Contraction of stochasticity on hierarchical kinetic networks

Cheng-Hung Chang

Institute of Physics, National Chiao Tung University, Taiwan



Motivation:

Kinetic networks are widely used for studying complex systems,

e.g., <u>structural biology</u>



Noé, et al JCP (2007) metastable states

systems biology.



Saj, et al (2010) modules



small system

share the same mathematics



what are states and transition rates between states?



large system

Q: How fine we should coarse grain a system? A: Unfortunately, no *a priori* rule.

→ Hierarchical networks





Stochastic LA introduces stochasticity into traditional LA.

Traditional lumping analysis (deterministic dynamics) rate equations (RE)

Stochastic lumping analysis (stochastic process)

chemical master equations (CME) (for intrinsic noises)

stochastic differential equations (SDE) (for intrinsic & extrinsic noises)

Traditional lumping analysis (on rate eq.)

Kinetic model

Rate equation (RE)





 N_i : the concentration (or prob.) of the *i*-th state $\sum_{i=1}^n N_i$ = constant (conservation law)

Exact and approximate lumpings

Suppose system A has a RE

 $\frac{d\mathbf{N}}{dt} = \mathbf{M}\mathbf{N}$ (1)*n* –dim. If there exists an $n' \times n$ lumping matrix U such that N' = UN fulfills $\frac{d\mathbf{N}'}{dt} = \mathbf{M}'\mathbf{N}' + f(\mathbf{N})$ n'-dim (n' < n), (2)then A is exactly lumpable. If the memory $f(\mathbf{N}) \approx 0$ but $\neq 0 \rightarrow \mathbf{A}$ is approximately lumpable. Condition for (exact) lumpability (Wei & Kuo 1969) (1) $\rightarrow \frac{d(\mathbf{UN})}{dt} = \mathbf{UMN}$ (2) $\rightarrow \frac{d\mathbf{N'}}{dt} = \mathbf{M'UN}$ $\Leftrightarrow \quad \mathbf{U}\mathbf{M} = \mathbf{M}'\mathbf{U}$ (3)

Lumpability condition in terms of rate constants

U groups N_i into n' sets S_a , a = 1, ..., n'.

$$k'_{ba} = \sum_{i \in S_a} k_{ji}$$

 $\forall a, b \text{ with } j \in S_b \text{ and } b \neq a$

A and A' fulfill (4).

 \Leftrightarrow A can be (exactly) lumped into A' (mathematical term)

 \Leftrightarrow A is kinetically equivalent (KE) to A' (physical term)

 \Leftrightarrow UN and N' are identical.

 \Leftrightarrow N and N' are <u>indistinguishable</u> (after N is projected by U).

Stochastic lumping analysis (on chemical master eq. & stochastic differential eq.)

Chemical master equation (CME)

$$\frac{dP(\mathbf{N},t)}{dt} = \sum_{i,j}^{n} k_{ij} [(N_i + 1)P(\mathbf{N} - \boldsymbol{\omega}_{ij}, t) - N_i P(\mathbf{N}, t)]$$
$$d\mathbf{P}(t) / dt = \mathcal{L} \mathbf{P}(t)$$

 $\boldsymbol{\omega}_{ij}$ = number change of N_i and N_j Evolution of joint probability $P(\mathbf{N}, t) = P\left(\begin{pmatrix} \mathbf{N_1} \\ \mathbf{N_2} \\ \mathbf{N_3} \end{pmatrix}, t\right)$ $P(\mathbf{N}, t) \equiv 0$ if any $N_i < 0$.



 $N_1 = 6$ $N_2 = 5$ $N_3 = 4$

(5)

Protein with three conformations (n = 3)

Lumping matrix U associated lumping operator $\widehat{\mathbf{U}}$

For each matrix $\mathbf{U}: \mathbf{N} \rightarrow \mathbf{N}'$ for lumping the rate equation, there exists an associated operator $\widehat{\mathbf{U}}: \mathbf{P} \rightarrow \mathbf{P}'$ for lumping the chemical master equation.



(6)

Theorem 1:



Implications:

- Lumpability of RE ⇔ Lumpability of CME
 N and N' indist. ⇔ P and P' indist.
 Weak indist. (1st moment) → strong indist. (all moments)
 e.g., covariance & variance, ...
- For <u>intrinsic</u> noises, fluctuation measurements cannot be used to judge whether a system has internal states.

Numerical confirmation (to Theorem 1)

A is KE to A', indist. means between n_1+n_2 and n_1' .

4-state model A



2-state model A'



indist. <u>variances</u>. (automatically)

Thermodynamically equivalence (TE)

If systems A and A' are TE to each other, their states N and N' are indist. at $t \rightarrow \infty$, i.e.,

 $\mathbf{UN}^{s} = \mathbf{N}^{\prime s}$ (s = stationary).

TE is weaker than KE (KE implies TE, but not vice versa).

Stationary joint prob. TL Hill (1971), YD Chen (1973), N Saito (1974)

(closed)
$$P^{S}(\mathbf{N}) = \frac{N!}{\prod_{i=1}^{n} N_{i}!} \prod_{j=1}^{n} \left(\frac{\langle N_{j}^{S} \rangle}{N}\right)^{N_{j}}$$

(open)
$$P^{S}(\mathbf{N}) = \prod_{i=1}^{n} \frac{\langle N_{i}^{S} \rangle^{N_{i}}}{N_{i}!} e^{-\langle N_{i}^{S} \rangle}$$

Since P^s only depends on the means N_j^s , infinitely many k_{ij} can generate the same P^s .

Theorem 2:

If the RE of A is thermodynamically equivalent to that of A' (not necessarily kinetically equivalent), then

 $\widehat{\mathbf{U}}\mathbf{P}^{s}=\mathbf{P}^{\prime s}.$

Implications:

- Even if N and N' (P and P') of two TE networks are initially dist., they will become indist. at t → ∞. → asymptotic lumpability
- "Lumpability" seems to play the same role as a Lyapunov function for characterizing entropy production.
 Kullback-Leibler divergence may be a measure.

Numerical confirmation (to Theorem 2)

100 realizations of a system of 100 molecules



 $p(N_{p},t)$ 0.1 Probability 0.05 0 4 3 Time t 2 100 75 50 25 1 0 System number N_p

TE but not KE

 $\begin{array}{ll} p(N_1 + N_3, t) & p(N_1 + N_2, t) \\ p(N_{1'(31)}, t) & p(N_{1'(12)}, t) \end{array}$

Note: $p(N_i, t) \neq \text{joint prob. } P((N_1, \dots, N_n)^T, t).$

Stochastic differential equation (SDE)

$$\frac{d\widehat{\mathbf{N}}}{dt} = \mathbf{M}\widehat{\mathbf{N}} + \mathbf{f}(t) \qquad \begin{array}{l} \langle \mathbf{f}(t) \rangle = 0 \\ \langle \mathbf{f}(t)\mathbf{f}(t')^{\mathrm{T}} \rangle = \mathbf{\Gamma}\delta(t-t') \end{array}$$

(7)

$$\widehat{\mathbf{N}}(t) = \mathbf{e}^{\mathbf{M}t}\widehat{\mathbf{N}}(0) + \int_0^t \mathbf{e}^{\mathbf{M}\tau} \mathbf{f}(t-\tau) \,\mathrm{d}\tau,$$

Covariance of fluctuations of $\widehat{\mathbf{N}}$:

$$\boldsymbol{\sigma}(t) = (\widehat{\mathbf{N}} - \mathbf{N})(\widehat{\mathbf{N}}^{\mathrm{T}} - \mathbf{N}^{\mathrm{T}}) = \int_{0}^{t} \mathbf{e}^{\mathrm{M}\tau} \, \boldsymbol{\Gamma} \left(\mathbf{e}^{\mathrm{M}\tau}\right)^{\mathrm{T}} \mathrm{d}\tau \tag{8}$$

Covariance of fluctuations of $U\widehat{N}$: (generally $U\widehat{N}$ has a memory term) $U\sigma U^{T} = U(\widehat{N} - N)(\widehat{N}^{T} - N^{T})U^{T}$ (9) $= (U\widehat{N} - UN)((U\widehat{N})^{T} - (UN)^{T}) = U\int_{0}^{t} e^{M\tau} \Gamma(e^{M\tau})^{T} d\tau U^{T}.$ If A can be lumped into A' by U,

$$\mathbf{U}\boldsymbol{\sigma}\mathbf{U}^{\mathrm{T}} = \int_{0}^{t} \mathbf{e}^{\mathrm{M}'\tau} \, \mathbf{U} \, \boldsymbol{\Gamma} \, \mathbf{U}^{\mathrm{T}} \left(\mathbf{e}^{\mathrm{M}'\tau} \right)^{\mathrm{T}} \mathrm{d}\tau \,. \tag{10}$$

evariance of fluctuations of $\mathbf{\widehat{N}}'$ of A':
$$\boldsymbol{\sigma}' = \int_{0}^{t} \mathbf{e}^{\mathrm{M}'\tau} \, \boldsymbol{\Gamma}' \left(\mathbf{e}^{\mathrm{M}'\tau} \right)^{\mathrm{T}} \mathrm{d}\tau \,. \tag{11}$$

Covariance difference between (11) of A' and (10) of A,

$$\sigma_{diff} \equiv \sigma' - U\sigma U^{T} = \int_{0}^{\tau} e^{M\tau} \Gamma_{diff} \left(e^{M\tau} \right)^{T} d\tau, \qquad (12)$$
with $\Gamma_{diff} \equiv \Gamma' - U\Gamma U^{T}.$

Variance difference

 $V_{\rm diff} \equiv$ diagonal part of $\sigma_{\rm diff}$,

(12) \rightarrow Even when A and A' have indist. means, their fluctuations, which depend on Γ_{diff} , could be different.

Theorem 3: (for varaince)

$$\begin{array}{l} \mbox{Variance ordering between two KE systems A and A'} \\ \mbox{driving} & \left [\begin{matrix} \Gamma_{diff} \geq 0 \\ \Gamma_{diff} = 0 \end{matrix} \right] \Rightarrow \\ \Gamma_{diff} = 0 \end{matrix} \right] \Rightarrow \\ \mbox{V}_{diff} \geq 0 \\ V_{diff} = 0 \end{matrix} \right] \\ \mbox{v}_{diff} \leq 0 \end{matrix} \left [\begin{matrix} response \\ V_{diff} \leq 0 \end{matrix} \right] \end{array}$$

where ≥ 0 (≤ 0) denotes positive (negative) semi-definite.

The derivative of covariance differnce (12): $\sigma_{diff} = \int_{0}^{t} e^{M\tau} \Gamma_{diff} (e^{M\tau})^{T} d\tau$ is $\frac{d\sigma_{diff}}{dt} = e^{M't} \Gamma_{diff} [e^{M't}]^{T} (e^{M't} \text{ reversible})$ stronger than (13)

$$\sigma_{diff} = 0$$

iff
 $\Gamma_{diff} = 0$

(13)

Theorem 4: (for covariance)

If A can be lumped into another KE system A', with the corresponding σ' and Γ' , then

 $\Gamma' = U\Gamma U^T \quad \Leftrightarrow \quad \sigma' = U\sigma U^T$

Implication:

• (14) is a generalization of Keizer's contraction* from the invertible transformation to the lumping transformation.

* J. Keizer (1987)

"Statistical Thermodynamics of Nonequilibrium Processes"

(14)

Application I: Intrinsic noises in ion channels FJ Sigworth (J. Physiol, 1980) The <u>variance</u> of Na current <u>fluctuations</u> at the node of Ranvier



Voltage-clamped single myelinated nerve fibers from *Rana pipiens*

 \rightarrow N=20,400 Na channels

Variance from the stochastic gating of Na channels (dots) & thermal noise (solid line)



SDE approach to ion channel

For that problem, the covariance of stochastic force in the SDE is

$$\Gamma_{ij} = \sum_{k=1}^{n} (k_{ki}N_k + k_{ik}N_i) \,\delta_{ij} - k_{ji}N_j - k_{ij}N_i$$

(15)

J. Keizer (1987): Canonical theory for transition rates Van Kampen (2007): linear noise approximation

If two KE networks A and A' are used to describe the <u>intrinsic</u> noises of an ion channel, we can prove that their Γ and Γ' are <u>indist</u>. (also for the chemical Langevin eq. of DT Gillespie (2000)).

According to Theorem 4, σ and σ' are also indist..

Consistent "indist. σ and σ " from SDE and CME for intrinsic noises.

Application II: Extrinsic noises in signal receptors

Free energy surface variations of receptor





external noises

State fluctuations?

Lumping minima of free energy surface



k₃₁ k_{13} k_{27} k₂₃ K₁₂ Lumping k′₂₁ k' 12

If there exists two KE models, do N and N' have indist. fluctuations?

Ordering relation of state variances

It's a special case of Theorem 3 and 4 at equilibrium ($t \rightarrow \infty$)

$$\begin{split} \widetilde{\Gamma}_{diff} &\equiv \mathbf{D}_{N^{e'}} \widetilde{\Gamma}' \mathbf{D}_{N^{e'}} - \mathbf{U} \mathbf{D}_{N^{e}} \widetilde{\Gamma} \mathbf{D}_{N^{e}} \mathbf{U}^{\mathrm{T}} \\ \widetilde{\sigma}_{diff} &\equiv \widetilde{\sigma}' - \mathbf{U} \widetilde{\sigma} \mathbf{U}^{\mathrm{T}} = \beta^{2} \int_{0}^{\infty} \mathbf{e}^{\mathbf{M}' \tau} \mathbf{M}' \widetilde{\Gamma}_{diff} \mathbf{M}'^{\mathrm{T}} [\mathbf{e}^{\mathbf{M}' \tau}]^{\mathrm{T}} \mathrm{d} \tau \end{split}$$

 $\widetilde{V}_{diff} \equiv$ diagonal part of σ_{diff}

The distinguishiability of variances depends on $\tilde{\Gamma}_{diff}$:

| $\tilde{\Gamma}_{diff} \geq 0$ | \Rightarrow | $\widetilde{V}_{diff} \ge 0$ |
|--------------------------------|---------------|-------------------------------|
| $\tilde{\Gamma}_{\rm diff}=0$ | \Rightarrow | $\widetilde{V}_{diff} = 0$ |
| $\tilde{\Gamma}_{diff} \leq 0$ | \Rightarrow | $\widetilde{V}_{diff} \leq 0$ |

Q: Which $\tilde{\Gamma}$ and $\tilde{\Gamma}'$ would appear in real biological systems?

Criterion I (incoherent driving)

$$\begin{split} \widetilde{\Gamma} &= I_{n \times n} \text{ and } \widetilde{\Gamma}' = I_{n' \times n'} \text{ then } \widetilde{\Gamma}_{diff} \geq 0 \text{ and } V_{diff} \geq 0 \\ \text{System A} \quad \widetilde{\Gamma}_3 &\equiv \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} \quad \text{System A'} \quad \widetilde{\Gamma}_1 \equiv \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix} \\ \text{incoherent} \\ 3 \quad 1 \quad 2 \quad 3 \quad 2' \quad 1' \quad 2' \end{split}$$

Smaller networks \Rightarrow larger state fluctuations.

Criterion II (coherent driving)

e.g., ion channels with symmetric conformations

 $\delta E = U^T \delta E'$ then $\widetilde{\Gamma}_{diff} = 0$ and $V_{diff} = 0$ System A $\tilde{\Gamma}_2 \equiv \begin{bmatrix} 1 & 1 & 0 \\ 1 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}$ System A' $\tilde{\Gamma}_1 \equiv \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}$ coherent 1 2 3 2' 1' 3 2'

A and A' are indistinguishable in variance.

Numerical confirmation (to Theorem 4 & Corollary I, II)



Summary:

This work

- generalizes lumping analysis from deterministic dynamics to stochastic processes.
- introduces lumping technique from systems biology to structural biology.
- opens a possibility of identifying correct network models by observing extrinsic noises.
- goes beyond traditional contractions under "fast relaxation" assumption.
- provides a theoretical basis for the legitimate use of low-dim models for fluctuations.

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De-Ming Deng Yi-Ta Lu

Biophysics group @ NCTU



Stochastic lumping theory

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Stochastic lumping analysis for linear kinetics and its application to the fluctuation relations between hierarchical kinetic networks

De-Ming Deng and Cheng-Hung Chang Institute of Physics, National Chiao Tang University, Hsinchu 300, Taiwan (Received 16 February 2015; accepted 27 April 2015; published online 11 May 2015)

Concentional studies of biomolecular behaviors rely largely on the construction of kinetic schemes. Since the selection of these networks no truingue, a consern is raited whether and under which conditions hierarchical schemes can reveal the same experimentally measured fluctuating behavions and unique Hottmation related physical properties. To charry these quencies, we introduce stochasticity into the traditional languing analysis, generalize it from rate equations to chemical muster equations and stochastic differential equations, and outside the tradition relations between traditional traditional barry of the legitimate use of low-dimensional models in the tradition rumbin provide a theoretical barso for the legitimate use of low-dimensional models in the tradition of macromolecular thetronations and, more generally, for exploring stochastic features and different levels of contracted networks in chemical and biological lanctic systems. © 2015 AIP Publishing LLC, Llang/stdt.abs(10)(1003)(1003)

I. INTRODUCTION

Kinetic schemes are widely used for studying the thermodynamic, dynamic, and stochastic properties of macromole-cules.¹ These schemes are usually selected to be as simple as ossible, such as the 2-state schemes for the bound and un bound states of enzymes or receptors and the open and closed states of ion channels. Nevertheless, they can also be rather sophisticated (e.g., 8-state inositol trisphosphate receptors the 10-state hemoglobin,3 and the 56-state chloride channels3). The selection of kinetic schemes is mainly determined by the desired accuracy and the measurable quantities.45 Since a low-dimensional scheme can usually be contracted from higher-dimensional ones, there exists a cascade of hierarchical Markovian network models suitable for describing the time evolution of the populations of a macromolecule's functional states.6 These networks are anticipated to have indistinguishable kinetics, exhibiting identical mean trajectories after being projected to the low-dimensional network space. However models with indistinguishable means do not necessarily have indistinguishable fluctuations. A question that arises is that which schemes will give more relevant fluctuations to a real system and under which conditions unique fluctuation features can be obtained from different levels of contracted schemes These issues are essential for the reliability of various biological properties derived in terms of the fluctuations of a selected kinetic scheme, such as chemoreception,7,8 membrane conductance,9 and ion channel density.1

The inter-network fluctuation relations arise from a comparison between different course-printed dynamical systems. It resembles the comparison between different rate equations in the lumping analysis, widely used in systems biology and general chemical engineering.^{11,12} A central susce in that analysis is finding the lumping conditions for eliminating unimportant events or time scales in a large network, of

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typically over 10⁴ species in systems biology, to orden eith complexity¹⁶ interestingly that constrained in strandmarkally analogone to merging experimentally indistinguishable tates to obtain simple transition networks for the conformational change of nunceromolecule. For instance, the Hodgkin-Hutegy patients in individual four gates are open or closed.⁴ However, this channel is often regarded as a 2-abret system, described by whether or not ions can gates through it in a patch-lange to because the gating current necording is incapable of resoluing the clearled structure of the channel configuration. In summer of typermeticing is an approximate

Despite that correspondence, the original lumping anal-ysis focuses on the relations between mean dynamics and s not concerned with fluctuations. To extract this stochastic component, we generalize the lumping theory from original rate equations (RE) to chemical master equations (CME) and stochastic differential equations (SDE) and study kinetically equivalent (KE) and thermodynamically equivalent (TE) hierarchical kinetic schemes, under intrinsic and extrinsic noises The results go beyond the conventional assumption of "fast relaxations" and contribute to our understanding of why a kinetic system can he contracted. In the case of extrinsic noise, different kinetic schemes can give different fluctuations even when their average trajectories are the same. This opens a possibility of identifying a correct kinetic model by observing fluctuations, Notably, lumping conditions here are used for generating complex KE or TE networks from simple networks, in opposite to their original goal of reducing complex networks to simple networks. Furthermore, for the conformational change of macromolecules discussed below it is sufficient to focus on linear REs and linear lumping

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Two upcoming preprints: SLA for

- Arrhenius type of transitions
- open kinetic networks