### Persistence length $(l_p)$

<ubr/>
<u(s)·u(s')>=exp(-|s-s'|/l\_p)<br/>
The value of  $l_p$ <br/>  $l_p$  (ds-DNA)-50 nm,<br/>  $l_p$  (ss-DNA)-1-2 nm,<br/>  $l_p$  (RNA)-1-2 nm,<br/>  $l_p$  (RNA)-1-2 nm,<br/>  $l_p$  (polypeptides)-0.4 - 0.7 nm,<br/>  $l_p$  (actin)-15 µm,

 $l_p$  (microtubule)-0.5-8mm (Compare this length with cell dimension - 12 µm) ( $l_p$  of polyelectrolyte strongly depends on ionic condition).



#### Measurement of persistence length

Wormlike-chain (WLC) model suggests the analytical expression of force-extension curve or end-to-end distance distribution function P(R). The persistence length is usually obtained by fitting the experimental data to these expressions. (e.g. lp of ds-DNA has been measured to give lp~50nm)

Number of Samples

$$\Psi_{WLC}[\vec{u}(s)] \propto \exp\left[-\frac{l_p}{2}\int_0^L ds \left(\frac{\partial \vec{u}}{\partial s}\right)^2\right] \times \prod_{0 \le s \le L} \delta\left(\vec{u}^2(s) - 1\right)$$





$$f_{WLC} = \frac{k_B T}{l_p} \left[ \frac{1}{4(1 - x/L)^2} + \frac{x}{L} - \frac{1}{4} \right]$$

Bustamante, Marko, Siggia, and Smith, Science 265 1599-1600

 $P_{WLC}(R) = \frac{4\pi C(R/L)^2}{(1-(R/L)^2)^{9/2}} \exp\left[-\frac{3(L/l_p)}{4(1-(R/L)^2)}\right]$ 

Valle et al (2005) PRL vol 95 158105; Hyeon & dt (2006)

# Single Molecule Force Spectroscopy

Do not waste clean thoughts on dirty experiments

Introduction to RNA Folding RNA Hairpin

Generalized Rouse Model (GRM)

### Uses of constant force or constant x

RNA folding (Bustamante, Block, Williams..) Protein Folding + ribosome (Rief, Fernandez, Marqusee..) Motors (Block, Yangida, Vale, Goldman, Valentine, Neuman,..)

### RNA hairpin Folding landscape : SMFS

#### Woodside + Block (2006)





Changbong Hyeon, Greg Morrison & dt PNAS 105, 9607 (2008) Riboswitch: J. C. Lin &dt JACS 130, 14080 (08) Force Quench Refolding: C. Hyeon, G. Morrison, D. Pincus & dt PNAS (09)

### RNA Folding (Mg<sup>2+</sup>) problem



#### Forced-unfolding Tetrahymena Ribozyme Energy landscape from LOT FEC



**Onoa et. al. Science Vol 299, 1892 (2003)** 

### Folding Trajectory of Poly-Ub using force clamp



Fernandez, and Li Science vol 303, 1674-1678 (2004)

# LOT Experimental Setup

#### RNA Hairpin



Free Energy profiles  $F(z_m)$  and hopping kinetics from  $z_{sys}(t)$ 

 $L \approx (1-10)\mu m$  $I_P \approx 50nm$  $RNA \approx 2nm$ b = 500nm

Effect of Attaching handles on the hairpin



The distribution of extensions can be computed. This gives the free energy  $\beta F_{eq}(z) = -\log[P_{eq}(z)]$ 



Woodside, Science 314 1001 (2006)

#### Sequence determines energy landscape of hairpins $\tau_F = \tau_0 exp(-\Delta x_F^{\dagger}F/k_BT)$ Woodside et. al. Science, 314, 1001 (06) В hairpin 545-Extension (nm) 540-535transition bead state 530 525 handles 520 A G 5 10 Time (s) 5 15 laser beam 10<sup>2</sup> 20. С D $\Delta x$ Distance (nm) Lifetime at $F_{1/2}$ (s) $\tau \approx e^{G^{\dagger/T}}$ 10<sup>1</sup> $\Delta x^{\ddagger}$ 10<sup>0</sup> $\Delta x_u^{\ddagger} + \Delta x_f^{\ddagger}$ 10-1 $\Delta x^{\ddagger}$ 10-2 0-10 15 205 10 12 14 1 Modeled barrier height $(k_{\rm B}T)$ 8 16 $\approx \Delta X$ Transition state (bp from folded state)

### What can we learn from SMFS?

- Construct free energy profiles F(R) vs R
- Is this correct?
- Extract dynamics at F other than  $F_m$  ( $F_{1/2}$  in Woodside)?

• All require sound theory beyond clean data!

### Effect of bead dynamics



$$\tau_r = \gamma/k$$

 $\gamma = 6\pi\eta a, a = 1\mu m, \eta \approx 1cP, k_p \approx 0.01 \text{ pN/nm}$   $k_m \approx 0.1 \text{ pN/nm}$  $k = k_p + k_m$ , we find  $\tau_r \leq 1 \text{ ms}$ .

cf. RNA hairpins (Bustamante and coworkers) or DNA hairpins (Block and coworkers) Hopping time ~ 0.1-1 sec.

> • Folding/Unfolding time >> Bead relaxation time  $\tau_U^o \approx \tau_F^o \gg \tau_r$  at  $f \approx f_m$

Role of linkers in modulating the Energy landscape & Kinetics

Equilibrium free energy profiles F(z<sub>m</sub>)
 Force-dependentHopping kinetics



22-mer P5GA in the simulation.



# Some Simulation Results on Kinetics

Hyeon: Hopping kinetics in a constant loading rate simulation of the P5GA RNA hairpin depends on the handle length.



Increasing handle length increases the force required for rupture.

Stiffer handles have a greater effect on the rupture forces.

Hyeon and dt, Biophys J 90 3410 (2006)

# Simulations of the P5GA Hairpin

20

Native Contact

P5GA is a 22-mer RNA, which forms a hairpin.

The hairpin structure stabilized by Stacking interactions and h-bonds

Simulations show P5GA's midpoint force  $(f_m)$  is about 15.4 pN.

C.Hyeon and dt, Biophys J 92 731 (2007)

#### P5GA modeled using the Self-Organizing Polymer (SOP) Model

$$\begin{split} \mathbf{H} &= -\sum_{i=1}^{N-1} \frac{k}{2} R_0^2 \log(1 - \frac{(r_{i,i+1} - r_{i,i+1}^o)^2}{R_0^2}) & \text{(Connectivity of the backbone)} \\ &+ \sum_{i=1}^{N-3} \sum_{j=i+3}^{N} \epsilon_h [(\frac{r_{ij}^o}{r_{ij}})^{12} - 2(\frac{r_{ij}^o}{r_{ij}})^6] \Delta_{ij} & \text{(Native Interactions)} \end{split}$$

$$+\sum_{i=1}^{N-2} \epsilon_l (\frac{\sigma^*}{r_{i,i+2}})^6 + \sum_{i=1}^{N-3} \sum_{j=i+3}^{N} \epsilon_l (\frac{\sigma}{r_{ij}})^6 (1 - \Delta_{ij}).$$
(Non-Native Excluded Volume)

of

Overdamped Langevin dynamics is used

Hyeon & dt, Biophys J 92 731 (2007)

# The Midpoint Force

Accurate profiles and kinetics require  $f \approx f_m$ 



At  $f \approx f_m$ the hairpin samples both basins of attraction.

The equilibrium and kinetic properties can be reliably measured.

# The Midpoint Force

Accurate profiles and kinetics require  $f \approx f_m$ 



For  $f \ll f_m$  or  $f \gg f_m$ the hairpin is trapped in one basin only.

> Accurate statistics require a prohibitively long time.

Handles can be stiff or flexible, depending on bending rigidity.



$$H_{handles} = \sum_{i=1}^{N-1} \frac{k_B}{2} (r_{i,i+1} - b)^2 - \sum_{i=1}^{N-2} k_A \hat{r}_{i,i+1} \cdot \hat{r}_{i+1,i+2}.$$
  
Connectivity of Resistance to  
the handles bending

$$H_{handles} = \sum_{i=1}^{N-1} \frac{k_B}{2} (r_{i,i+1} - b)^2 - \sum_{i=1}^{N-2} k_A \hat{r}_{i,i+1} \cdot \hat{r}_{i+1,i+2}.$$

The Wormlike Chain model characterizes stiffness with the persistence length  $l_p$ 

We choose the monomer spacing b = 0.5 nm

 $k_A = 7 \text{pN nm}$  gives  $l_p = 0.6 \text{ nm}$  (flexible chain)  $k_A = 561 \text{pN nm}$  gives  $l_p = 70 \text{ nm}$  (very stiff chain)



*z*<sub>0</sub> is harmonically bound to the origin
A force *f* =15.4 pN applied at *z<sub>P</sub>* in the z-direction
Transverse fluctuations in *z*<sub>0</sub> and *z<sub>P</sub>* are suppressed

### What we measure



$$z_m(t) = z_{3'} - z_{5'}$$

The extension of the RNA (the quantity of interest)

$$z_{sys}(t) = z_P - z_0$$

The distance between the beads (the experimental observable)

# A Typical Time Trace for our Simulation

P5GA Simulation ssDNA experiment





The SOP model for RNA behaves similar to experiments on other hairpins.

> The SOP shows the expected two-state behavior

# Equilibrium Properties of Interest

•  $\beta F_{eq}(z_m) = -\log[P_{eq}(z_m)]$ 

The free energy, measured using  $z_m$ 

• 
$$\beta F_{eq}(z_{sys}) = -\log[P_{eq}(z_{sys})]$$

The free energy, measured using  $z_{sys}$ 



The intrinsic free energy, with no handles attached

All of these quantities are computed using the distribution of time traces

# Free Energy Profiles



Solid Black: $\beta F_{eq}^o(z_m)$ Solid Red: $\beta F_{eq}(z_m)$ Dashed Blue: $\beta F_{eq}(z_{sys})$ 

Attaching stiff handles does change the free energy, but  $\beta F_{eq}(z_m) \approx \beta F_{eq}^o(z_m)$ 

Short, stiff handles give good agreement between  $\beta F_{eq}(z_{sys})$  and  $\beta F_{eq}(z_m)$ 

Longer handles give worse agreement

### Importance of transverse Fluctuations



Mínímíze transverse fluctuations;

 $L/l_p < 10$ 

Exps it is Roughly 6 -12

# Toy Model

It is useful to understand the physics of the RNA + handles system by studying a simpler problem, which minimally represents the system.



A Generalized Rouse Model, which captures the essential physics of the problem.



## A Generalized Rouse Model

#### Fix one endpoint

Pull the other with the unfolding force



Model two-state nature with a harmonic bond that has a cutoff

# Modeling 'stiffness' with a Gaussian chain

Under tension, a Wormlike (stiff) chain has longitudinal fluctuations  $\langle \delta R_{||}^2 \rangle \sim \frac{L}{\sqrt{l_p}} \left( \frac{k_B T}{f} \right)^{\frac{3}{2}}$ 

A Gaussian chain

 $\langle \delta R_{||}^2 \rangle \sim L b$ 

Smaller spacing mimics stiffer handles  $l_p^{eff} \sim b^{-2}$ 

## A Generalized Rouse Model

#### Toy model Hamiltonian is

$$egin{array}{rcl} eta H &=& rac{3}{2b^2} \int_0^{N_h} ds \; \dot{\mathbf{r}}^2(s) + rac{3}{2a^2} \int_{N_h}^{N-N_h} ds \; \dot{\mathbf{r}}^2(s) + rac{3}{2b^2} \int_{N-N_h}^N ds \; \dot{\mathbf{r}}^2(s) \ &-eta \mathbf{f} \cdot \int_0^N ds \; \mathbf{r}(s) + eta V[\mathbf{r}(N-N_h) - \mathbf{r}(N_h)] \end{array}$$



with

 $V[\mathbf{x}] = \begin{cases} k\mathbf{x}^2/2 & |\mathbf{x}| \le c \\ kc^2/2 & |\mathbf{x}| > c \end{cases}$ 

# Free Energy Profiles

#### The equilibrium distribution functions are

$$\begin{split} P(z_m) &= \frac{z_m}{\mathcal{N}} e^{-3z_m^2/2N_0 a^2 - \beta V[z_m]} \sinh(f z_m) \\ P(z_{sys}) &= \sqrt{\frac{3}{\pi b^2 N_h}} \frac{\sinh(z_{sys})}{\mathcal{N}} \int_0^\infty dy \; y \sinh\left(\frac{3y z_{sys}}{N_h b^2}\right) e^{-3y^2/2N_0 a^2 - 3(y - z_{sys})^2/4N_h b^2 - \beta V[y]} \\ \mathcal{N} &= \int_0^\infty dy \; y e^{-3y^2/2N_0 a^2 - \beta V[y]} \sinh(f y) \end{split}$$

 $N_0 = 20$  a = 0.5 nm f = 15.4 pN k = 0.54 pN/nmc = 4 nm These choices qualitatively reproduce the handle-free Free Energy Profile of the SOP RNA model

# Free Energy Profiles

#### b = a/3



The free energy profile for the GRM gives consistent results compared to the SOP simulation.

• Increasing the handle length causes disagreements between  $F_{eq}(r_m)$  and  $F_{eq}(r_{sys})$ 

# Kinetic Properties of Interest

•  $au_{U(F)}^{m}$ •  $au_{U(F)}^{sys}$ 

 $\tau^0_{U(F)}$ 

The unfolding (folding) rate, measured using  $z_m$ The unfolding (folding) rate, measured using  $z_{sys}$ 

The intrinsic unfolding (folding) rate, with no handles atatched



$$\tau_{U(F)} = \frac{1}{N} \sum_{i} \tau_{U(F)}^{(i)}$$

# Folding and Unfolding Kinetics



Handles of any type will increase folding and unfolding times
Stiffer handles change the times more than flexible handles
Observed times are almost identical between z<sub>m</sub> and z<sub>sys</sub>

# Some Experimental Results

Manosas et. al. studied the effect of multiple experimental parameters on the hopping kinetics of the 56nt P5ab RNA hairpin, using both simulations and experiments.



They find flexible handles change the kinetics of the hairpin less than stiff handles.

Manosas, Biophys J 92 3010 (2007)

# Hopping kinetics Toy Model

The simple two-state Gaussian chain can capture the essential physics of the kinetic effects of the handles.



# **Modeling the Folding Kinetics**

If we start in an unfolded state, our single harmonic interaction is cut off, so it does not contribute to the folding kinetics.

The folding of the RNA is purely entropic (no interaction energy).

$$H = rac{3}{2a^2} \mathbf{R} \mathbf{M} \mathbf{R}^T - \beta \mathbf{f} \mathbf{R}^T$$
  
with  $\mathbf{R} = (\mathbf{r}_1, \dots, \mathbf{r}_{N+1})^T$  and  $\mathbf{F} = (-\mathbf{f}, 0, \dots, 0, \mathbf{f})^T$ .

M is a Rouse-like matrix, that includes the handles with spacing b  $M(b=a) = \begin{pmatrix} 1 & -2 & 0 & 0 & 0 \\ -2 & 2 & -2 & 0 & 0 \\ 0 & \ddots & \ddots & \ddots & 0 \\ 0 & 0 & -2 & 2 & -2 \\ 0 & 0 & 0 & -2 & 1 \end{pmatrix}.$ 

# **Modeling the Folding Kinetics**

If we start in an unfolded state, our single harmonic interaction is cut off, so it does not contribute to the folding kinetics.

The folding of the RNA is purely entropic (no interaction energy).

The discrete representation of the Hamiltonian is

$$\beta H = \frac{3}{2b^2} \sum_{i=1}^{N_h} (\mathbf{r}_{i+1} - \mathbf{r}_i)^2 + \frac{3}{2a^2} \sum_{i=N_h+1}^{N-N_h} (\mathbf{r}_{i+1} - \mathbf{r}_i)^2 + \frac{3}{2b^2} \sum_{i=N-N_h+1}^{N} (\mathbf{r}_{i+1} - \mathbf{r}_i)^2 -\beta \mathbf{f} \cdot (\mathbf{r}_N - \mathbf{r}_1) + \beta k_0 \mathbf{r}_1^2$$

# An Exact Solution to the Langevin Equation

From the Hamiltonian, we can find the overdamped Langevin equation for each coordinate:

$$\zeta \dot{\mathbf{X}}(t) = -\frac{3\beta}{a^2} \mathbf{M} \mathbf{X} + \beta \mathbf{f}^T \mathbf{X} + \mathbf{N}(t)$$

This has the exact solution  $\mathbf{X}(t) = \mathbf{A}(t)\mathbf{X}(0) + \frac{a^2}{3}\mathbf{M}^{-1}\left(\mathbf{I} - \mathbf{A}(t)\right) + \int_0^t dt' \mathbf{A}(t - t')\mathbf{N}(t')$   $\mathbf{A}(t) = \exp(-3Dt\mathbf{M}/a^2), \text{ and } \mathbf{N}(t) \text{ a white noise force}$ 

# An Exact Solution to the Langevin Equation

The propagator for any internal or end-to-end distance can be found by averaging over noise and coordinates

$$G(\mathbf{R}_{nm},t|\mathbf{R}_{nm}^{0}) = \left(\frac{3}{2\pi\langle\mathbf{R}_{nm}^{2}\rangle\sqrt{1-\varphi^{2}(t)}}\right)^{3} \exp\left(\frac{3}{2\langle\mathbf{R}_{nm}^{2}\rangle(1-\varphi^{2}(t))}\right)$$
$$\times \left[\bar{\mathbf{R}}_{nm}^{2} + (\bar{\mathbf{R}}_{nm}^{0})^{2} - 2\varphi(t)\bar{\mathbf{R}}_{nm} \cdot \bar{\mathbf{R}}_{nm}^{0}\right]\right)$$

#### with

$$\langle \mathbf{R}_{nm}^2 \rangle = (\mathbf{M}^{-1})_{nn} + (\mathbf{M}^{-1})_{mm} - 2(\mathbf{M}^{-1})_{nm}$$

 $\langle \mathbf{R}_{nm}^2 \rangle \times \varphi(t) = (\mathbf{M}^{-1}\mathbf{A}(t))_{nn} + (\mathbf{M}^{-1}\mathbf{A}(t))_{mm} - 2(\mathbf{M}^{-1}\mathbf{A}(t))_{nm}$  $\bar{\mathbf{R}} = \mathbf{R} - \langle \mathbf{R}_{nm} \rangle = \mathbf{R} - \beta f \langle \mathbf{R}_{nm}^2 \rangle / 3$ 

# Modeling the Folding Kinetics

The theory of Wilemski and Fixman relates the loop closure time (folding time) to the propagator as

$$\tau_F \approx \int_0^\infty dt \left(\frac{C(t)}{C(\infty)} - 1\right)$$

 $C(t) = \int d^3 \mathbf{R} d^3 \mathbf{R}_0 S(\mathbf{R}) G(\mathbf{R}, t | \mathbf{R}_0) S(\mathbf{R}_0) P_{eq}(\mathbf{R}_0) \qquad S(\mathbf{R}) = \delta(|\mathbf{R}| - c)$ 

For high tension, the system is almost one-dimensional.  $C(t) \approx G_z(c, t|c) P_z^{eq}(c)$ 

# Modeling the Folding Kinetics

The GRM gives surprisingly good agreement with the SOP simulations for the folding rates



All handles decrease the folding rate

Stiffer handles have a much larger effect on the folding rate

The GRM can reproduce the folding rate accurately

# Determining the Intrinsic Rates

If attaching handles always changes the hopping times, how can one determine the intrinsic rates?



Attaching handles to the RNA slightly perturbs the free energy as measured by  $z_m$ 

$$F_{eq}(z_m) \approx F_{eq}^o(z_m)$$

Both stiff and flexible handles cause similar perturbations.

### How good is $z_m$ as a reaction coordinate?

Accurately measuring the free energy allows the determination of the rates (first passage)



$$egin{aligned} & au_U^{KR}(z) \ = \ \int_z^{z_U} dy e^{eta F_{eq}(y)} rac{1}{D_U} \int_{z_{min}}^y dx e^{-eta F_{eq}(x)} \ & au_F^{KR}(z) \ = \ \int_{z_F}^z dy e^{eta F_{eq}(y)} rac{1}{D_F} \int_y^{z_{max}} dx e^{-eta F_{eq}(x)} \ & au_F^{KR}(z) \$$

The hopping rates for varying force can be determined by tilting the free energy profile at the transition force

 $F_{eq}(z_m|f) = F_{eq}(z_m|f_m) - (f - f_m) \times z_m$ 

## Kramer's Theory



The SOP simulations of the P5GA verify that  $F_{eq}(z_m|f) = F_{eq}(z_m|f_m) - (f - f_m) \times z_m$ 

Kramer's theory gives good estimates for the hopping times

## Kramer's Theory



To study a wider range of forces, we can simulate the handle-free GRM directly



Kramer's theory gives excellent agreement over a wide range of forces

### Add adenine riboswitch aptamer

**P2** 



(A. Serganov et al., Chem. Biol. 11, 1729, 2004)



 $\rightarrow P3 \rightarrow P2/P3$ 

