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# Chapter 9

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# Analysis of Protein Conformational Transitions Using Elastic Network Model

# Wenjun Zheng and Mustafa Tekpinar

# Abstract

In this chapter, we demonstrate the usage of a coarse-grained elastic network model to analyze protein 6 conformational transitions in the NS3 helicase (NS3hel) of Hepatitis C virus (HCV). This analysis allows us 7 to identify and visualize collective domain motions involved in the conformational transitions and predict 8 the order of structural events during the transitions. It is highly efficient and applicable to many multi-9 domain protein structures which undergo large conformational changes to fulfill their functions. 10 This method is made available through a Web server (http://enm.lobos.nih.gov). 11

Key wordsConformational transition, Coarse-grained model, Elastic network model, Normal12mode analysis, Reaction coordinate, Transition pathway, Helicase13

# 1 Introduction

Protein conformational dynamics, which is involved in many 15 protein functions, spans a wide range of temporal scales (from 16 femto-seconds to seconds) and spatial scales (from atomic fluctua- 17 tions to domain motions). The functions of a large number of 18 protein complexes are thought to invoke conformational transi- 19 tions between a series of biochemical states, some of which were 20 captured by X-ray crystal structures and electron microscopy. 21 However, it remains very challenging to experimentally probe or 22 computationally model the transient intermediates of these transi- 23 tions, which determine the kinetic mechanism of these protein 24 complexes. To obtain details of protein dynamics, all-atom molec- 25 ular dynamics (MD) [1] has been widely employed to simulate 26 protein conformational fluctuations and transitions. Nevertheless, 27 such simulations are limited to nanoseconds to microseconds, 28 which fall short of the typical time scale of protein kinetics (milli- 29 seconds to seconds). To overcome the time-scale barrier for MD 30 simulations, a variety of coarse-grained models [2] have been devel- 31 oped. Of particular interest is the elastic network model (ENM) 32 Wenjun Zheng and Mustafa Tekpinar

[3–5], which represents a protein structure as a network of  $C_{\alpha}$ 33 atoms with neighboring ones connected by springs with a uniform 34 force constant [6]. The normal mode analysis (NMA) of ENM 35 often yields a handful of low-frequency modes that capture the 36 large-scale conformational changes observed between two protein 37 crystal structures [7, 8]. ENM has formed the basis of several 38 computational methods for modeling conformational transitions 39 between two given protein conformations [9–13]. 40

In this chapter, we will demonstrate ENM-based NMA and a 41 transition pathway modeling method named interpolated-ENM 42 (iENM) [13]. The iENM constructs a pathway by solving the 43 saddle points of a double-well potential built from two ENM 44 potentials based at the beginning and end conformation of a tran-45 sition [13]. The predicted pathway allows us to deduce the dynamic 46 order of structural events involving various protein parts [13–17]. 47 We will use NS3hel of HCV as an example [18, 19] (see Note 1). 48

# 2 Methods

2.1 Normal Mode Analysis of Elastic Network Model Given the  $C_{\alpha}$  atomic coordinates of a protein crystal structure from 50 Protein Data Bank (http://www.rcsb.org), we build an elastic network model by connecting all pairs of  $C_{\alpha}$  atoms that are within a 52 cutoff distance  $R_c$  (chosen to be 10 Å by default) by using harmonic spring. The total ENM energy is 54

$$E_{\rm ENM} = \frac{1}{2} \sum_{d_{ij}^0 < R_{\rm c}} C (d_{ij} - d_{ij}^0)^2, \qquad (1)$$

where *C* is the spring force constant which is set to 1 by default, although it can be determined by fitting the crystallographic B factors if needed [20],  $d_{ij}$  is the distance between the  $C_{\alpha}$  atoms *i* and *j*, and  $d_{ij}^0$  is the value of  $d_{ij}$  as given by the crystal structure. We expand the ENM energy to second order: 59

$$E_{\text{ENM}} \approx \frac{1}{2} \delta X^T H \delta X = \frac{1}{2} C \sum_{d_{ij}^0 < R_c} \delta X^T H_{ij} \delta X, \qquad (2)$$

where  $\delta X = X - X_0$ , X is a 3N-dimensional vector representing 60 the C<sub>\alpha</sub> atomic coordinates, X<sub>0</sub> gives the equilibrium C<sub>\alpha</sub> coordinates 61 in the crystal structure,  $H = C \sum_{\substack{d_{ij}^0 < R_c}} H_{ij}$  is the 3N × 3N 62

Hessian matrix (second derivatives of  $E_{\text{ENM}}$ ), where  $H_{ij} = 63$  $\frac{1}{2} \nabla^2 \left[ \left( d_{ij} - d_{ij}^0 \right)^2 \right].$ 

For the Hessian matrix H, we can perform the normal mode 65 analysis (NMA) to obtain 3N normal modes. Each mode m has an 66 eigenvalue  $\lambda_m$  and a 3N-dimensional eigenvector  $V_m$  which satisfy 67

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 $HV_m = \lambda_m V_m$ . The normal modes can be solved using the 68 dsyevr subroutine of a linear algebra package named LAPACK 69 (http://www.netlib.org/lapack/). The lowest six zero modes, 70 corresponding to three translations and three rotations, are 71 removed from the spectrum (mode numbering starts from #1 for 72 the lowest non-zero mode). 73

To validate NMA, we need to use two different crystal structures of a protein. We first perform NMA using the first structure 75 (see above). Then, we superimpose the second structure on top of 76 the first structure using the PROFIT program (*see* http://www. 77 bioinf.org.uk/software/profit/). Finally, we compare each mode 78 (mode *m*) with the observed structural changes between the two 79 superimposed structures (represented by a 3*N*-dimensional vector 80  $\delta X_{obs}$ ) by calculating the following overlap: 81

$$I_m = \frac{\left| \delta X_{\text{obs}}^T V_m \right|}{\left| \delta X_{\text{obs}} \right| \cdot \left| V_m \right|},\tag{3}$$

where  $\delta X_{obs}^T V_m$  is the dot product between vectors  $\delta X_{obs}$  and  $V_m$ , 82  $|\delta X_{obs}|$  and  $|V_m|$  represent their magnitude.  $I_m$  ranges from 0 to 1, 83 and higher  $I_m$  indicates greater involvement of mode m in the 84 observed structural changes  $\delta X_{obs}$ . In addition, the following 85 cumulative overlap is calculated to assess how well the lowest ten 86 modes describe  $\delta X_{obs}$ : 87

$$C_{10} = \sqrt{\sum_{1 \le m \le 10} I_m^2}.$$
 (4)

Because  $\sum_{1 \le m \le 3N-6} I_m^2 = 1$ ,  $C_{10}^2$  gives the percentage of the

observed structural changes captured by the lowest ten modes. For an example of the normal mode analysis, *see* **Note 2**.

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To study how NS3hel translocates along a single-stranded DNA 92 (ssDNA), we need to refine the modeling of protein–DNA inter- 93 actions and intra-ssDNA interactions. To this end, we modify the 94 ENM as follows: 95

- 1. For residue–residue interactions within NS3hel, we use the  $C_{\alpha}$  96 based ENM with  $R_c = 10$  Å (*see* Eq. 1). 97
- 2. For interactions within ssDNA, we use a modified ENM which 98 represents each nucleic acid by a bead located at the C4' atom, 99 and adds springs between first, second, and third nearest-100 neighbor (NN) beads with the same force constant  $k_{\text{DNA}}$ : 101

$$E_{\text{DNA}} = \frac{1}{2} \sum_{1 \le |j-i| \le 3} k_{\text{DNA}} (d_{ij} - d_{ij,0})^2,$$
(5)

where  $d_{ij}$  is the distance between the C4' atom *i* and *j*,  $d_{ij}^0$  is the 102 value of  $d_{ij}$  as given by an NS3hel-ssDNA structure.

2.2 Coarse-Grained Modeling of Protein-DNA System

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3. To accurately represent protein–DNA interactions, we use a structure-based Leonard-Jones 6–12 potential to allow proteinDNA contacts to form/break readily during a transition: 106

$$E_{\text{prot-DNA}} = \frac{1}{2} \sum_{\substack{li \in \text{prot} \\ j \in \text{DNA}}} k_{\text{prot-DNA}} \frac{d_{i,\min}^2}{36} \left(1 - \frac{d_{i,\min}^6}{d_{ij}^6}\right)^2, \quad (6)$$

where the summation is over residues which form heavy-atom 107 contacts (within 4 A) with DNA backbone in a NS3hel-ssDNA 108 structure, and  $d_{i,\min}$  is the minimal C<sub> $\alpha$ </sub>-C4' distance for residue *i*, 109 and  $k_{\text{prot-DNA}}$  is the force constant. We only consider contacts 110 between protein and DNA backbone in our modeling because 111 functional and structural data suggested that these contacts are 112 sufficient for ensuring that NS3hel maintains a grip on the 113 ssDNA track and undergoes continuous translocation [21]. 114 For NMA, we replace Eq. 9.6 with its harmonic counterpart 115  $E'_{\text{prot-DNA}} = \frac{1}{2} \sum_{li \in \text{prot}} k_{\text{prot-DNA}} (d_{ij} - d_{ij,0})^2.$ 

j

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For NS3hel, we choose  $k_{\text{DNA}} = 1$  and  $k_{\text{prot-DNA}} = 1.3$  based on 117 the fitting of crystallographic B factors. One should check a range of parameter values to make sure that the modeling results are not 119 sensitive to the particular choice of these parameters. 120

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We consider an *arbitrary* double-well potential function  $F(E_1, E_2)$  122 with two minima at the beginning and end conformation of 123 a transition. It satisfies:  $F(E_1, E_2) \approx E_1$  if  $E_1 \ll E_2$ , and  $F(E_1, E_2) \approx$  124  $E_2$  if  $E_2 \ll E_1$ , where  $E_1$  and  $E_2$  are two single-well potentials. The 125 saddle points (SP) of  $F(E_1, E_2)$  are solved as follows 126

$$0 = \nabla F(E_1, E_2) = \frac{\partial F}{\partial E_1} \nabla E_1 + \frac{\partial F}{\partial E_2} \nabla E_2, \tag{7}$$

which is equivalent to solving the following equation (after setting  $\lambda = \frac{\partial F}{\partial E_1} / \left( \frac{\partial F}{\partial E_1} + \frac{\partial F}{\partial E_2} \right)$ )

$$0 = \lambda \nabla E_1 + (1 - \lambda) \nabla E_2, \qquad (8)$$

where  $\lambda$  is a parameter of interpolation that varies from 1 to 129 0 (assuming  $\frac{\partial F}{\partial E_1} \ge 0$  and  $\frac{\partial F}{\partial E_2} \ge 0$ ). Therefore, the problem of solving SP for the double-well potential function  $F(E_1, E_2)$  is converted 131 to the problem of finding the minima of a linearly interpolated 132 potential function  $\lambda E_1 + (1 - \lambda)E_2$ . Equation 9.8 gives a set of 133 minimal-energy crossing points between  $E_1$  and  $E_2$  where 134  $E_1 = E_2$  is at minimum. 135

Based on the above general formulation, we have proposed an 136 iENM protocol [13] using a double-well potential  $F(E_{\text{ENM1}} + 137)$ 

2.3 Interpolated Elastic Network Model (iENM)

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 $E_{\rm col}, E_{\rm ENM2} + E_{\rm col}$ , where  $E_{\rm ENM1}$  and  $E_{\rm ENM2}$  are two ENM 138 potential functions (*see* Eq. 1) based at the beginning and end 139 conformation of a transition, and  $E_{\rm col}$  is a steric collision energy 140 defined as follows: 141

$$E_{\rm col} = \frac{1}{2} \sum_{i=3}^{N} \sum_{j=1}^{i-2} C_{\rm col} \theta (R_{\rm col} - d_{ij}) (d_{ij} - R_{\rm col})^2,$$
(9)

where  $R_{\rm col} = 4$  Å,  $C_{\rm col} = 10$ , and chemically bonded residue pairs 142  $(j = i \pm 1)$  are excluded. The addition of  $E_{\rm col}$  penalizes steric 143 collisions between residues whose  $C_{\alpha}$  atoms are within a distance 144 of  $R_{\rm col}$ .

After adding the collision energy, the SPs are solved by setting 146  $\nabla F(E_{\text{ENM1}} + E_{\text{col}}, E_{\text{ENM2}} + E_{\text{col}}) = 0$  which is equivalent to solving 147 the following SP equation (the SP is represented by  $X_{\text{SP}}$ ): 148

$$\lambda \nabla E_{\text{ENM1}}(X_{\text{SP}}) + (1 - \lambda) \nabla E_{\text{ENM2}}(X_{\text{SP}}) + \nabla E_{\text{col}}(X_{\text{SP}}) = 0.$$
(10)

As  $\lambda$  varies from 1 to 0,  $X_{SP}$  traces a pathway that connects the 149 beginning and end conformation of a transition. Because this path- 150 way passes all possible SPs, it gives a *universal* minimal-energy path 151 regardless of the detailed form of  $F(E_1, E_2)$ . iENM outputs the 152 above pathway as the predicted pathway for the given transition. 153

We solve Eq. 10 by using the following iterative procedure 154 to find the minima of the linearly interpolated potential function 155  $\lambda E_{\text{ENM1}} + (1 - \lambda) E_{\text{ENM2}} + E_{\text{col}}$  with the Newton-Raphson method: 156

- 1. Initialization: set n = 0,  $X_{SP,0} = X_1$ , which is the C<sub> $\alpha$ </sub> coordi- 157 nates of the beginning conformation. 158
- 2. Given  $X_{\text{SP},n}$ , calculate  $\lambda = \lambda_n = -\frac{[\nabla E_{\text{ENM1}} \nabla E_{\text{ENM2}}] \cdot [\nabla E_{\text{ENM2}} + \nabla E_{\text{col}}]}{|\nabla E_{\text{ENM1}} \nabla E_{\text{ENM2}}|^2}$  159 to minimize  $|\lambda \nabla E_{\text{ENM1}} + (1 - \lambda) \nabla E_{\text{ENM2}} + \nabla E_{\text{col}}|.$  160
- 3. Calculate  $R_n = \lambda_n \nabla E_{\text{ENM1}} + (1 \lambda_n) \nabla E_{\text{ENM2}} + \nabla E_{\text{col}}.$  161
- 4. If  $|R_n| < 0.00001$ , go to step 7. 162
- 5. Displace  $X_{SP,n}$  by

$$\delta X_{\rm SP} = -[\lambda_n H_1 + (1 - \lambda_n)H_2 + H_{\rm col} + \varepsilon I]^{-1}R_n, \qquad (11)$$

where  $H_1$ ,  $H_2$  and  $H_{col}$  are the Hessian matrices calculated for 164  $E_{ENM1}$ ,  $E_{ENM2}$  and  $E_{col}$ , I is identity matrix,  $\varepsilon$  is a small positive 165 number to render the sum of matrices invertible. 166

6. Go to step 3.

7. Calculate  $X_{SP,n+1} = X_{SP,n} + \delta X_{SP}$  and

$$\delta X_{\rm SP} \sim -\delta \lambda [\lambda_n H_1 + (1 - \lambda_n) H_2 + H_{\rm col} + \varepsilon I]^{-1} [\nabla E_{\rm ENM1} - \nabla E_{\rm ENM2}],$$
(12)

where  $H_1$ ,  $H_2$  and  $H_{col}$  are the Hessian matrices calculated for 169  $E_{ENM1}$ ,  $E_{ENM2}$  and  $E_{col}$ , I is identity matrix,  $\varepsilon$  is a small positive 17

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number to render the sum of matrices invertible, and  $\delta\lambda$  is 171 chosen so that the magnitude of  $\delta X_{SP}$  is small (i.e., 172  $|\delta X_{\rm SP}|/\sqrt{N} < 0.1$  Å). 173

8. Stop if  $X_{SP,n+1}$  has reached  $X_2$  which is the  $C_{\alpha}$  coordinates 174 of the end conformation, otherwise set  $n \leftarrow n + 1$ , then go 175 to step 2. 176

The linear equations in Eqs. 11 and 12 are solved using a highly 177 efficient sparse linear equation solver CHOLMOD (http://www. 178 cise.ufl.edu/research/sparse/cholmod/) [22]. In Eq. 12 we com-179 pute an incremental structural displacement  $\delta X_{SP}$  based on the 180 force-induced linear responses— $\delta X_{SP}$  is calculated as a weighted 181 of all normal modes of the Hessian sum matrix 182  $\lambda_n H_1 + (1 - \lambda_n) H_2 + H_{col}$ . Because the weight of each mode is 183 inversely proportional to its eigenvalue, the collective motions 184 described by the lowest modes are favorably sampled along the 185 transition pathway. 186

For an example of iENM application, see Note 3.

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2.4 Assessment of

The predicted transition pathway allows us to determine the 189 motional order of different parts/domains of a protein. For this 190 purpose, the following reaction coordinate (RC) is defined for an 191 intermediate conformation of a given part *S*[13]: 192

$$RC_{S} = \left(\delta X_{S} \bullet \delta X_{S,\text{obs}}\right) / \left|\delta X_{S,\text{obs}}\right|^{2}, \tag{13}$$

where  $\delta X_S$  is the displacement vector of part S from the beginning 193 conformation of a transition to a given intermediate conformation, 194 and  $\delta X_{S,obs}$  is the observed displacement of part S from the begin- 195 ning conformation to the end conformation of a transition.  $RC_S$  196 measures the motional progress of part S in the direction of a 197 transition.  $RC_S = 0$  at the beginning of a transition, and  $RC_S = 1$ 198 at the end of a transition. For two different parts (named  $S_1$  and  $S_2$ ) 199 in an intermediate conformation, if  $RC_{S_1} > RC_{S_2}$ , then S<sub>1</sub>'s motion 200 precedes  $S_2$ 's motion. 201

For an example of RC calculations, *see* **Note 3**.

#### 3 Conclusion

We have demonstrated the use of a coarse-grained ENM for analyz- 205 ing conformational transitions in protein or protein-DNA complex. 206 The predicted order of structural events has been validated using 207 structural data. This method is highly efficient—it takes only 3 min 208 to run the entire ATP cycle of NS3hel using a dual-core worksta-209 tion. This method will be useful for future simulations of a variety 210 of molecular motors including many monomeric and ring-shaped 211 helicases. Both ENM-based NMA and iENM are available via a 212 Web server at http://enm.lobos.nih.gov. 213

Motional Order Using **Reaction Coordinates** 

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# Notes

## 1. Introduction to NS3hel

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We will illustrate the usage of ENM-based NMA and iENM 216 using NS3hel as an example. To unwind double-stranded 217 DNA/RNA, NS3hel assembles on a 3' end of ssDNA/RNA 218 tail, and actively translocates along ssDNA/RNA in the 3'-5' 219 direction [23]. Several crystal structures of NS3hel bound with 220 ssDNA and various ATP analogs have been solved [24–29], 221 which correspond to three biochemical states of its work cycle 222 (apo, ATP, and ADP-Pi, where Pi represents inorganic phos-223 phate). The structure of NS3hel consists of three domains 224 (*see* Fig. 1). The ATP binds at the cleft between domains 1 225 and 2, while the ssDNA binds in a groove between domains 1, 226 2 and domain 3 (*see* Fig. 1). From the structural data, an 227 inchworm model has emerged for the translocation of 228 NS3hel along ssDNA (complemented by a ratchet action) 229 [24, 28–31] (*see* Fig. 1): first, ATP binding induces a closure 230



**Fig. 1** The structures of NS3hel in three biochemical states (apo, ATP, and ADP-Pi, colored in *blue, red*, and *green*, respectively). NS3hel is shown in *cartoon* representation, and ssDNA is shown as a *chain of beads* located at C4' atoms. The three domains of NS3hel and ssDNA are labeled. The opening/closing motions of domain 2 and the 5'-3' sliding of ssDNA are marked by *arrows*. The three structures are aligned along domain 3 which is shown as *transparent*. *Inset*: a schematic cartoon illustrates the inchworm model (domain 1, domain 2, ATP, and ssDNA are colored *green*, *red*, *blue*, and *gray*, respectively; the opening/closing motions of domain 2 and the sliding of ssDNA are marked by *arrows*; domain 3 is not shown)

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### t.1 Table 1

Comparison between the lowest ten normal modes and the crystallographically observed conformational changes in HCV NS3hel

t.2	PDB_chain id of two NS3hel structures	RMSD (Å)	Mode#	Overlap
t.3 t.4 t.5	$3$ kqk_AD $\rightarrow$ 3kqu_B	3.26	#3 #4 #1–10	0.49 0.57 0.92
t.6 t.7	$3$ kqu_BM $\rightarrow$ $3$ kql_A	1.03	#1 #1–10	0.61 0.72
t.8 t.9 t.10	$3kql_AE \rightarrow 3kqk_A$	3.37	#5 #6 #1–10	0.45 0.50 0.82

motion of domain 2 toward domain 1, with domain 1 releasing 231 its grip on ssDNA and sliding along it, while domain 2 main-232 tains its grip on ssDNA; second, following ATP hydrolysis and 233 the release of ADP and Pi, domain 2 opens again as it releases 234 its grip on ssDNA and slides along it, while domain 1 maintains 235 its grip on ssDNA. The net effect is the translocation of NS3hel 236 along ssDNA by one base in the 3'-5' direction, consuming 237 one ATP per step. The details of the conformational transitions 238 between apo, ATP, and ADP-Pi state remain largely unknown. 239

2. Normal mode analysis of ENM

To validate the use of ENM for NS3hel, we compare the domain motions predicted by NMA of ENM with the observed conformational changes between NS3hel structures in different states (for results, *see* Table 1). Here we will focus on the conformational transition from apo to ATP state. 243

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We have performed NMA for an ENM constructed from an 246 NS3hel-ssDNA structure in apo state (PDB id: 3kqk), and then 247 calculated the overlaps between each mode and the observed 248 conformational changes from 3kqk to an NS3hel-ssDNA-249 ADP  $\cdot$  BeF<sub>3</sub> structure in ATP state [28] (PDB id: 3kqu). Encouragingly, 84 % of the observed conformational changes 251 are captured by the lowest ten modes (with cumulative overlap 252  $C_{10} = 0.92$ ), among which mode #3 and #4 contribute most 253 (with overlap  $I_3 = 0.49$  and  $I_4 = 0.57$ , respectively). To visua-254 lize the domain motions predicted by these two modes, we 255 have deformed the 3kqk structure along the directions given by 256 the eigenvectors of these two modes, and then compared the 257 deformed structures with 3kqk using the VMD program 258 (http://www.ks.uiuc.edu/Research/vmd/). 259

Mode #3 describes coupled rotations of domains 1 and 260 2 relative to domain 3, which result in the opening of domains 261 1–3 interface, the closing of domains 1–2 interface, and the 262 sliding of ssDNA toward its 3' end (*see* Fig. 2a). 263

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**Fig. 2** Conformational changes in NS3hel as predicted by the following ENM-based normal modes: (a) mode #3, (b) mode #4, which are solved from the apo-state NS3hel-ssDNA structure (PDB id: 3kqk). The original NS3hel-ssDNA structure is colored *cyan*. For the deformed NS3hel-ssDNA structure after the conformational changes, domain 1, 2, and 3 are colored *green*, *red*, and *blue*, respectively, and ssDNA is shown as a *chain of yellow beads* located at C4' atoms. The two structures of NS3hel are superimposed along domain 3. The domain rotations are shown by *arrows* 

Mode #4 describes simultaneous rotations of domains 1 and 264 2 toward domain 3, which cause the closing of domains 1-2 265 interface and a shift of ssDNA toward domain 3 (see Fig. 2b). 266 Although the lowest ten modes accurately capture the observed 267 conformational changes in NS3hel, they do not correctly pre- 268 dict the translocation of NS3hel along ssDNA which requires 269 domain 1 to slide along ssDNA while domain 2 holds ssDNA. 270 Instead, in both modes #3 and #4, domains 1 and 2 maintain 271 their grip on ssDNA with no sliding between domain 1 and 272 ssDNA (see Fig. 2). This is not surprising because domain 1 and 273 ssDNA are linked by elastic springs in ENM which disfavor 274 sliding between them. Therefore, to accurately describe the 275 conformational dynamics underlying NS3hel translocation, 276 one has to modify ENM and account for the anharmonicity 277 of protein–DNA interactions (see Subheading 2). 278

3. Transition pathway modeling by iENM

Next, we use iENM to simulate the conformational transitions 280 in NS3hel between three biochemical states (apo, ATP, and 281 ADP-Pi), which are captured by three crystal structures of 282 NS3hel [28] (PDB ids: 3kqk, 3kqu, 3kql) (*see* Fig. 1). We 283 validate the use of iENM for NS3hel by checking if it correctly 284 predicts the order of inter-domain motions observed among 285 crystal structures of NS3hel in different states. To this end, 286

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**Fig. 3** Comparison between calculated transition pathways and crystal structures of NS3hel using two reaction coordinates ( $RC_{12}$  and  $RC_{13}$ ). The calculated pathways are obtained using the following methods: iENM (*solid lines*), mixed-ENM server (*dashed line*), Morph server (*dot dashed line*), MinActionPath server (*dotted line*). The crystal structures are shown as *points* (PDB&chain ids: 1a1vA, 1cu1A, 1cu1B, 1heiA, 1heiB, 3o8bA, 3o8bB, 3o8rA, 3o8rB, 3o8dA, 3o8dB, 3o8cA, 3o8cB, 3kquA, 3kquB, 3kquC, 3kquD, 3kquE, 3kquF, 3kqIA, 3kqIB, 3kqkA, 3kqkB, 3kqnA, 3kqhB, 4a92A, 4a92B). The following three pathways are calculated by iENM:  $3kqk \rightarrow 3kql$  (*thick solid line*),  $3kqk \rightarrow 3kql$  (*thin solid line*),  $3kqu \rightarrow 3kql$  (*thin solid line*)

we have generated pathways for three transitions (apo  $\rightarrow$  ATP, 287  $ATP \rightarrow ADP$ -Pi, apo  $\rightarrow ADP$ -Pi) using iENM, and then com-288 pared the predicted pathways with the crystal structures 289 [24-26, 28, 29] using two reaction coordinates (RC) (see 290 Fig. 3):  $RC_{12}$  quantifies the progress of motion between 291 domains 1 and 2, and  $RC_{13}$  quantifies the progress of motion 292 between domains 1 and 3. Both RCs vary from 0 to 1, where 293 0 corresponds to the apo state, and 1 corresponds to the ADP-294 Pi state. The iENM pathway for apo  $\rightarrow$  ADP-Pi transition 295 predicts that the increase of RC<sub>12</sub> precedes RC<sub>13</sub> during the 296 transition (see Fig. 3), which implies that the domains 1-2297 motion precedes the domains 1-3 motion. This order is func-298 tionally meaningful, because the domains 1-2 motion occurs 299 upon ATP binding while the domains 1-3 motion occurs 300 during the subsequent transition (ATP hydrolysis) (see 301 Fig. 1). This prediction agrees well with the RCs of most crystal 302 structures, which form two intermediate clusters located near 303 the predicted pathway (see Fig. 3)-the first cluster includes 304 several apo structures of full-length NS3, and the second clus-305 ter includes several crystal structures of NS3hel and full-length 306 NS3 bound with ADP-BeF<sub>3</sub> (corresponding to ATP state). 307

Two "outlier" structures (*see* Fig. 3) may correspond to offpath intermediates trapped by crystallization conditions. It is 309 remarkable that the iENM pathway for apo  $\rightarrow$  ADP-Pi transition visits the ATP-state structures as intermediates even 311 though these structures are not used in the modeling. For 312 comparison, we have also analyzed the pathways for apo  $\rightarrow$  313 ADP-Pi transition predicted by alternative methods including 314 Yale Morph server [32], mixed-ENM server [33] and MinAc-315 tionPath server [12], which do not seem to agree with the 316 crystal structures (*see* Fig. 3). 317

After validating iENM for exploring conformational transitions 318 in NS3hel, we have used it to simulate the translocation of NS3hel 319 along ssDNA as it undergoes the following three transitions: apo 320  $\rightarrow$  ATP  $\rightarrow$  ADP-Pi  $\rightarrow$  apo, which comprise the ATP cycle. 321

For the apo  $\rightarrow$  ATP transition, as predicted by the iENM 322 pathway, domain 2 closes toward domain 1 while it holds the 323 ssDNA (*see* Fig. 4a). Consequently, the ssDNA moves toward its 324 3' end by ~4.8 Å as it slides between domains 1 and 3 (*see* Fig. 4a). Therefore, our iENM pathway has reproduced key motions upon 326 ATP binding as postulated by the inchworm model—a closure 327 motion of domain 2 toward domain 1, with domain 1 releasing 328 its grip on ssDNA and sliding along it, while domain 2 maintains its 329 grip on ssDNA (*see* Fig. 1). 330

For the ATP  $\rightarrow$  ADP-Pi transition, as predicted by the iENM 331 pathway, domains 1 and 2 undergo a coupled rotation, resulting in 332 the movement of ssDNA toward its 5' end by ~0.8 Å relative to 333 domain 3 (*see* Fig. 4b). Both domains 1 and 2 maintain their grip on 334 ssDNA during this transition, so there is no sliding of ssDNA 335 relative to domains 1 and 2 (*see* Fig. 4b). 336

For the ADP-Pi  $\rightarrow$  apo transition, as predicted by the iENM 337 pathway, domain 2 opens early to release its grip on ssDNA, which 338 is followed by a small sliding (~1.7 Å) of ssDNA toward its 3' end 339 and a slight opening of domain 1 (*see* Fig. 4c). Our finding has 340 largely reproduced key motions during ADP-Pi release as postulated by the inchworm model—opening of domain 2 after it 342 releases its grip on ssDNA and slides along it, while domain 1 main-343 tains its grip on ssDNA (*see* Fig. 1). 344

In sum, our iENM calculations for the above three transitions  $^{345}$  predict a net translocation of NS3hel along ssDNA in the 3'-5'  $^{346}$  direction by ~5.7 Å, which corresponds approximately to 1-base  $^{347}$  step size.  $^{348}$ 

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**Fig. 4** Snapshots at the beginning and end of iENM pathways for the following transitions in NS3hel: (a). apo  $\rightarrow$  ATP transition; (b). ATP  $\rightarrow$  ADP-Pi transition; (c). ADP-Pi  $\rightarrow$  apo transition. In the end conformation of NS3hel, domain 1, 2, and 3 are colored *green, red,* and *blue,* respectively; the beginning conformation of NS3hel is shown as transparent; ssDNA is shown as a chain of beads located at C4' atoms (for ssDNA, the beginning conformation, end conformation, and target conformation are colored *cyan, yellow,* and *orange,* respectively); the movements of domain 2 and ssDNA are marked by *arrows* 

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