# Rotational dynamics of proteins from spin relaxation rates and molecular dynamics simulations

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#### I. INTRODUCTION

Spin relaxation rates measured with NMR techniques give segmental resolution information about rotational dynamics of proteins and macromolecules. Various models have been used to separate internal dynamics and order from overall rotational diffusion of molecules [?]. These techniques have been highly useful in characterization of rotational diffusion and internal flexibility of proteins and other biomolecules. On the other hand, segmental level information has been used in validation and improvement of molecular dynamics simulation force fields [?]. Segmental order has been also related to conformational entropy of proteins [?].

Spin relaxation rates are typically intepreted by using various dynamical models assuming different level of complexity of rotational relaxation processes. The most simplistic models assume single timescale and order parameter for internal motion and isotropic overall rotational diffusion. However, biomolecules often experience anisotropic overall diffusion and several internal timescales. Models for more complicated models have been also introduced, however, there are more fitting parameters in these models and intepretation of experiments becomes extensively difficult.

Classical molecular dynamics simuations contain, in principle, all the complexity of the timescales and could be used to interpret the rotational dynamics measured with spin relaxation experiments. However, this has not been a trivial task due to the force field issues and limited available time scales in the simulations.

In this work we present approach that can be used to analyze spin relaxation experiments by using classical molecular dynamics simulations. The approach can be used for anisotropic molecules and allows a correction of anisotropic overall diffusion. We demonstrate the usage of the approach for two aniotropic protein constructs from engineered from Helicobacteri pyroli and Pseudomonas.

#### II. METHODS

## A. Spin relaxation and rotational dynamics of molecules

Spin relaxation rates  $R_1$ ,  $R_2$  and  $R_{\rm NOE}$  measured from NMR experiments for N-H bondsare related to the molecular

dynamics through spectral density  $J(\omega)$  and equations [1, 2]

$$R_{1} = \frac{d_{\text{NH}}^{2} N_{\text{H}}}{20} \left[ J(\omega_{\text{H}} - \omega_{\text{N}}) + 3J(\omega_{\text{N}}) + 6J(\omega_{\text{N}} + \omega_{\text{H}}) \right] + \frac{(\sigma \omega_{\text{N}})^{2}}{15} j(\omega_{\text{N}}),$$

$$(1)$$

$$R_{2} = \frac{1}{2} \frac{d_{\text{NH}}^{2} N_{\text{H}}}{20} \left[ 4J(0) + 3j(\omega_{\text{N}}) + J(\omega_{\text{H}} - \omega_{\text{N}}) + 6J(\omega_{\text{H}}) + 6J(\omega_{\text{H}} + \omega_{\text{H}}) \right] + \frac{(\sigma \omega_{\text{N}})^{2}}{15 * 6} [4J(0) + 3J(\omega_{\text{N}})],$$
(2)

$$R_{\rm NOE} = 1 + \frac{d_{\rm NH}^2 N_{\rm H}}{20} \left[ 6J(\omega_{\rm N} + \omega_{\rm H}) + J(\omega_{\rm H} - \omega_{\rm N})) \right] \frac{\gamma_{\rm H}}{\gamma_{\rm N} R_1}, \tag{3}$$

where  $\omega_{\rm N}$  and  $\omega_{\rm H}$  are the Larmor angular frequencies of  $^{15}{\rm N}$  and  $^{1}{\rm H}$  respectively,  $N_{\rm H}$  is the number of bound protons. The dipolar coupling constant is given by

$$d_{\rm NH} = -\frac{\mu_0 \hbar \gamma_{\rm H} \gamma_{\rm N}}{4\pi \langle r_{\rm CN}^3 \rangle},$$

where  $\mu_0$  is the magnetic constant or vacuum permeability,  $\hbar$  is the reduced Planck constant,  $\gamma_{\rm N}$  and  $\gamma_{\rm H}$  are the gyromagnetic constants of  $^{15}{\rm N}$  and  $^{1}{\rm H}$ , respectively. Average cubic length is  $\langle r_{\rm CN}^3 \rangle \approx$  and the chemical shift anisotropy is  $\Delta\sigma \approx 160*10^{-6}$  for N-H bonds in proteins [?].

Spectral density  $J(\omega)$  is the Fourier transformation of the second order rotational correlation function for N-H bond

$$J(\omega) = 2 \int_0^\infty C(t) \cos(\omega t) dt. \tag{4}$$

The second order rotational correlation is defined as

$$C(t) = \langle (3\cos^2\theta_{t':t'+t} - 1)/2 \rangle_{t'},\tag{5}$$

where average is ensemble average and  $\theta$  is the angle between N-H bonds at times t' and t'+t. The rotational correlation function for protein tumbling in solution contains information about overall rotation of the molecule as well as internal relaxation processes. Assuming that these are independent, the rotational correlation function can be written as [?]

$$C(t) = C_I(t)C_O(t), (6)$$

where  $C_I(t)$  and  $C_O(t)$  are correlation functions for internal and overall rotations, respectively. Correlation function for fully anisotropic overall rotation can be written as a sum of

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five exponentials [?]

$$C_O(t) = \sum_{j=1}^5 A_j e^{-t/\tau_j},$$
 (7)

where time constants  $\tau_j$  are related [3] to the diffusion constants around three principal axes of a molecule  $D_{xx}$ ,  $D_{yy}$  and  $D_{zz}$ , defined as

$$\langle (\Delta \alpha_{t';t'+t})^2 \rangle_{t'} = 2D_{xx}t$$

$$\langle (\Delta \beta_{t';t'+t})^2 \rangle_{t'} = 2D_{yy}t$$

$$\langle (\Delta \gamma_{t';t'+t})^2 \rangle_{t'} = 2D_{zz}t,$$
(8)

where  $\langle (\Delta\alpha_{t';t'+t})^2 \rangle_{t'}$ ,  $\langle (\Delta\beta_{t';t'+t})^2 \rangle_{t'}$  and  $\langle (\Delta\gamma_{t';t'+t})^2 \rangle_{t'}$  are mean square angle deviations of protein intertia axes. The internal correlation function decays to a plateau, which defines the square of order parameter respect to molecular axes  $S^2$ . The effective internal correlation time can be defined with the help of reduced correlation function  $C_I'(t) = (C_I - S^2)/(1 - S^2)$  [?]

$$\tau_{\text{eff}} = \int_0^\infty C_I'(t) dt. \tag{9}$$

Standard analyses of experimental relaxation data usually assume fully or axially isotropic overall rotational motion and single decay constant for interal motion. Then the free parameters  $(S^2, \tau_j, A_j)$  are fit against spin relaxation data from experiments. This gives most likely very good results for isotropic molecules for which the assumption of single internal motional timescale is reasonable. However, for molecules with significant shape anisotropy or several timescales in internal motions the amoount parameters to be fitted becomes large compared with the typical amount of experimental points.

## B. Rotational dynamics from molecular dynamics simulations

Classical molecular dynamics simulations give trajectories of individual atoms as a function of time, which can be used to calculate rotational correlation functions for each bond and explicit separation of internal and overall rotational motions of molecules. The rotational correlation functions can be used to calculate spin relaxation times through Eqs. ??-??, which can be then compared to the experimental data in order to assess simulation model quality [? ] and interpret experiments [? ]. However, the comparison is often complicated by the short simulation times [?] and incorrect overall rotational diffusion due to water models [? ]. These issues have been typically overcame by introducing isotropic rotational diffusion term in the correlation functions [? ] or comparing order parameters instead of spin relaxation rates [? ]. These approaches are not, however, useful for anitropic proteins and order parameter comparison is not direct comparison between simulations and experiments in the case of freely rotating molecules.

Method presented here can be applied also to anisotropic

proteins simulated with timescales routinely accessible with state of the art computational infrastructure. The key idea of the method is to calculate the rotational diffusion constants and then use Eq. 7 to determine the correlation function related to the overall rotational diffusion.

Here we present method to analyse rotational dynamics, The analysis of rotational dynamics permormed in this work can be divided in essentially six steps listed here.

- 1) Total rotational correlation functions C(t) for protein N-H bonds are calculated from MD simulation trajectory by applying Eq. 5. 2) Rotational correlation functions for internal dynamics  $C_I(t)$  are calculated from a trajectory from where the overall rotation of protein is removed.
- 3) The overall and internal motions are assumed to be independent and overall rotational correlation function is calculated as  $C_O(t) = C(t)/C_I(t)$  according to Eq. 6.
- 4) The protein axes of inertia and their mean square deviations as function of time are calculated from MD simulation trajectory.
- 5) Rotational diffusion constants  $D_x$ ,  $D_y$  and  $D_z$  are calculated by fitting a straight line to mean square angle deviations of inertia axes according to Eq. 8.
- 6) Timescales in Eq. 7 are calculated from diffusion constants and weighting factors  $A_j$  are determined by fitting the equation to rotational correlation functions of overall rotational motion  $C_0(t)$  determined in step 3).
- 7) New total rotational correlation functions  $C_N(t)$  are determined by multiplying internal correlation function  $C_I(t)$  from step 2) by Eq. ?? with parameters from step 6). Rotational diffusion constants (and  $\tau_i$  values in Eq. 7) can be also divided by a scaling factor at this point to tune overall rotational diffusion in rotational dynamics model close to experimental value.

## C. Simulation and analysis details

Simulations were ran using Gromacs 5 [4] And Amber ff99SB- ILDN [5] force field for proteins. The proteins were solvated to tip3p[6], tip4p [6] or OPC4 [7] water models. Temperature was coupled to desired value with v-rescale thermistat [8] and pressure was isotropically set to 1 bar using Parrinello-Rahman barostat [9]. Timestep was 2 fs, Lennart-Jones interactions were cut-off at 1.0 nm, PME [10, 11] was used for electrostatics and LINCS was used to constraint all bond lengths [12]. Simulation trajectory and related files are available at [??]. The simulated systems are listed in Table ??

NMR structures from [? ] and [? ] are used as initial structure for PaTonB and HpTonB-92, respectively.

The rotation is removed by using fit option in gmx trjconv and rotational correlation functions are calculated with gmx rotacf. Intertia axes of protein are calculated as ??.

| Tribee 1. Simulated systems and rotational diffusion coefficients (rad |             |      |                    |                     |                   |                   |                   | 10 73) calculated from simulations. |                   |       |  |
|--|-------------|------|--------------------|---------------------|-------------------|-------------------|-------------------|-------------------------------------|-------------------|-------|--|
| Protein  | Water model | T(K) | $t_{\rm sim}$ (ns) | $t_{\rm anal}$ (ns) | $\mathrm{D}_{xx}$ | $\mathrm{D}_{yy}$ | $\mathrm{D}_{zz}$ | $\mathrm{D_{  }/D_{+}}$             | $\mathrm{D}_{av}$ | files |  |
| PaTonB   | tip4p       | 298  | 400                | 390                 | $1.81 \pm 0.01$   | $2.06 \pm 0.03$   | $4.55\pm0.03$     | $2.35\pm0.04$                       | $2.80\pm0.02$     | [?]   |  |
| PaTonB   | tip4p       | 310  | 400                | 390                 | $2.60 \pm 0.02$   | $2.22\pm0.05$     | $5.0 \pm 0.1$     | $2.07\pm0.09$                       | $3.26\pm0.07$     | [?]   |  |
| PaTonB   | OPC4        | 310  | 1200               | 1190                | $2.01 \pm 0.01$   | $2.19 \pm 0.01$   | $5.01 \pm 0.03$   | $2.39 \pm 0.02$                     | $3.07\pm0.01$     | [?]   |  |
| HpTonB-92  | tip3p       | 310  | 570                | 370                 | $8.25\pm0.05$     | $7.67 \pm 0.06$   | $15.9 \pm 0.3$    | $1.99 \pm 0.06$                     | $10.6\pm0.2$      | [?]   |  |
| HpTonB-92  | tip3p       | 303  | 800                | 790                 | $6.24 \pm 0.02$   | $7.04\pm0.03$     | $11.9 \pm 0.2$    | $1.80\pm0.03$                       | $8.40\pm0.07$     | [?]   |  |
| HpTonB-92  | tip4p       | 310  | 470                | 370                 | $3.6 \pm 0.1$     | $3.24 \pm 0.01$   | $6.3 \pm 0.3$     | $1.8 \pm 0.1$                       | $4.4\pm0.2$       | [?]   |  |
| HpTonB-92  | tip4p       | 303  |                    |                     | $2.7\pm0.1$       | $2.71\pm0.02$     | $5.6 \pm 0.5$     | $2.1\pm0.2$                         | $3.7 \pm 0.2$     | [?]   |  |
| HpTonB-92  | OPC4        | 310  | 800                | 790                 | $2.85 \pm 0.01$   | $2.70 \pm 0.01$   | $5.56 \pm 0.01$   | $2.00 \pm 0.01$                     | $3.70 \pm 0.01$   | [?]   |  |

TABLE I. Simulated systems and rotational diffusion coefficients (rad $^2 \cdot 10^7$ /s) calculated from simulations.

#### III. RESULTS AND DISCUSSION

# A. Protein overall rotational diffusion constants and relaxation times

The presented rotational dynamics analysis from MD simulations is exemplified in this section for residue ?? located in alpha helix of PaTonB protein. The analysis of all other bonds are essentially similar.

The total correlation functions calculated from original MD trajectory are shown in Fig. 1 A). As expected, they decay to fluctuate approximately around zero after  $\sim$ 20ns. Fluctuations from ideal relaxation behaviour are seen already with shorter times, which is also expected because good statistic for single molecule correlation functions is expected only for timescales less than hundredth of total simulation time [?], i.e. approximately 4-12ns for the studied systems. Internal correlation functions calculated from trajectory with overall protein rotation removed are shown in Fig. 1 B). As expected, they decay very fast to a plateau value, which is used to determine  $S^2$ . Overall rotational correlation functions calculated as  $C_O(t) = C(t)/C_I(t)$  are shown in Fig. 1 C). MAYBE WE SHOULD SHOW THE FITS HERE?

Overall rotational correlation functions are used to determine prefactors  $A_j$  in Eq. 7 by fitting the equation to the calculated correlation functions. For this purpose timescales  $\tau_j$  in Eq. 7 are determined by calculatin the rotational diffusion coefficients of protein intertia axes. Mean square angle deviations of protein intertia axes from different simulations are shown in Fig. 2. By taking in to account only hundredth of the total simulation length, mean square angle deviations can be considered linear and diffusion constants can be calculated from linear fit. The results for diffusion constants are shown in Table II.

After determining the prefactors by fitting Eq. 7, new correlation functions were calculated as  $C_N(t) = C_I(t) \sum_{j=1}^5 A_j e^{-t/\tau_j}$ . These functions for the example case are shown in Fig. 1 D).

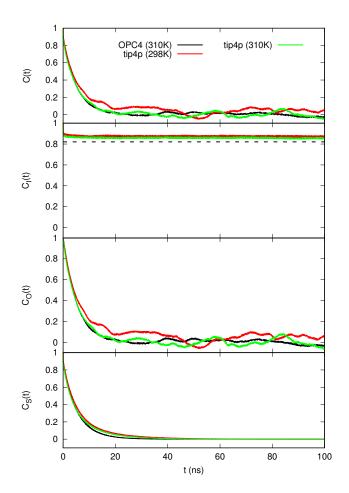


FIG. 1. Example correlation functions for residue ?? of PsTonB calculated from MD simulations with different water models. A) total correlation function C(t), B) correlation function for internal motions and  $S^2$  values determined from the plateau, C) correlation function for overall motions determined from Eq. 6 ( $C_O(t) = C(t)/C_I(t)$ ) and D) new correlation functions determined from Eqs. 6 and 7 by using rotational diffusion constants and fitted prefactors (see section II B)

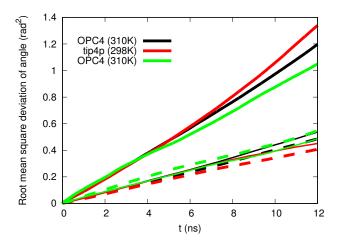


FIG. 2. The intertia tensor angles as a function of time and mean square angular deviations for PsTonB simulation with OPC water model.

### B. Overall rotational diffusion in simulations and experiments

Spin relaxation rates calculated from PaTonB and HpTonB simulations with different water models are shown in Figs. 3 and  $\ref{thm:patch:p$ 

As described in section II B, the global rotational diffusion coefficients around all intertia axes can be scaled with a constants and the resulting rotational correlation functions can be calculated. Figs. 5 and 6 show spin relaxation times calculated from MD simulations where global rotational diffusion coefficients are divided by factors 1.2 and 2.9 for PaTonB simulation with tip4p and HpTonB simulation with tip3p. The results from models with scaled rotational diffusion coefficients diffusion are is good agreement with experiments, suggesting that these results can be used to interpret the experimental relaxation data. The rotational diffusion coefficients after the scaling are shown in Table II.

## C. Protein internal relaxation

Simulations in good agreement with spin relaxation data can be used to interpret internal relaxation and order of proteins. For example, in PsTonB low order parameters and larger effective correlation times are observed in Fig. 3 B) for residues 246-251 in N-terminus, residues 260-274, residues 300-303, residues 320-326 and residues 338-342 in C-terminus. The results in terminal ends (residues 246-251 and 338-342) can be explained by the increased flexibility

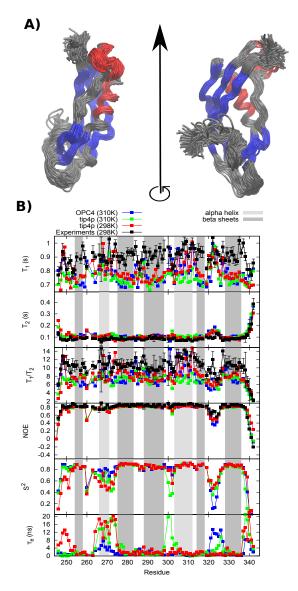


FIG. 3. A) Structures sampled by PsTonB from MD simulations (100 structures from 400ns long trajectory). B) Spin relaxation rates, order parameters and effective internal correlation times from experiments and simulations. Spin relaxation rates indicate increased flexibility only for the last two residues in N terminus. However, MD simulations suggest somewhat smaller order parameters and longer  $\tau_e$  for residues 246-253. By looking at the sampled structures, it seems that lower order parameters and longer correlation times arise from slower and less extensive conformational sampling than in HpTonB-107. Lower order parameters and larger correlation times are also observed in PsTonB simulations between residues 265-275. This can be explained by the changes in orientation of alpha helix close to this region, as seen in the sampled conformations. Such effect was not seen in the HpTonB simulations, however, NMR data for this region showed some unclarities which may arise from such conformational exchange. Enhanced sampling is also observed between residues 320-326. This was not observed in HpTonB samples, which may be related to the formation of beta sheet between residues 315-318 in PsTonB.Relaxation parameters for PsTonB from experiments and simulations with Amber-ildn and different water models

of unstructured endings of the protein, which are also seen

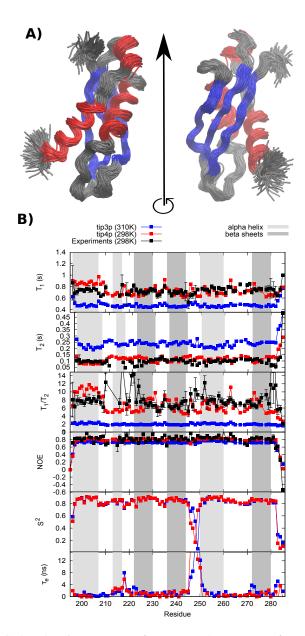


FIG. 4. Relaxation parameters for HpTonB short construct from experiments and simulations with Amber-ildn and different water models

TABLE II. Rotational diffusion coefficients scaled with constant factor which gives a good agreement for spin relaxation data, 2.9 for tip3p simulation of HpTonB and by 1.2 for tip4p simulation of PsTonB.

|                              | HpTonB-92       | PsTonB          |
|------------------------------|-----------------|-----------------|
| $\overline{\mathbf{D}_{xx}}$ | $2.15\pm0.01$   | $1.51\pm0.01$   |
| $\mathrm{D}_{yy}$            | $2.43\pm0.01$   | $1.72 \pm 0.03$ |
| $\mathrm{D}_{zz}$            | $4.10 \pm 0.01$ | $3.79 \pm 0.03$ |
| $\mathrm{D}_{av}$            | $2.90 \pm 0.03$ | $2.3\pm0.02$    |
| $\tau_c(\mathrm{ns})$        | $5.7 \pm 0.1$   | $7.2 \pm 0.1$   |

in overlayed structures in Fig. 3 A). Low order parameters

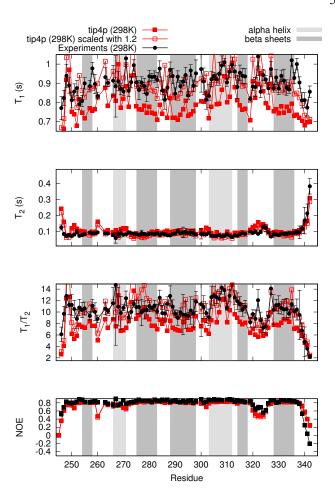


FIG. 5. Relaxation parameters for PsTonB from experiments and simulations with Amber-ildn and different water models. Overall rotational diffusion corrected with factor 1.2.

and large effective correlation times between residues 260-274 arise from two different orientations sampled by alpha helix on that region, as also seen in Fig. 3 A). This explains also the lower resolution in NMR spectra observed for that region [?]. Between residues 320-326 decrease in NOE and  $T_1/T_2$  ratio and increase in  $T_2$  are also observed in simulations and experiments. The results can be explained by the increased flexbility of the loop in this region as also seen in overlayed structures. Low order parameters and large effective correlation times between residues 300-303 are not seen in spin relaxation data, thus it is not clear if these arise from simulation artefact.

Also for HpTonB low order parameters and long effetive correlation times are observed only for flexible terminal ends (residues 196-197 and 283-285) as seen in Fig. ??. Low order parameters and long effetive correlation times and for residues 245-250 probably arise (at least partly) from simulation artefacts because deviation form experimental relaxation data is relatively large for these residues. Different orientations of alpha helix between residues 210-220 and decreased order parameters are not observed in contrast to PsTonB, except single large effective correlation time value at residue 218. The low

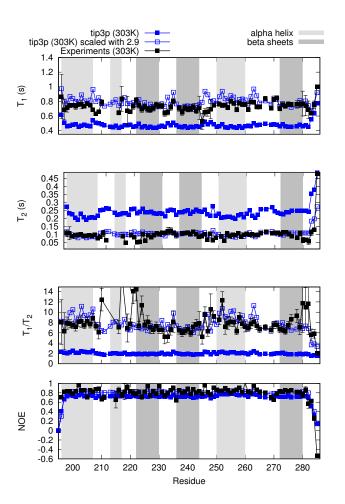


FIG. 6. Relaxation parameters for HpTonB short construct from experiments and simulations with Amber-ildn and different water models

resolution in NMR spectra [? ], however, suggest that the same phenomena is present but not observed in simulations, possibly due to timescale or force field issues.

#### IV. CONCLUSIONS

Rotation of protein intertia axes is observed to experience linear diffusion behaviour and overall diffusion component of rotational correlation functions of individual N-H bonds can can be successfully fitted to the model assuming anitropic diffusion for whole molecule.

Rotational diffusion of whole molecules is overestimated by a factor of  $\sim 3$  in simulations with tip3p water, in agreement with previous studies [?]. The simulations with tip4p and opc4 water models give more realistic diffusion coefficients, which overestimate diffusion only with factors  $\sim 1$ -1.2.

The overstimated overall diffusion coefficient can be corrected post-simulationally to compare internal dynamics and order with experiments.

The presented methodology can be used to interpret spin relaxation experiments by using MD simulations [?] and asses the quality of protein force fields against NMR experiments. The presented scaling of overall anisotropic diffusion allows this also for simulations with incorrect rotational diffusion due to water models, which is the case in simulations with tip3p.

## ACKNOWLEDGMENTS

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<sup>[2]</sup> L. E. Kay, D. A. Torchia, and A. Bax, Biochemistry **28**, 8972 (1989)

<sup>[3]</sup>  $\tau_1 = (4D_{xx} + D_{yy} + D_{zz})^{-1}, \tau_2 = (D_{xx} + 4D_{yy} + D_{zz})^{-1}, \tau_3 = (D_{xx} + D_{yy} + 4D_{zz})^{-1}, \tau_4 = [6(D + (D^2 - L^2)^{-1/2}]^{-1}, \tau_5 = [6(D - (D^2 - L^2)^{-1/2}]^{-1}, D = \frac{1}{3}(D_{xx} + D_{yy} + D_{zz})$ and  $L^2 = \frac{1}{3}(D_{xx}D_{yy} + D_{xx}D_{zz} + D_{yy}D_{zz}).$ 

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