

LETTER

# Dynamics of microtubule instabilities

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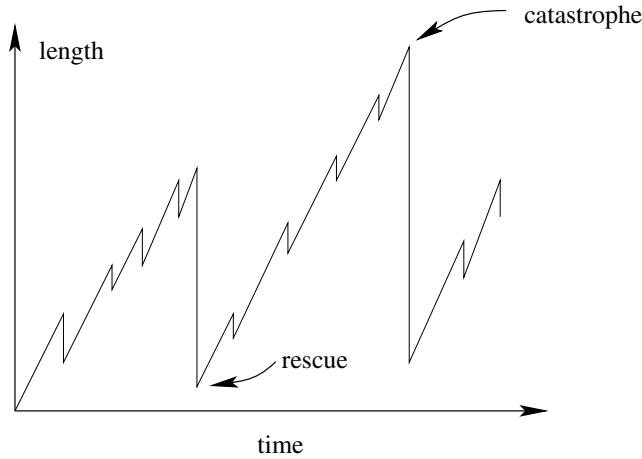
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**Abstract.** We investigate an idealized model of microtubule dynamics that involves: (i) attachment of guanosine triphosphate (GTP) at rate  $\lambda$ , (ii) conversion of GTP to guanosine diphosphate (GDP) at rate 1, and (iii) detachment of GDP at rate  $\mu$ . As a function of these rates, a microtubule can grow steadily or its length can fluctuate wildly. For  $\mu = 0$ , we find the exact tubule and GTP cap length distributions, and power-law length distributions of GTP and GDP islands. For  $\mu = \infty$ , we argue that the time between catastrophes, where the microtubule shrinks to zero length, scales as  $e^\lambda$ . We also discuss the nature of the phase boundary between a growing and shrinking microtubule.

**Keywords:** kinetic growth processes (theory), dynamics (theory), molecular networks (theory)

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**Figure 1.** Schematic illustration of the growth and catastrophic shrinkage of a microtubule as a function of time (adapted from [1]).

Microtubules are linear polymers of the protein tubulin that perform major organizational tasks in living cells [1, 2]. They provide transport tracks for molecular machines [3, 4], and move cellular structures during cellular processes such as reproduction [2, 5]. A surprising feature of microtubules is that they remain out of equilibrium under fixed external conditions and can undergo alternating periods of growth and rapid shrinking (figure 1).

These sudden polymerization changes are driven by the interplay between growth by the attachment of guanosine triphosphate tubulin complexes (GTP) at the free end [1, 3, 6, 7], irreversible hydrolysis of GTP into guanosine diphosphate (GDP) anywhere in the tubule, and subsequent GDP detachment from the free end of the tubule. One avenue of theoretical work on this dynamical instability is based on detailed models of mechanical stability [8, 9]. For example, a detailed stochastic model of a microtubule that includes all the thirteen constituent protofilaments has been investigated in [9]. By using model parameters that were inferred from equilibrium statistical physics, VanBuren *et al* [9] found characteristics of the tip evolution of a microtubule that agreed with experimental data [10].

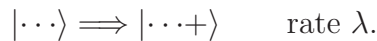
Another approach for modelling the dynamics of microtubules is based on effective two-state models that describe the dynamics in terms of a switching between a growing and a shrinking state [7], [11]–[15]. The essence of many of these models is that a microtubule exists either in a growing phase (where a GTP cap exists at the end of the microtubule) or a shrinking phase (without a GTP cap), and that there are stochastic transitions between these two states. By tuning parameters appropriately, it is possible to reproduce the phase changes between the growing and shrinking phases of microtubules that have been observed experimentally [3]. In another important contribution, Flyvbjerg *et al* [16] constructed an effective continuous theory to describe the dynamics of the cap length.

What is missing in these models is a clear connection between microscopic parameters and the evolution of the spatial structure of the microtubule. Most of the models discussed thus far are too complicated to permit a complete solution. Thus the present work is motivated by the goal of formulating and solving a minimal model of microtubule dynamics

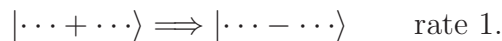
that incorporates the main features of growth and shrinking. We view this model as an Ising-like description that captures the most interesting features of microtubule dynamics even though the connection between model parameters and experimental variables is indirect. The main advantage of the model is its simplicity so that many of its geometrical and dynamical features can be determined analytically. These solutions reveal many rich geometrical and time-dependent features that should help our understanding of real microtubule dynamics.

The model studied in this letter [17, 18] treats a microtubule as a linear polymer that consists of GTP or GDP monomers that we denote as + and −, respectively. To emphasize this connection between chemistry and the model, we write the former as GTP<sup>+</sup> and the latter as GDP<sup>−</sup>. The state of a microtubule evolves by the following steps:

- (1) Attachment of GTP<sup>+</sup> at the end of a microtubule:



- (2) Independent conversion of each GTP<sup>+</sup> to GDP<sup>−</sup>:



- (3) Detachment of a GDP<sup>−</sup> from the microtubule end:



Here the symbols | and  $\rangle$  denote the terminal and the free end of the microtubule. It is worth mentioning that these steps are similar to those in a recently introduced model of DNA sequence evolution [19], and that some of the results about the structure of DNA sequences seem to be related to our results about island size distributions in microtubules.

With the above steps for the evolution of a microtubule, we find that the  $(\lambda, \mu)$  phase plane separates into a region where the microtubule grows, on average, and a phase where the microtubule length is finite. On the boundary between these two regions, the microtubule length fluctuates wildly. To understand these different phases, we first focus on the extreme cases of no detachment  $\mu = 0$  and infinite detachment rate  $\mu = \infty$ , where we can analytically solve the microtubule structure.

**No detachment:** Here GTP<sup>+</sup> monomers attach at rate  $\lambda$  and convert to GDP<sup>−</sup> at rate 1. The probability  $\Pi_N(t)$  that the microtubule consists of  $N$  GTP<sup>+</sup> monomers at time  $t$  evolves according to

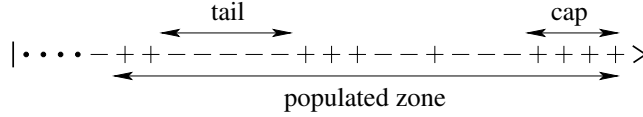
$$\frac{d\Pi_N}{dt} = -(N + \lambda)\Pi_N + \lambda\Pi_{N-1} + (N + 1)\Pi_{N+1}. \quad (1)$$

The loss term  $(N + \lambda)\Pi_N$  accounts for the attachment of a GTP<sup>+</sup> at the end of the microtubule of length  $N$  with rate  $\lambda$  and the conversion events GTP<sup>+</sup>  $\rightarrow$  GDP<sup>−</sup> that occur with total rate  $N$ . The gain terms can be explained similarly. This equation can be solved by the generating function method and the final result is [20]

$$\Pi_N(t) = \frac{[\lambda(1 - e^{-t})]^N}{N!} e^{-\lambda(1 - e^{-t})}. \quad (2)$$

From this Poisson distribution, the mean number of GTP<sup>+</sup> monomers and its variance are

$$\langle N \rangle = \langle N^2 \rangle - \langle N \rangle^2 = \lambda(1 - e^{-t}). \quad (3)$$



**Figure 2.** Representative configuration of a microtubule, with a cap of length 4, three GTP<sup>+</sup> islands of lengths 1, 3, and 2, and three GDP<sup>-</sup> islands of lengths 3, 2, and a ‘tail’ of length 5. The rest of the microtubule consists of GDP<sup>-</sup>.

Similarly, the length distribution  $P(L, t)$  of the microtubule evolves according to the master equation

$$\frac{dP(L, t)}{dt} = \lambda[P(L - 1, t) - P(L, t)]. \tag{4}$$

For the initial condition  $P(L, 0) = \delta_{L,0}$ , the solution is again the Poisson distribution

$$P(L, t) = \frac{(\lambda t)^L}{L!} e^{-\lambda t} \tag{5}$$

from which the growth rate of the microtubule and the diffusion coefficient of the tip are  $V = \lambda$  and  $D = \lambda/2$ .

Because of the conversion of GTP<sup>+</sup> to GDP<sup>-</sup>, the tip of the microtubule is comprised predominantly of GTP<sup>+</sup>, while the end exclusively consists of GDP<sup>-</sup>. The region from the tip until the first GDP<sup>-</sup> is known as the *cap* (figure 2) and it plays a fundamental role in microtubule function. We use a master equation approach to determine the cap length distribution [20].

Consider a cap of length  $k$ . Its length increases by 1 due to the attachment of a GTP<sup>+</sup> at rate  $\lambda$ . The conversion of any GTP<sup>+</sup> into a GDP<sup>-</sup> at rate 1 reduces the cap length from  $k$  to an arbitrary value  $s < k$ . These processes lead to the following master equation for the probability  $n_k$  that the cap length equals  $k$ :

$$\dot{n}_k = \lambda(n_{k-1} - n_k) - kn_k + \sum_{s \geq k+1} n_s. \tag{6}$$

Equation (6) remains valid for  $k = 0$  if we set  $n_{-1} \equiv 0$ . We solve for the stationary distribution by summing the first  $k - 1$  of equations (6) with  $\dot{n}_k$  set to zero to obtain

$$n_{k-1} = \frac{k}{\lambda} \sum_{s \geq k} n_s. \tag{7}$$

The cumulative distribution,  $N_k = \sum_{s \geq k} n_s$ , thus satisfies the recursion

$$N_k = \lambda N_{k-1} / (k + \lambda).$$

Using the normalization  $N_0 = 1$  and iterating, we obtain the solution in terms of the Gamma function [21]:

$$N_k = \frac{\lambda^k \Gamma(1 + \lambda)}{\Gamma(k + 1 + \lambda)}. \tag{8}$$

Hence the cap length distribution is

$$n_k = \frac{\Gamma(1 + \lambda)}{\Gamma(k + 2 + \lambda)} (k + 1) \lambda^k. \tag{9}$$

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From this distribution, we find that in the realistic limit of  $\lambda \gg 1$  the average cap length is given by

$$\langle k \rangle \rightarrow \sqrt{\frac{\pi\lambda}{2}} \quad \text{as } \lambda \rightarrow \infty. \quad (10)$$

Thus even though the average number of GTP<sup>+</sup> monomers equals  $\lambda$ , only  $\sqrt{\lambda}$  of them organize themselves into the microtubule cap.

At a finer level of resolution, we determine the distribution of island sizes in the GTP<sup>+</sup>-populated zone of a microtubule (figure 2). When  $\lambda \rightarrow \infty$ , both the length of the cap and the length of the region that contains GTP<sup>+</sup> become large and a continuum description is appropriate. Since the residence time of each monomer increases linearly with distance from the tip and the conversion GTP<sup>+</sup>  $\rightarrow$  GDP<sup>-</sup> occurs independently, the probability that a monomer remains a GTP<sup>+</sup> decays exponentially with distance from the tip. This fact alone is sufficient to derive all the island distributions.

Consider first the length  $\ell$  of the populated zone (figure 2). For a monomer at a distance  $x$  from the tip, its residence time is  $\tau = x/\lambda$  for large  $\lambda$ . Thus the probability that this monomer remains a GTP<sup>+</sup> is  $e^{-\tau} = e^{-x/\lambda}$ . We thus estimate  $\ell$  from the extremal criterion [22]

$$1 = \sum_{x \geq \ell} e^{-x/\lambda} = (1 - e^{-1/\lambda})^{-1} e^{-\ell/\lambda}, \quad (11)$$

that merely states that there is of the order of a single GTP<sup>+</sup> further than a distance  $\ell$  from the tip. When  $\lambda$  is large,  $(1 - e^{-1/\lambda})^{-1} \rightarrow \lambda$ , and the length of the active region scales as

$$\ell = \lambda \ln \lambda. \quad (12)$$

The probability that the cap has length  $k$  is given by

$$(1 - e^{-(k+1)/\lambda}) \prod_{j=1}^k e^{-j/\lambda}.$$

The product ensures that all monomers between the tip and a distance  $k$  from the tip are GTP<sup>+</sup>, while the prefactor gives the probability that a monomer a distance  $k + 1$  from the tip is a GDP<sup>-</sup>. Expanding the prefactor for large  $\lambda$  and rewriting the product as the sum in the exponent, we obtain

$$n_k \sim \frac{k+1}{\lambda} e^{-k(k+1)/2\lambda}, \quad (13)$$

a result that agrees with the large- $\lambda$  limit of the exact result for  $n_k$  in equation (9).

Similarly, the probability to find a positive GTP<sup>+</sup> island of length  $k$  that occupies sites  $x + 1, x + 2, \dots, x + k$  is

$$(1 - e^{-x/\lambda})(1 - e^{-(x+k+1)/\lambda}) \prod_{j=1}^k e^{-(x+j)/\lambda}. \quad (14)$$

The two prefactors ensure that sites  $x$  and  $x + k + 1$  are GDP<sup>-</sup>, while the product ensures that all sites between  $x + 1$  and  $x + k$  are GTP<sup>+</sup>.



**Figure 3.** Cartoon of a microtubule. The GTP<sup>+</sup> regions (dark) get shorter further from the tip that advances as  $\lambda t$ , while the GDP<sup>-</sup> regions (light) get longer.

Most islands are far from the tip and they are short,  $k \ll x$ , so that (14) simplifies to  $(1 - e^{-x/\lambda})^2 e^{-kx/\lambda}$ . The total number of GTP<sup>+</sup> islands of length  $k$  is obtained by summing this island density over all  $x$ . Since  $\lambda \gg 1$ , we replace the summation by integration and obtain

$$I_k = \int_0^\infty dx (1 - e^{-x/\lambda})^2 e^{-kx/\lambda} = \frac{2\lambda}{k(k+1)(k+2)}. \quad (15)$$

By similar reasoning, we find that the density of negative GDP<sup>-</sup> islands of length  $k \ll x$  with one end at  $x$  is given by  $e^{-2x/\lambda} (1 - e^{-x/\lambda})^k$ . The total number of negative islands of length  $k$  is therefore

$$J_k = \int_0^\infty dx e^{-2x/\lambda} (1 - e^{-x/\lambda})^k = \frac{\lambda}{(k+1)(k+2)}. \quad (16)$$

Again, we find a power-law tail for the GDP<sup>-</sup> island size distribution, but one that is much broader than the corresponding GTP<sup>+</sup> distribution. Strikingly, these two distributions are of the same form as those found for the degree distribution of growing networks [23, 24]. The total number of GDP<sup>-</sup> monomers within the populated zone is  $\sum_{k \geq 1} k J_k$ . While this sum formally diverges, we invoke the upper size cut-off,  $k_* \sim \lambda$  that again follows from an extremal criterion [22] to obtain  $\sum_{k \geq 1} k J_k \simeq \lambda \ln \lambda$ . Since the length of the populated zone  $\ell \sim \lambda \ln \lambda$ , we thus see that this zone predominantly consists of GDP<sup>-</sup> islands.

In analogy with the cap, consider now the ‘tail’—the last island of GDP<sup>-</sup> within the populated zone (figure 2). The probability  $m_k$  that it has length  $k$  is

$$m_k = e^{-\ell/\lambda} (1 - e^{-\ell/\lambda})^k. \quad (17)$$

Hence, by summing the geometric series and using  $\ell = \lambda \ln \lambda$  from (12), the average length of the tail is

$$\langle k \rangle \equiv \sum_{k \geq 1} k m_k = e^{\ell/\lambda} - 1 \rightarrow \lambda. \quad (18)$$

Thus the tail is (on average) much longer than the cap. In summary, the microtubule consists of GTP<sup>+</sup> islands that systematically get shorter away from the tip and vice versa for GDP<sup>-</sup> islands (figure 3).

**Instantaneous detachment:** For  $\mu > 0$ , a microtubule can recede if the monomer(s) at its tip are GDP<sup>-</sup>. If there are many such GDP<sup>-</sup> end monomers the microtubule length can fluctuate wildly under steady conditions. Here we focus on the limiting case of instantaneous detachment,  $\mu = \infty$ . As soon as the monomer at the tip changes from a GTP<sup>+</sup> to a GDP<sup>-</sup>, this monomer and any contiguous GDP<sup>-</sup> monomers detach immediately. We term such an event an *avalanche of size  $k$* . If the avalanche encompasses the entire microtubule, we have a *global catastrophe*. The probability for such a catastrophe to occur is

$$\mathcal{C}(\lambda) = \frac{1}{1 + \lambda} \prod_{n=1}^{\infty} (1 - e^{-n/\lambda}). \quad (19)$$

The factor  $(1 + \lambda)^{-1}$  gives the probability that the monomer at the tip converts to a  $\text{GDP}^-$  before the next attachment event, while the product gives the probability that all other monomers in the microtubule are  $\text{GDP}^-$ . In principle, the upper limit in the product is set by the microtubule length. However, for  $n > \lambda$ , each factor in the product is close to 1 and the error made in extending the product to infinity is small.

The asymptotic behaviour of the infinite product in equation (19) is found by first expressing it in terms of the Dedekind  $\eta$  function [25]

$$\eta(z) = e^{i\pi z/12} \prod_{n=1}^{\infty} (1 - e^{2\pi i n z}), \quad (20)$$

and then recalling a remarkable identity satisfied by this function,  $\eta(-1/z) = \sqrt{-iz} \eta(z)$ . Using these facts, the probability of a catastrophe is given by

$$\begin{aligned} \mathcal{C}(\lambda) &= \frac{\sqrt{2\pi\lambda}}{1 + \lambda} e^{-\pi^2\lambda/6} e^{1/24\lambda} \prod_{n \geq 1} (1 - e^{-4\pi^2\lambda n}) \\ &\sim \sqrt{\frac{2\pi}{\lambda}} e^{-\pi^2\lambda/6}. \end{aligned} \quad (21)$$

Since the time between catastrophes scales as the inverse of the occurrence probability, this inter-event time becomes extremely long for large  $\lambda$ .

Similar arguments can be used to calculate the size distribution of finite avalanches. We first notice that the configuration  $|\underbrace{\cdots}_{k-1} \rangle$  occurs with probability

$$\prod_{n=1}^{k-1} (1 - e^{-n/\lambda}).$$

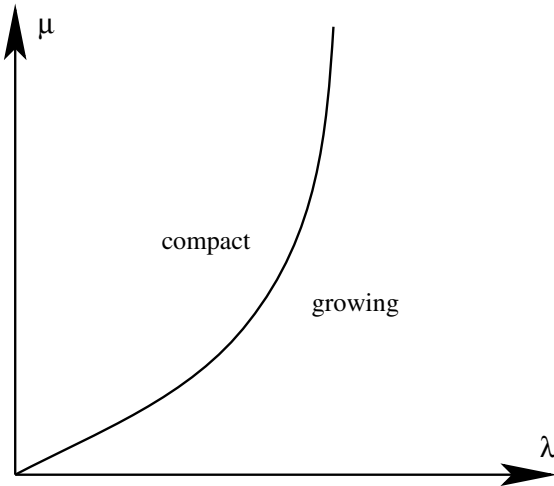
Then multiplying by the probability that the monomer at the tip converts before the next attachment event gives the probability for an avalanche of size  $k$ :

$$A_k = (1 + \lambda)^{-1} \prod_{n=1}^{k-1} (1 - e^{-n/\lambda}). \quad (22)$$

Using  $1 - e^{-n/\lambda} \approx n/\lambda - n^2/(2\lambda^2)$ , equation (22) becomes

$$A_k = \lambda^{-k} \Gamma(k) \prod_{n=1}^{k-1} \left(1 - \frac{n}{2\lambda}\right) \sim \lambda^{-k} \Gamma(k) e^{-k^2/4\lambda}.$$

**General growth conditions:** For arbitrary attachment and detachment rates  $\lambda$  and  $\mu$ , we can approximately map out the boundary between different phases of microtubule dynamics in the  $\lambda, \mu$  parameter space. For  $\lambda, \mu \ll 1$ , the unit conversion rate  $\text{GTP}^+ \rightarrow \text{GDP}^-$  is much faster than the rates  $\lambda, \mu$  of the other dynamical microtubule processes. Hence we assume that conversion is instantaneous. Consequently, a microtubule consists of a string of  $\text{GDP}^-$  monomers  $|\cdots \rangle$  in which the tip advances at rate  $\lambda$  and retreats at rate  $\mu$ . Thus the tip performs a biased random walk, and its velocity is  $V(\lambda, \mu) = \lambda - \mu$  when  $\lambda > \mu$ . The boundary between the growing phase, where the average tubule length grows as  $Vt$ , and the compact phase, where the average tubule length is finite, is found



**Figure 4.** Schematic phase diagram for a microtubule in the  $\lambda$ - $\mu$  parameter space.

by setting  $V = 0$ . This condition gives  $\mu_* = \lambda$  when  $\lambda \ll 1$ . On this phase boundary, the average tubule length grows as  $\sqrt{t}$ .

For the phase boundary for large  $\mu$ , consider first  $\mu = \infty$ . Since the leading behaviour for the probability of a catastrophe scales as  $e^{-\pi^2\lambda/6}$ , the typical time between catastrophes is  $e^{\pi^2\lambda/6}$ . Since  $V \approx \lambda$  for large  $\lambda$ , the typical length of a microtubule just before a catastrophe is again (ignoring all power-law factors)  $e^{\pi^2\lambda/6}$ . Suppose now the detachment rate  $\mu$  is very large but finite. The microtubule is compact if the time to shrink a microtubule of length  $e^{\pi^2\lambda/6}/\mu$  is smaller than the time  $\lambda^{-1}$  required to generate a  $\text{GTP}^+$  by  $|\cdots\rangle \Rightarrow |\cdots +\rangle$  and thereby stop the shrinking. We estimate the location of the phase boundary by equating these two times to give  $\mu_* \sim e^{\pi^2\lambda/6}$  when  $\lambda \gg 1$  (figure 4).

To summarize, our model predicts rich microtubule dynamics as a function of  $\text{GTP}^+$  attachment and  $\text{GDP}^-$  detachment. In the growing phase,  $\text{GTP}^+$  and  $\text{GDP}^-$  organize into alternating domains, with gradually longer  $\text{GTP}^+$  domains and gradually shorter  $\text{GDP}^-$  domains toward the tip of the microtubule. The size distributions of these two species are exact power laws with respective exponents of 3 and 2. Between the limiting cases of a finite-length and a growing microtubule, its length can fluctuate wildly under steady external conditions. This unusual behaviour emerges naturally in our model. From a simple probabilistic approach and in the limit instantaneous detachment of  $\text{GDP}^-$  ( $\mu = \infty$ ), we found that the time between catastrophes, where the microtubule shrinks to zero length, scales exponentially with the attachment rate  $\lambda$ . Thus for large  $\lambda$ , the microtubule will grow essentially freely for a very long time before undergoing a catastrophe.

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