

# Mechanism of enhanced mechanical stability of a minimal RNA kissing complex elucidated by nonequilibrium molecular dynamics simulations

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An RNA kissing loop from the Moloney murine leukemia virus (MMLV) exhibits unusual mechanical stability despite having only two intermolecular base pairs. Mutations at this junction have been shown to destabilize genome dimerization, with concomitant reductions in viral packaging efficiency and infectivity. Optical tweezers experiments have shown that it requires as much force to break the MMLV kissing-loop complex as is required to unfold an 11-bp RNA hairpin [Li PTX, Bustamante C, Tinoco I (2006) *Proc Natl Acad Sci USA* 103:15847–15852]. Using nonequilibrium all-atom molecular dynamics simulations, we have developed a detailed model for the kinetic intermediates of the force-induced dissociation of the MMLV dimerization initiation site kissing loop. Two hundred and eight dissociation events were simulated (approximately 16  $\mu$ s total simulation time) under conditions of constant applied external force, which we use to construct a Markov state model for kissing-loop dissociation. We find that the complex undergoes a conformational rearrangement, which allows for equal distribution of the applied force among all of the intermolecular hydrogen bonds, which is intrinsically more stable than the sequential unzipping of an ordinary hairpin. Stacking interactions with adjacent, unpaired loop adenines further stabilize the complex by increasing the repair rate of partially broken H-bonds. These stacking interactions are prominently featured in the transition state, which requires additional coordinates orthogonal to the end-to-end extension to be uniquely identified. We propose that these stabilizing features explain the unusual stability of other retroviral kissing-loop complexes such as the HIV dimerization site.

force microscopy | Markov models | RNA folding

**R**NA kissing loops are common structural motifs where two RNA hairpins form intermolecular base pairs between their apical loops (Fig. 1). These molecular rivets are crucial for retroviral genome dimerization due to their high mechanical stability and slow off-rates; mutations that destabilize loop-loop interactions have been shown to result in drastically decreased viral packaging efficiency and lower infectivity rates in vivo (1–4). These crucial intergenome kissing interactions are required before the downstream virion maturation and genome packaging steps can proceed (4). The requirement for a dimeric genome results in greatly increased recombination rates, elevated radiation resistance, and it may prevent wasteful incorporation of host mRNA into viral capsids (5). Destabilization of retroviral kissing loops therefore poses an attractive strategy for future therapeutics; however, we must first understand the physical origin of their extraordinary stability before we can selectively disrupt it.

Kissing-loop interactions were first hypothesized to explain unusually stable yeast tRNA dimers (6). The existence of anticodon-anticodon dimers was later confirmed by X-ray crystallography (7). Interestingly, these nonphysiological tRNA complexes were found to be six orders of magnitude more stable than the corresponding trinucleotide duplexes (8). Similarly, the HIV dimerization initiation site (DIS) kissing loop has been shown to be more stable than a canonical duplex of the same sequence

under physiological salt conditions (9). Recent single-molecule pulling experiments have shown that even a 2-bp kissing-loop complex from the Moloney murine leukemia virus (MMLV) requires approximately 15 pN of force to dissociate (10), which is comparable to the force required to unfold a tetraloop complete with 11-bp stem. The MMLV kissing loop therefore serves as a convenient, minimal model system for studying retroviral kissing-loop stability.

In this work, we investigate the source of the MMLV kissing loop's enhanced mechanical stability using a series of nonequilibrium all-atom molecular dynamics simulations with explicit representations of the solvent and salt molecules. To mimic an optical tweezers pulling experiment, a constant external force is applied to induce dissociation within tractable simulation timescales. A total of 208 dissociation trajectories, totaling approximately 16  $\mu$ s of simulation time, were analyzed to create a detailed kinetic model of the dissociation process. Once calibrated to the simulations, the stochastic model could capture trends that occurred at longer timescales than the input simulation trajectories. We find that a characteristic conformational change allows the MMLV kissing loop to distribute the applied load evenly among all intermolecular hydrogen bonds. In addition, we observe that flanking, unpaired adenine residues enable the efficient repair of partially broken base pairs and are prominently featured at the transition state. These effects collectively decrease the overall dissociation rate by several orders of magnitude as compared to the unzipping of a canonical double helix under the same applied force. These stabilization mechanisms help explain the idiosyncratic sequence-stability relationships common to kissing loop systems in general, such as the curious preference for unpaired, adjacent loop purines.

## Results

The 2-bp MMLV kissing loop takes several seconds to dissociate under the experimental conditions of 13.5–30 pN applied force (10). To simulate dissociation events within computationally tractable timescales, we required larger pulling forces than used in the optical tweezers experiments. Consequently, it was necessary to identify a force regime high enough to obtain adequate statistics but low enough to remain relevant to the mechanism at low force. An initial qualitative assessment was obtained using a small number of dissociative simulations over a wide range of external applied forces (100–400 pN). This assessment allowed us to map the kinetic intermediates of the dominant dissociation pathways. Multiple independent simulations over a smaller range

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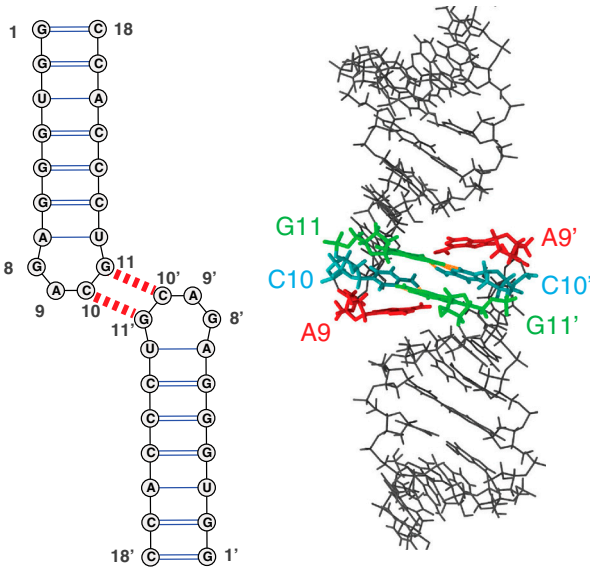
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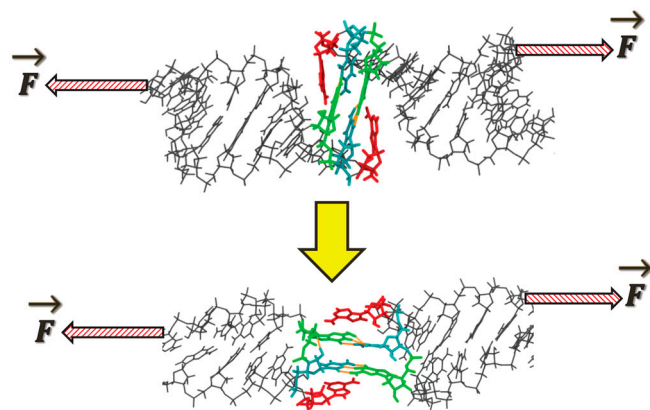
This article contains supporting information online at [www.pnas.org/lookup/suppl/doi:10.1073/pnas.1119552109/-DCSupplemental](http://www.pnas.org/lookup/suppl/doi:10.1073/pnas.1119552109/-DCSupplemental).



**Fig. 1.** Structure of the H3 2-bp MMLV kissing-loop complex. The sequence and secondary structure of the homodimeric kissing-loop complex is shown at left, with the two intermolecular GC kissing base pairs indicated by the dashed red lines. At right, a view of the experimentally determined NMR structure (PDB ID code 1F5U). The GC bases that form the intermolecular kissing contacts are colored green and blue, respectively; the flanking, unpaired adenine residues are shown in red.

of forces (100–250 pN) were then acquired to obtain quantitative transition rates. The results are used to construct a discrete-state, continuous time stochastic model.

**Exploratory Simulations.** Initial exploratory simulations revealed that at all simulated forces <300 pN, a fast conformational rearrangement occurs within the first approximately 100 ps in which the nucleotides at the loop-loop interface undergo an approximately 90° pivoting motion (Fig. 2). The two kissing G-C base pairs are initially perpendicular to the axis of applied force in the NMR structure, forming a coaxially stacked helical junction (Fig. 1). After the rearrangement, a bridging conformation is formed with the G-C base pair hydrogen bonds arranged parallel to the axis of applied force. Interestingly, the unpaired adenine



**Fig. 2.** A universal conformational rearrangement from the coaxially stacked NMR structure (Upper) to bridging form (Lower) is observed within the first approximately 100 ps of all pulling trajectories  $\leq 280$  pN. Arrows indicate the external applied force, which are applied to only one strand of each double-helical stem. The pivoting of the two intermolecular GC base pairs positions all of the intermolecular hydrogen bonds to be parallel to the axis of applied force, a mechanically stabilizing feature. The unpaired, flanking adenine residues (red) remain stacked in the rearranged bridging form.

residues (A<sub>9</sub> and A<sub>9'</sub>) also rotate during the conformational rearrangement and remain stacked on both sides of the kissing G-C base pairs (Fig. 2), forming a stack sandwich. This rearrangement is both continuous and force-independent over the force range simulated—indicating a negligibly small activation barrier under the range of forces examined.

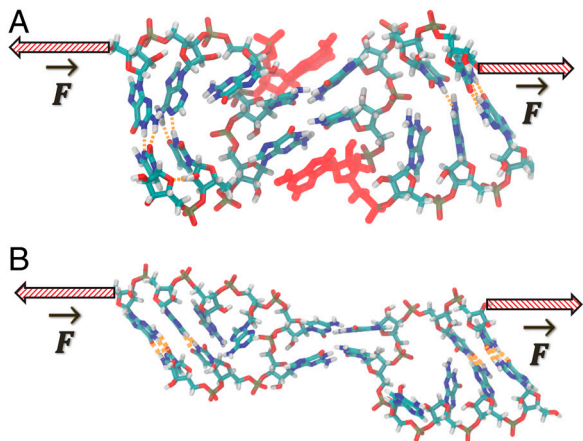
**Constructing a Discrete-State Stochastic Model for Kissing-Loop Dissociation.** Although the waiting times between conformational transitions were stochastic and force-dependent, the order of events was always the same. This ordered, sequential nature allowed us to construct a discrete-state, continuous-time kinetic model for the events leading up to dissociation. States were identified using simple geometric criteria for intermolecular base pair formation and base stacking (*Materials and Methods*). Because of the short range of these interactions, they are well-described by memoryless, binary state variables. Only four distinct intermediates were populated from 150–250 pN (Fig. 6A). The unstacking and H-bond-breaking events were essentially instantaneous (<2 ps) compared to the interevent waiting times (10–100 ns), so each transition is well-described by two-state kinetics.

This analysis results in a kinetic stepping stone model (Fig. 6) in which transitions are only possible between immediately adjacent states, although recrossing is allowed and there are multiple possible paths from start to finish. If transition probabilities are assumed to only depend on the current state (i.e., memoryless), then the resulting Markov process is characterized by a transition rate matrix  $Q$ , as follows:

$$Q = \begin{bmatrix} -\mu_1 & \lambda_{12} & \dots & \lambda_{1n} \\ \lambda_{21} & -\mu_2 & \lambda_{ij} & \lambda_{2n} \\ \vdots & \lambda_{ji} & \ddots & \vdots \\ \lambda_{n1} & \lambda_{n2} & \dots & -\mu_n \end{bmatrix}. \quad [1]$$

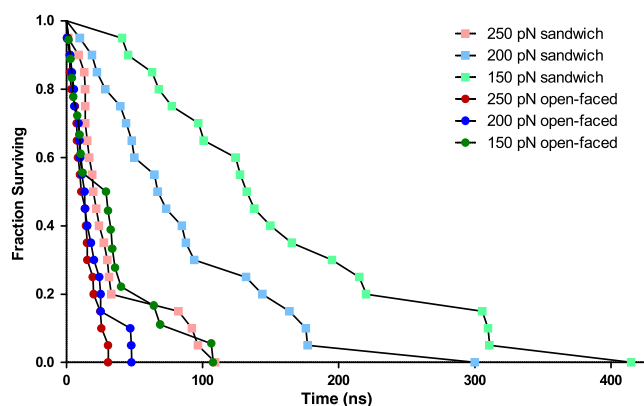
Here, each off-diagonal element  $\lambda_{ij}$  is the rate constant for transitions between states  $i$  and  $j$ ; nonallowed transitions have a rate of 0. The diagonal elements  $\mu_i$  are the overall transition rate out of state  $i$  and are negative by convention (11). The rate matrix therefore contains both the state connectivity (Fig. 6) and the individual transition rates (Table 2), which collectively describe the time evolution of the system. The stochastic nature of individual trajectories is recapitulated by generating a distribution of probable paths connecting the fully intact and fully dissociated states through standard numerical techniques (12). The waiting times for each transition are drawn from random exponential distributions with mean rates specified by  $Q_{ij}$ . At branchpoints where multiple transitions are possible, only the transition with the smallest randomly generated waiting time is assumed to have actually occurred. This process is repeated iteratively until each realization started at the fully intact state has reached the fully dissociated state.

As we were able to observe only on the order of tens of events with the mapping simulations, the individual waiting times are dominated by stochastic noise. To maximize the signal-to-noise ratio, we switched to a smaller system with truncated helical stems (Fig. 3A). The truncated stems were restrained to remain double stranded despite the large applied force, effectively mimicking a much longer helix. These constraints circumvented the need to isolate the separate force-dependent effects on stem fraying versus kissing-loop dissociation. Twenty dissociation trajectories each at 250, 200, and 150 pN were analyzed to quantify the rates of transition between states (Fig. 4). To facilitate extrapolation to the low-force limit, an additional 20 simulations at 100 pN were acquired for 400 ns each. Although not all trajectories had completely dissociated by 400 ns, there were still sufficient microscopic transitions to characterize the 100-pN rate matrix.



**Fig. 3.** Structures of the simplified 2-bp kissing complexes used for quantitative rate calculations. For computational efficiency, the original 7-bp stem of the MMLV kissing-loop complex is replaced with a minimal 2-bp stem. Arrows indicate the external applied force, which are applied to only one strand of each double-helical stem. Stiff distance restraints (orange dashes) are utilized to prevent the stems from fraying—effectively mimicking an infinitely long helix. (Upper) The wild-type complex with intact flanking stacks (in red). (Lower) The open-faced complex with both flanking adenines irreversibly unstacked (red).

In a true ensemble experiment, we could calculate each entry of our Markovian rate matrix  $Q_{ij}$  simply by measuring the number of transitions observed between two states  $i$  and  $j$  divided by the total observation time. However, the simple arrival counting estimate becomes unreliable when dealing with small numbers of events due to increased distortion of the underlying transition rate by random shot noise. However, if we impose a reasonable model for the effects of noise, we can still estimate the most likely rate constant that produced a given set of transitions using fewer observations than required for the arrival counting estimate (see discussion of noise in *SI Text*). Small sample-size noise is a well-studied problem in the field of population biology (12), so we combined a stochastic version of the pure-death population model (Eq. 4) with maximum likelihood estimation (Eq. 5) as described in *Materials and Methods*. The resulting rate estimates are robust in that they are not highly skewed by the chance occurrence of a very early or very late event. This analysis can be applied both to the whole dissociation process assuming overall two-state kinetics (Fig. 4 and Table 1), as well as for each



**Fig. 4.** Survival curves for the dissociation of the 2-bp MMLV kissing complex. Three forces (150, 200, 250 pN) and two starting conformations (stack sandwich and open faced) were simulated with 20 replicates each. Each point indicates the time at which an individual simulation experienced complete dissociation. The stack sandwich conformation has both flanking adenines stacked with the intermolecular CG base pairs, whereas the flanking adenines are irreversibly unstacked in the open-faced starting conformation.

**Table 1.** Overall dissociation rates for the MMLV 2-bp kissing loop as a function of applied force

Simulation	$k_{\text{off}}(\text{s}^{-1})$ fit	$\tau$ (ns) fit	$k_{\text{off}}(\text{s}^{-1})$ model	$\tau$ (ns) model
250 pN, stacks intact	$2.8 \pm 0.3 \times 10^7$	$36 \pm 3$	$2.3 \pm 0.1 \times 10^7$	$44 \pm 2$
200 pN, stacks intact	$9.9 \pm 0.9 \times 10^6$	$101 \pm 10$	$8.3 \pm 0.4 \times 10^6$	$120 \pm 5$
150 pN, stacks intact	$5.2 \pm 0.4 \times 10^6$	$194 \pm 15$	$4.4 \pm 0.1 \times 10^6$	$225 \pm 6$
100 pN, stacks intact	$<2.1 \times 10^6$	$>470$	$5.3 \pm 0.5 \times 10^{5*}$	$1900 \pm 70*$
250 pN, open faced	$6.4 \pm 0.5 \times 10^7$	$16 \pm 2$	$3.8 \pm 0.3 \times 10^7$	$26 \pm 2$
200 pN, open faced	$5.2 \pm 0.4 \times 10^7$	$19 \pm 2$	$3.4 \pm 0.3 \times 10^7$	$29 \pm 2$
150 pN, open faced	$3.0 \pm 0.3 \times 10^7$	$33 \pm 3$	$2.0 \pm 0.2 \times 10^7$	$49 \pm 3$

Rates with standard deviations were extracted from observed dissociation events using the maximum likelihood method, assuming single-exponential kinetics. The flanking aromatic loop bases  $A_9$  and  $A_9'$  are either initially stacked or unstacked (open faced) as indicated.

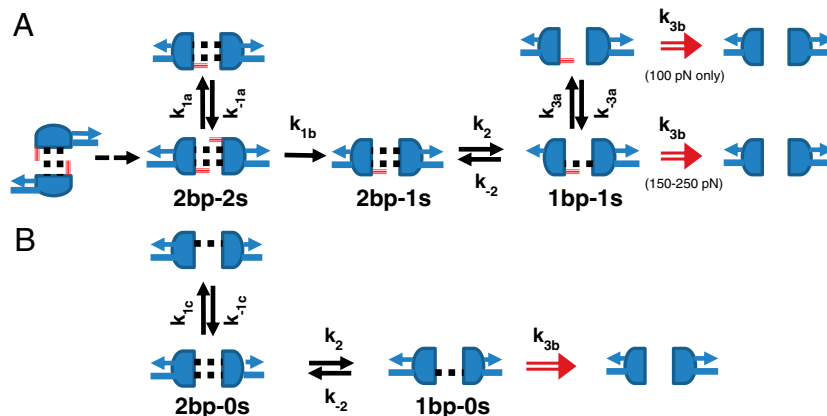
\*Processes extrapolated using a numerical Markov model.

transition between Markovian substates (Table 2) in the detailed dissociation model. As we observe frequent back-and-forth shuffling between adjacent states, we also record the recurrence, which we define as the average number of times a particular transition is observed per trajectory (Table 3).

**Microscopic Dissociation Model for the 2-bp MMLV Kissing Loop.** The pivoting rearrangement of the kissing G-C base pairs to form a bridging complex is force-independent and occurs within the first approximately 100 ps, with both adjacent adenines also rotating to form a stack sandwich. As this transition is both continuous and force-independent, we did not further quantify the rate of this transition. The topmost stack ( $A_9$ ) is then lost in one of two ways; either it transiently unstacks (Fig. 6A,  $k_{1a}$ ) only to restack shortly thereafter (Fig. 6A,  $k_{-1a}$ ), or it unstacks in an irreversible manner (Fig. 6A,  $k_{1b}$ ). Multiple rounds of reversible unstacking and restacking are possible (Fig. 5), but eventually all trajectories pass through the irreversible unstacking transition (Fig. 6A,  $k_{1b}$ ). The distinction between the two modes of unstacking is that the reversible transition merely involves a small rotation of the *chi* glycosidic torsion, whereas the irreversible transition involves a concerted rearrangement of sugar and backbone torsions, making restacking entropically unlikely. Once unstacked, the adjacent  $C_{10}$ - $G_{11}'$  base pair is destabilized and breaks (Fig. 6A,  $k_2$ ). This event is also reversible, and is in fact highly likely to break and reform many times (Fig. 5 and Fig. 6A,  $k_{-2}$ ). The reason  $A_9$  unstacks before  $A_9'$  and  $C_{10}$ - $G_{11}'$  breaks before  $G_{11}$ - $C_{10}'$  is that the external force is applied to only one strand of each double-helical stem to match the optical tweezers experiment (Fig. 2). It is this asymmetric application of force that creates a preferred order for the two otherwise equivalent base pairs to break. After multiple cycles of breaking and repair of the  $C_{10}$ - $G_{11}'$  base pair, ultimately the  $G_{11}$ - $C_{10}'$  base pair will break (Fig. 6A,  $k_3$ ). This final step is completely irreversible under the conditions of large applied force, and leads to the fully dissociated state.

Of the six total microscopic rate constants shown in Table 2, only three show a clear force-dependence; the initial unstacking of  $A_9$  ( $k_{1a/1b}$ ), the repair rate of the  $C_{10}$ - $G_{11}'$  base pair ( $k_{-2}$ ), and the breaking of the final base pair ( $k_3$ ). For the initial unstacking event, the rate is inversely proportional to the amount of applied force: At the highest force examined (250 pN),  $k_{1b}$  is four times faster than the force-invariant transition  $k_2$ , whereas at the lowest force examined (150 pN), it is four times slower. Similarly, the breaking of the last base pair ( $k_3$ ) is six times faster than  $k_2$  at 250 pN and equal to  $k_2$  at 150 pN. Neither of these steps, however, constitutes the rate-limiting step in the low force limit. At all forces examined, the majority of each trajectory is spent breaking and reforming the  $C_{10}$ - $G_{11}'$  base pair, corresponding to transitions  $k_2$  and  $k_{-2}$ . The average recurrence is inversely proportional to the applied force, and ranges from about  $3\times$  at 250 pN to about  $8\times$  at 150 pN. As force is lowered, the increased recurrence is entirely due to an increase in the base pair repair rate  $k_{-2}$ , as the





**Fig. 6.** Discrete-state stochastic model for the dissociation of MMLV 2-bp kissing-loop complexes: (A) Stack sandwich complex with both flanking adenine in a stacked conformation. (B) Open-faced complexes with flanking adenines initially unstacked. Intact base pairs are represented by dotted black lines, with the  $C_{10}$ - $G_{11}'$  base pair at top and the  $G_{11}$ - $C_{10}'$  base pair at bottom. Intact stacking interactions with flanking purines are indicated by a solid red line, with  $A_9$  at top and  $A_9'$  at bottom. The gray arrows indicate which of the two strands of each hairpin stem bears the applied force. Transitions  $k_{3a}$  and  $k_{-3a}$  are only observed at 100 pN.

tion rate of the  $C_{10}$ - $G_{11}'$  base pair (Fig. 6B,  $k_2$ ) is identical to those observed in the stacked simulations (Fig. 6A,  $k_2$ ). However, the lack of a stabilizing stack with  $A_9'$  results in an increase in the breaking rate of the  $G_{11}$ - $C_{10}'$  base pair (Fig. 6B,  $k_3$ ) by an order of magnitude. This unstacking also results in greatly diminished recurrence rates for the breaking/reforming of the  $C_{10}$ - $G_{11}'$  base pair (Table 3). At 150 pN, this back-and-forth process only occurs approximately 1.6 times on average for the open-faced complex versus approximately nine times in the case of the fully stacked complex. Finally, in the absence of stacking with  $A_9'$ , it is occasionally possible for  $G_{11}$ - $C_{10}'$  to break before  $C_{10}$ - $G_{11}'$  (Fig. 6B,  $k_{1c}$ ). This step is an off-pathway event as  $G_{11}$ - $C_{10}'$  reforms and dissociation ultimately occurs in the same order as observed in the stacked simulations. The unpaired, flanking adenine residues therefore increases the mechanical stability of the kissing complex in multiple ways.

**Extrapolation to dissociation rates at lower forces.** To extrapolate our findings to lower forces, we also ran a set of simulations at 100 pN. Under these conditions, it was impractical to simulate until every trajectory achieved complete dissociation; after 400 ns, only 11 of the 20 simulations had experienced complete dissociation. By itself, this calculation would only provide a lower-bound estimate of the true overall dissociation time (Table 1). However, examination of the 11 dissociated trajectories revealed that all of the microscopic transitions were sampled, some as many as 130 times, which allowed us to extract the individual transition rate constants (Table 2). The corresponding Markov model was then numerically simulated to predict an overall lifetime of approximately 1.9  $\mu$ s at 100 pN.

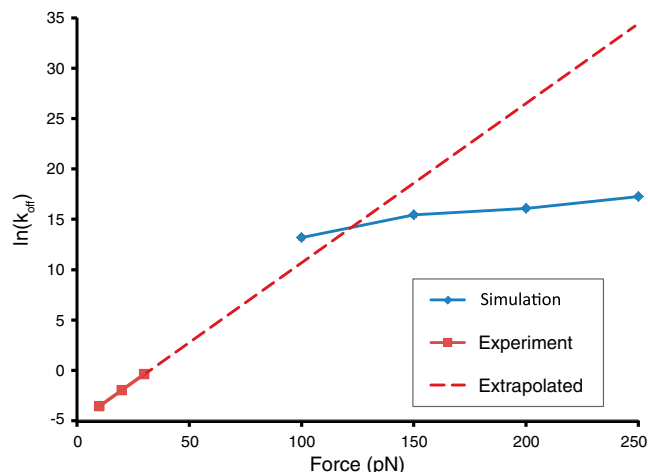
Two distinct features were observed in the 100 pN dissociation trajectories that were not present at higher forces. The first is that the breaking of the final base pair ( $G_{11}$ - $C_{10}'$ ) becomes highly reversible because of the stabilizing intermolecular stack seen at the transition state (Fig. 8), resulting in a significant chance for even a complex with zero intact base pairs to reform (Fig. 6,  $k_{3a/-3a}$ ). This observation provides yet another mechanism by which the flanking stacked adenines are able to enhance the mechanical stability of the kissing complex at lower forces. The other phenomenon of note was the presence of out-of-order transitions. At higher forces, the order of events in Fig. 6 was always strictly obeyed, a consequence of the asymmetric application of force to just one strand of each duplex stem. However, at 100 pN we observed a mirror image dissociation pathway, in which  $A_9'$  unstacks first, and  $G_{11}$ - $C_{10}'$  breaks before  $C_{10}$ - $G_{11}'$ . Although rare (occurring in only one trajectory), we can hypothesize that

at zero force, the normal and mirror image pathways may become equally likely.

The accuracy of the stochastic model can be assessed by back-calculating the off-rate for the overall dissociation process and comparing it to the directly observed rates from the molecular dynamics simulations (Table 1). It can be seen that the model preserves all of the trends in the directly observed lifetimes, albeit with a systematic overestimation of approximately 20%. The major source of error lies in the poorly sampled transitions  $k_{1a}$  and  $k_{1c}$ , which control how frequently trajectories visit an off-pathway intermediate. As both transitions have a recurrence of less than 1 (Table 3) the corresponding rates (Table 2) suffer from a relative uncertainty of 10 to 50%. In contrast, the breaking and reforming the  $C_{10}$ - $G_{11}'$  base pair ( $k_2$  and  $k_{-2}$ ), with a recurrence ranging from three to nine, is extremely well-characterized with a relative uncertainty of only 0.5 to 3%. Uncertainty in the reverse transitions  $k_{-1a}$  and  $k_{-1c}$  do not significantly affect the overall lifetime because they are not in competition with other transitions. The accuracy of the model increases at lower forces where the majority of the trajectory is spent sampling the transitions with the smallest uncertainty (Fig. 5).

**Comparison with experimentally measured off-rates.** Ideally, one would simulate dissociation at the same forces used in the optical tweezers experiments. Unfortunately, it is currently intractable to run all-atom, explicit solvent simulations in the millisecond to second timescale. However, by measuring the off-rates over a range of forces, the scaling of the logarithm of the off-rates as a function of applied force can be directly compared between experiment and simulation. Li et al. found that the MMLV kissing loop is strikingly insensitive to the amount of applied force, resulting in slope of just 0.16 when  $\ln(k_{\text{off}})$  is plotted against applied force from 13 to 30 pN (10); this slope is an order of magnitude less sensitive than for the force-unfolding of an RNA hairpin. The molecular simulations also predict a very small force-dependence of the off-rate, although with an average slope of 0.027 (from 150–250 pN) it is significantly smaller than that the experimentally measured slope (Fig. 7). At the lowest force examined (100 pN), there is a slight but discernible increase in slope to 0.042.

The simplest model for the force-scaling of bond breakage is Bell's relation, which assumes that the application of force affects only the height, but not the location of the transition state—effectively tilting the free energy landscape (13). If we assume that a linear Bell-like scaling should hold from 10 to 340 pN (Fig. 7, dotted line), then the experiment only quantitatively agrees with



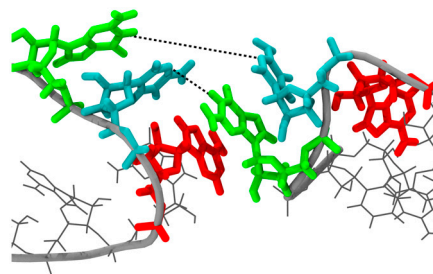
**Fig. 7.** Force-scaling of  $\ln(k_{\text{off}})$  for the MMLV 2-bp kissing complex. Experimentally observed off-rates are shown in red triangles, with the high-force prediction via Bell's relation shown as red dashes. The simulation-derived off-rates are shown as blue diamonds.

the simulation at the lowest forces examined (100–150 pN). The apparent Bell-like scaling from 100–250 pN is a result of an increasing tendency for the  $C_{10}$ - $G_{11}'$  base pair to break and reform ( $k_2$ ,  $k_{-2}$ ) at lower forces. This highly recurrent step is controlled by relative rates of the two competing transitions,  $k_{-2}$  and  $k_{3b}$ , of which only  $k_{-2}$  appears to obey Bell-like scaling whereas  $k_{3b}$  remains constant. The rate-limiting process for MMLV rupture is therefore reversible and not dictated by the height of the single largest barrier, thus violating two key assumptions shared by classical single-bond breakage models.

A more nuanced approach would be to scale the individual microscopic transitions using either Bell's relation or the generalized force-scaling expressions of Dudko et al. (14). However, closer examination of the transition rates (Table 2) reveals that only  $k_{1b}$  appears to obey a Bell-like scaling. The remaining transitions may adhere to a more generalized scaling relationship, but it would require substantially more data as a function of force to extract the curvature parameters. Some particularly problematic transitions do not vary monotonically with increasing force, and therefore would not be compatible even with the most general barrier models (for example,  $k_2$  is actually slower at 200 pN than either 250 or 150 pN).

Our findings also indicate additional possible sources of curvature in approaching the low force regime. Prior work has shown that curvature is to be expected when different barriers become rate-limiting at different force regimes (15), or when very large forces induce a shift in the transition state location (16). We find at 100 pN that a previously unobserved intermediate appears (Fig. 6A,  $k_{3a}$ ,  $k_{-3a}$ ), which allows for a reversible breaking and repair of the  $G_{11}$ - $C_{10}'$  base pair, whereas as at higher forces only irreversible breaking was observed. The off-rate at 100 pN is consequently slower than would be predicted using Bell's relation with the 150–250 pN data alone. Additionally, we find the transition state at 150 pN (Fig. 8, discussed below) is force-dependent, as simulations of the same state at 100 pN or 200 pN result in approximately 90% of the trajectories reaching the fully base paired or fully dissociated states, respectively. Finally, we expect that as the force approaches zero, the mirror-image dissociation pathway discussed above should become more likely. Therefore, although we cannot directly probe the gap between the force regimes used in experiment and simulation, our findings strongly indicate that Bell's relation should not hold from 10 to 300 pN.

**Verification of the proposed transition state conformation.** The linear extension at the transition-state ( $X_{\text{unkiss}}^\ddagger$ ) for the force-dissocia-



**Fig. 8.** The observed transition state at 100 pN applied force. This state occurs within step  $k_3$  of the kinetic scheme in Fig. 6A, and is found to have nearly a 50-50 chance of dissociating or reforming a doubly base-paired complex when simulated 100 times with different starting velocities.

tion of the MMLV kissing loop has been previously determined to be 0.7 nm from analysis of optical tweezers experiments (10). The structural origin of this distance is unclear, as it is too large to reflect an interstitial solvent molecule (17) or an in-place breakage of the intermolecular hydrogen bonds. It was hypothesized that the small  $X_{\text{unkiss}}^\ddagger$  results from the simultaneous breaking of both kissing base pairs (10), which is difficult to reconcile with the coaxially stacked conformation observed in NMR structure (Fig. 1). We can address this dilemma by determining the geometry of the MMLV complex at the transition-state of our dissociation trajectories.

Once the transition to the bridging form occurs, the H-bonds remain parallel to the applied force for the remainder of the trajectory. The linear extension along the pulling axis can no longer distinguish between fully intact and partially broken complexes, making it a degenerate reaction coordinate. A similar phenomenon was previously identified in analytical models of RNA hairpin unfolding (18), where additional reaction coordinates were required to uniquely identify the transition-state. Instead of relying on linear extension alone, we can identify the transition-state as occurring at the most rate-limiting, force-dependent process in our model. The majority of each trajectory is spent breaking and reforming the  $C_{10}$ - $G_{11}'$  base pair, with the magnitude of the applied force determining the relative probability of  $C_{10}$ - $G_{11}'$  reformation versus irreversible  $G_{11}$ - $C_{10}'$  breakage. The highly recurrent state with  $C_{10}$ - $G_{11}'$  broken and  $G_{11}$ - $C_{10}'$  intact must therefore lie just before the transition-state. Using these criteria, we identified several putative transition states from the dissociation trajectories. The transition-state has, by definition, equal probabilities for complete dissociation or reforming a doubly base-paired complex; i.e., it exists within transition  $k_3$ . This fact was confirmed by running 100 short (5 ns) simulations of each putative transition-state with different, random initial velocities and 150 pN constant applied force. The conformation shown in Fig. 8 satisfied this criterion with 56/100 trajectories dissociating and 44/100 trajectories forming a doubly base-paired complex; it therefore has a transmission coefficient (19) of 0.56. The observed transition-state exhibits a wide separation of  $C_{10}$  and  $G_{11}'$  as this base pair breaks early in the dissociation process; in contrast  $G_{11}$  and  $C_{10}'$  are significantly closer as it is a very late event. The separation of the  $C_{10}$  and  $G_{11}'$  is approximately 1.1 nm whereas the  $G_{11}$  and  $C_{10}'$  are separated by only 0.6 nm (Fig. 8, dotted lines). The asymmetric separations of the two base pairs simply reflects the preferred breaking order at high forces based on the asymmetric application of force to one strand in each duplex. Significantly,  $A_9$  remains stacked with  $G_{11}$  from the opposing loop; this key intermolecular stacking interaction enables repair of the  $G_{11}$ - $C_{10}'$  base pair at low forces. This stabilization is also reflected in the breaking rate  $k_3$  which is an order of magnitude faster in the absence of the flanking  $A_9$  stack (Table 2).

In the optical tweezers experiments, the two hairpins are tethered together with a 30 nucleotide linker; however, the use



more likely to reform in the presence of stabilizing stacking interactions. The enhanced repair rate can be explained by the exclusion of solvent by the flanking stack from the base-pair junction, effectively preventing the exchange of a base-base hydrogen bond with a base-solvent hydrogen bond. As the rate of base-pair repair is inversely proportional to the magnitude of the applied force, dozens of back-and-forth transitions are often observed at low forces before complete dissociation occurs. The adjacent, unpaired purines therefore kinetically stabilize the MMLV complex by promoting self-healing from dissociation-promoting fluctuations. This nearest neighbor stabilization is reminiscent of the well-studied effects of dangling purines on the thermodynamics of RNA secondary structure formation (28).

The third major finding is an atomistic interpretation of extension at the transition state ( $X_{\text{linkkiss}}^{\ddagger}$ ) for the force-induced dissociation of the MMLV kissing loop.  $X^{\ddagger}$  has been previously determined to be 0.7 nm from analysis of optical tweezers experiments (10), although there has not been a structural explanation for this result. We find that the transition state has both base pairs fully dissociated with one flanking adenine unstacked and the other forming an intermolecular stacking interaction (Fig. 8). Therefore, a complete description of the transition state requires additional reaction coordinates in addition to the linear extension. The two dissociated base pairs are separated by different amounts corresponding to the order in which they are broken; the  $C_{10}$ - $G_{11}$ ' base pair breaks early and is separated by approximately 1.1 nm whereas the late-breaking  $G_{11}$ - $C_{10}$ ' base pair is separated by only 0.6 nm. This experimentally derived  $X^{\ddagger}$  falls squarely between these two values, and is consistent with the hypothesis that both kissing base pairs are simultaneously broken at the transition state and aligned with the axis of applied force. Furthermore, we find that the transition state exhibits an intermolecular stacking interaction of  $A_9$ ' with  $G_{11}$ , which explains how the lone  $G_{11}$ - $C_{10}$ ' base pair can repair itself at low forces.

Although it is currently intractable to directly simulate dissociation events at the low forces (2–30 pN) utilized in the optical tweezers experiments, we can extrapolate the trends we have observed at higher forces (100–300 pN) to the low-force regime. The coaxial to bridging conformational rearrangement should still occur at very small forces due to its low activation barrier; this step alone allows the combined stability of multiple base pairs to become multiplicative rather than merely additive as in the unzipping of a canonical duplex. The stabilizing effect of the flanking stacks should continue to increase nonlinearly as the magnitude of the force is reduced. The rate of unstacking of  $A_9$  ( $k_{1b}$ ) should continue to decrease in response to reduced force, whereas the repair rate of the  $C_{10}$ - $G_{11}$ ' base pair ( $k_{-2}$ ) concomitantly increases; this increase in repair rate will result in ever-increasing numbers of  $C_{10}$ - $G_{11}$ ' break-repair cycles. Below 100 pN, the exact same phenomena should apply to the reversible breaking and repair of  $G_{11}$ - $C_{10}$ ' due to the presence of a stack with  $A_9$ '. As the magnitude of applied force is further reduced, the symmetrical nature of the kissing-loop complex should also result in parallel dissociation pathways that can initiate from either end of the loop-loop interface. This prediction could be experimentally tested via substitution of either flanking adenine with a pyrimidine base. We predict that mutation of the loop adenine distal to the applied force would have greater destabilizing effect at high forces.

In light of what we have learned about the stabilizing features of a minimal, 2-bp kissing loop, we can speculate how our findings might relate to the stability requirements of larger kissing loops. The ability to evenly distribute load among multiple bonds would seem to favor as large a loop-loop interface as possible. However, a sufficiently large loop-loop interface would eventually favor formation of a coaxial A-form helix, which would then dissociate via the less stable sequential unzipping mechanism. It has been previously shown using a series of loop-size mutations of the

CopA/CopT kissing loop that the optimum loop size is five to seven nucleotides, with a rapid loss of affinity for loop sizes  $>7$  (29). The need to maintain adequate loop flexibility to achieve a parallel bond arrangement may explain the requirement for unpaired, flanking bases in other highly stable kissing loops. Conflicting reports of the conformation of the flanking bases of the HIV DIS kissing loop might actually reflect the true conformational heterogeneity inherent to kissing complexes (27). This prediction could be tested using a stacking-sensitive fluorescent probe such as 2-amino-purine incorporated into the kissing-loop flanking sequence. HIV DIS (9), Avian leukosis virus, and Rous sarcoma virus (30) all prefer purines at these unpaired loop positions; this curious preference may be explained by the ability of purines to decrease the off-rate of adjacent base pairs without sacrificing flexibility of the loop-loop interface. It is notable that the tRNA anticodon-anticodon dimer with three intermolecular base pair utilizes a seven nucleotide loop with unpaired, flanking purines required for maximum binding affinity (31). We further speculate that the inherent flexibility of loops may allow kissing complexes to form at angles other than  $180^\circ$ —an attribute that may explain why some destabilizing mutations unexpectedly affect on-rates more than off-rates (32). This prediction could be tested using constructs connected by shortened linkers that encourage the formation of bent kissing complexes.

## Materials and Methods

**Details of the Molecular Dynamics Simulations.** All molecular dynamics simulations were performed using version 4.0.5 of the GROMACS molecular dynamics package (33). RNA was modeled using the AMBER-99 force field (34) ported to GROMACS by Sorin and Pande (35). The rigid three-site TIP3P model (36) was used to simulate water molecules. Ions were modeled using the parameters of Åqvist (37) according to the approach proposed by Chen and Pappu (38) to eliminate spurious ion-pairing artifacts. All simulations maintained a constant pressure of 1 bar and temperature of 298 K using the weak coupling algorithms of Berendsen and coworkers (39) with coupling constants of 1 and 0.2 ps, respectively. The equations of motion were integrated using a 2-fs time step and the leapfrog algorithm (40). The two bond lengths and one bond angle in each water molecule were constrained to values prescribed by the TIP3P model using the SETTLE algorithm of Miyamoto and Kollman (41). Snapshots were saved for analysis once every 2 ps. Periodic boundary conditions were employed to mimic the macroscopic setting for electrolytes. Long-range electrostatic interactions between periodic images were treated using the particle mesh Ewald approach (42), with a grid size of 0.12 nm, fourth-order cubic interpolation and a tolerance of  $10^{-5}$ . Neighbor lists were updated every 10 time steps. A cutoff of 10 Å was used for van der Waals interactions, real space Coulomb interactions, and for updating neighbor lists.

Initial coordinates for the 2-bp H3 MMLV kissing loop were obtained from the NMR structure of Kim and Tinoco (22), Protein Data Bank (PDB) ID code 1F5U (Fig. 1). The full-length MMLV kissing-loop complex (two hairpins, each with 4 nt loops and 7 bp stems) was placed in a rectangular box of dimensions  $60 \times 60 \times 120$  Å. Both hairpins share the same nucleotide sequence, 5'-GGUGGGAGACGUCCACC-3', and carry a net charge of -17 because the 3' end is capped with a hydroxyl group. The kissing loop was rotated such that the helical axis was aligned with the longest box dimension—a strategy that is permissible as the application of external force effectively prevents free rotation of the RNA complex. The full-length system (42,363 atoms) contained 13,839 TIP3P waters, 62  $\text{Cl}^-$  anions, and  $62 + 34 \text{K}^+$  cations to maintain net electroneutrality as well as mimic the experimental conditions of 250 mM excess KCl. It should be noted that the experiments are performed in the absence of  $\text{Mg}^{2+}$ —a significant simplifying factor as current force-fields are unable to adequately describe divalent ions. The external pulling force was applied along the long box axis to the  $\text{O5}'$  atom of  $G_1$  and the  $\text{O3}'$  atom of  $C_{18}$ '. Exploratory simulations were run at 100, 200, 300, and 400 pN of constant applied force (two independent trajectories at each force). Simulations were terminated when dissociation occurred for each of the simulations, ranging from  $<500$  ps at 400 pN to 46 ns at 200 pN. The 100-pN simulations were terminated after no dissociation had occurred within 70 ns. Detailed, state-mapping simulations were run at 240, 260, 280, 300, 320, and 340 pN (10 replicates each) until dissociation occurred or 40 ns, whichever came first.

To acquire sufficient statistics to accurately quantify the rates of transitions between substates, a smaller, truncated stem version of the H3 MMLV



2-bp kissing loop was also created, where the double-stranded stems are only 2-bp long. This truncated system utilized a rectangular box of dimensions  $50 \times 50 \times 90 \text{ \AA}$ , containing 7,023 TIP3P waters, 16  $\text{Cl}^-$  anions, and  $16 + 14 \text{ K}^+$  cations (mimicking 250 mM excess KCl salt), a total of 21,633 atoms. In these simulations, the initial bridging conformation has both intermolecular base pairs parallel to the axis of applied force (Fig. 3A). The external pulling force was applied along the long box axis to the O5' atom of  $G_1$  and the O3' atom of  $C_8$ . Fraying of the shortened stems was prevented via the application of harmonic restraining potentials to enforce Watson–Crick base pairing; each of the 10 hydrogen bonds was restrained to its equilibrium distance with a force constant of  $10,000 \text{ kJ mol}^{-1} \text{ nm}^{-2}$ . Simulations utilized a constant pulling force of 250, 200, 150, or 100 pN. Simulations at 250–150 pN were run until all 20 independent replicates had dissociated, taking as long as 415 ns at 150 pN (Fig. 4), whereas simulations at 100 pN were discontinued after 400 ns. The use of 20 replicates was a trade off between increased statistical significance and decreased computational feasibility that was arrived at via fitting of simulated noisy data (SI Text).

To test the hypothesis that the sandwich of adjacent adenine stacks helped stabilize the kissing interaction, a control set of open-faced versions of the truncated 2-bp complexes were also simulated. These simulations were identical in all aspects to the truncated stem simulations described above, except that both adjacent adenines ( $A_9$ ,  $A_9'$ ) start off irreversibly unstacked (Fig. 3B). Twenty replicate pulling trajectories were simulated at 250, 200, and 150 pN (Fig. 4).

Five transition-state candidates were chosen from snapshots taken exactly midway along the  $k_3$  transition at the lowest force examined (150 pN). As the duration of the transition is less than 5 ps, there was typically only one snapshot per trajectory that satisfied this criterion. 100 short, 5 ns simulations were seeded from these snapshots: all atomic positions, including those of the solvent and ions, were preserved, whereas velocities were randomly assigned to recapitulate a Boltzmann distribution at 298 K. The conformation shown in Fig. 8 is the one that came closest to exhibiting a 50/50 ratio between dissociating and reforming a doubly base-paired complex, with a transmission coefficient of 0.56.

**Criterion for Detecting Transitions Between States.** To determine the rates of base pair breaking/reforming and stacking/unstacking of the adjacent adenine, it was necessary to define binary, geometric criteria for base pair and stacking integrity. It should be noted that the interevent waiting times were typically on the order of nanoseconds to tens of nanoseconds, whereas the duration of base pair breaking and unstacking transitions themselves were usually less than 2 ps; therefore, the results are insensitive to the exact choice of reference atoms and cutoff distance. The state of the two C-G base pairs were determined by the distance of the central hydrogen bond, that is the guanine  $N_1$  atom to the cytosine  $N_3$  atom, using a cutoff of  $4 \text{ \AA}$ . For the stacking state of the flanking  $A_9$  base we used the distance between the  $C_4$  atom of  $A_9$  base and the  $C_2$  atom of the  $G_{11}$ , as  $A_9$  is located midway along the adjacent  $C_{10}$ - $G_{11}$  base pair in the bridging conformation (Fig. 2). Distances  $\leq 6 \text{ \AA}$  were considered an intact stack and greater distances considered unstacked; identical criterion was used to determine the stacking state of  $A_9'$  along the adjacent  $G_{11}$ - $C_{10}'$  base pair.

**Calculation of Transition Rates Using the Pure-Death Stochastic Model.** We extracted rate constants from each ordered set of dissociation times using a stochastic version of the pure-death population model (12), as follows:

$$P_n(t|\mu) = \binom{n_0}{n} e^{-n\mu t} (1 - e^{-\mu t})^{n_0-n}. \quad [4]$$

Eq. 4 is the probability of  $n$  survivors remaining after elapsed time  $t$ , given that the initial population is  $n_0$  and the time-independent death rate is  $\mu$ . This model accounts for the noise inherent in small sample sizes by treating each dissociation event as the outcome of a separate Bernoulli trial; different statistical weights are assigned depending on the relative order of occurrence compared to all other recorded events. To extract  $\mu$  for a particular transition, we create an ordered list of all the observed waiting times for that transition sorted from shortest to longest. Forward and backward transitions were analyzed separately, because we assume there is no memory between these events. We then use maximum likelihood estimation (MLE) to extract the most probable value of  $\mu$  that produced the entire set of observed waiting times (43). The likelihood function of Eq. 4 is therefore,

$$L(\mu|t_1 \dots t_n) = \prod_{i=1}^n \frac{dp_n}{dt}(\mu|t_i). \quad [5]$$

The time derivative of Eq. 4 generates a probability density function (PDF) of waiting times given an event rate  $\mu$ . We then swap the domain and range, such that each waiting time  $t_i$  generates a probability density of likely values of  $\mu$ . The final likelihood function is simply a product of all the individual PDFs generated for each waiting time  $t_i$ . In all cases we obtain Gaussian-like distributions; the reported rate constants (Tables 1 and 2) are simply the location of the peak, and the reported standard deviations  $\sigma$  are the full-width-half-maximum divided by 2.35. This analysis requires the a priori assumption that the process is well-modeled by a single exponential decay. This assumption is shown to be accurate in the case of transitions that become highly recurrent at low forces. For example, at 150 pN, there are approximately 180 observed transitions for  $k_2$  and  $k_{-2}$  (Table 2), resulting in extremely large coefficients in the combinatorial prefactor of Eq. 4 which complicates evaluation of the MLE. However, in such cases (denoted by a dagger, †, in Table 2), there is ample data to directly fit the survival curve to a single-exponential using standard nonlinear least squares fitting. Rates obtained in this fashion are reported to three significant figures instead of two to reflect the significantly reduced uncertainty. For infrequently sampled transitions, rate estimates benefit by including auxiliary information such as censored events due to incomplete transitions as well as transition probability ratios from the recurrence values. These procedures are described in the SI Text.

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