distinct regimes: Motor densities below a critical threshold value, $\rho_{La}^* = \delta\tau$, always show a local spike-like perturbation at the plus-end, the extent of which is the size of a heterodimer. Above this threshold density, macroscopic traffic jams may emerge. These distinct density profiles at the plus-end affect the depolymerization speed and the end-residence time in qualitatively different ways. A quantitative analysis of the model using stochastic simulations as well as analytical calculations led to the following main results:

The end-residence time of a depolymerase strongly depends on the degree of cooperativity. Whereas for noncooperative depolymerization kinetics the end-residence time is given by the microscopic depolymerization rate δ , it is density-dependent in the fully cooperative case: Increasing the Langmuir density above the threshold value $\rho_{La}^* = \delta\tau$, the end-residence time changes from being inversely proportional to the density ρ_{La} to a constant value δ^{-1} . These results suggest an interesting way to determine the cooperativity of depolymerization kinetics and measure the value of the depolymerization rate δ . Although when the concentration c is increased, the end-residence time should be independent of concentration for noncooperative kinetics, it should strongly depend on concentration in the cooperative case. Experimental evidence points toward the latter (23).

In contrast, the depolymerization speed does not depend on the degree of cooperativity of the depolymerization kinetics. Noncooperative and fully cooperative versions of the model give identical results. As a function of depolymerase concentration and the MT length, the depolymerization

dynamics exhibits two qualitatively distinct regimes: The depolymerization speed is either density-limited and determined by the bulk density of molecular motors, $\rho_-(x)$, or rate-limited and dictated by the value of the microscopic depolymerization rate, δ . Both regimes emerge due to crowding of molecular motors at the plus-end, which acts as a bottleneck for molecular traffic.

Density-limited regimes are correlated with microscopic traffic jams (“spikes”) at the plus-end: The density profile self-organizes into a shape that cancels out all the effects of the depolymerization kinetics such that the depolymerization speed is solely determined by the bulk motor density, $\rho_-(x)$, and the average motor speed, u . Note that only in this regime length-dependent regulation is possible, because the density changes over the MT length. As emphasized above, if the depolymerization rate δ is larger than the hopping rate of the molecular motors, $\delta > \nu$, this remains the only regime of depolymerization dynamics. Then, the depolymerization speed is limited by the velocity of the plus-end directed motors, which is in accordance with recent experimental findings for Kip3p (23). In a parameter regime where motors depolymerize more slowly than they walk, $\delta < \nu$, there is a second rate-limited regime above the threshold density ρ_{La}^* and for MTs longer than some threshold length ℓ_{reg} where $V_{depol} = a\delta$. In this regime, the plus-end acts as a strong bottleneck for molecular traffic. This causes a macroscopic traffic jam such that the motor density steeply rises to full occupation of all lattice sites at the plus-end of the MT. The cellular system sacrifices its ability to regulate the speed of depolymerization and only regains it once the MT length falls below ℓ_{reg} , where the depolymerization speed again becomes density-regulated. From an evolutionary perspective, one might speculate that the system has evolved toward $\delta = \nu$, because this would allow regulation of the depolymerization dynamics over the broadest possible range.

Beyond these observations, other predictions of our stochastic model can be put to the test in experiments. By varying the motor concentration, two interesting observations could be made: First, the phase diagram for the density profiles at the minus-end could be scrutinized experimentally. Second, the predictions on the density-profiles at the plus-end and their predicted strong correlations to the macroscopic depolymerization dynamics might be accessible to single-molecule studies. Manipulation of the molecular properties of the motor (e.g., the run length, attachment rate (42), average speed, and depolymerization rate) would change the intrinsic biochemical rates of the system and could potentially lead to new parameter regimes. In addition, our results regarding the length and concentration dependence of the depolymerization process might be relevant *in vivo*, e.g., for mitotic chromosome alignment (18). In our theoretical studies, we explored the full parameter range, and therefore clear predictions are available for comparison.

We believe that in a more general context, our theoretical work provides new conceptual insights into the role of collective and cooperative effects in MT assembly and disassembly dynamics. Future research could focus on the antagonism between polymerases and depolymerases (12,43,44), spontaneous MT dynamics mediated by GTP hydrolysis, the abundance of molecular motors in a cell, or more-detailed modeling of molecular motors (26). This may finally lead to a molecular understanding of the regulatory mechanisms of cellular processes in which MT dynamics plays a central role.

SUPPORTING MATERIAL

Additional details, 37 equations, one table, two figures, and references are available at [http://www.biophysj.org/biophysj/supplemental/S0006-3495\(11\)01063-0](http://www.biophysj.org/biophysj/supplemental/S0006-3495(11)01063-0).

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