# The limit distribution of inhomogeneous Markov processes and Kolmogorov's problem

Zhenxin Liu

Dalian University of Technology z×liu@dlut.edu.cn

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#### 1 Limit distribution of inhomogeneous Markov processes

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 $\S1.1$  Limit distribution of homogeneous Markov processes

#### Limit distribution

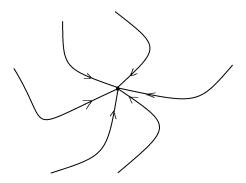
# Theorem (Kolmogorov, Doeblin, Doob, Lévy, Chung, Harris, ...)

Let  $X = \{X(t); t \ge 0\}$  be a Markov process. If X is Harris recurrent, then X admits a unique stationary distribution, which is the limit distribution of X.

#### Remark

If we denote by  $\mu(t)$  the distribution of X(t), then it means  $\mu(t) \rightarrow \mu_{\infty}$  as  $t \rightarrow \infty$ .

#### What it looks like?



Convergence to a fixed point (homogeneous case)

#### $\S1.2$ Inhomogeneous Markov processes

#### Inhomogeneous is more natural

- From Doob's classical monograph "Stochastic Processes", to Chung's 'authoritative' "Markov Chains with Stationary Transition Probabilities", and to Meyn-Tweedie's 'bible' "Markov Chains and Stochastic Stability", only homogeneous case is treated.
- But it is very natural and important to consider inhomogeneous case, which means the developing mechanism of the system we consider varies as the time evolves.
- Due to the lack of tools, there are very few results on the limit distribution of inhomogeneous case.

Our aim: limit dis. for inhomogeneous MP

Natural questions:

- How to describe asymptotic behaviors of inhomogeneous Markov processes?
- Does there exist similar counterpart to stationary distribution in homogeneous case?

**Our observation:** for inhomogeneous MP generated by nonautonomous SDE, the theory and methods in dynamical systems can be used to study their limit behaviors.

# $\S1.3$ Our works on limit behaviors of inhomogeneous Markov Processes

#### Related works

Consider the semilinear SDE

dx(t) = (Ax(t) + F(t, x(t)))dt + G(t, x(t))dW(t) (\*)

with A generating a  $C^0$ -semigroup,  $F, G \in C(\mathbb{R} \times H, H)$  and H a Hilbert space.

Periodic: Khasminskii (69, Monograph), Zhao and coauthors (09-), Chen-Han-Li-Yang (17, JDE), ...

 Almost periodic: Halanay (87, P. Conf.), Morozan-Tudor (89, SAA), Da Prato-Tudor (95, SAA), Arnold-Tudor (98, Sto. Sto. Rep.), Bezandry-Diagana (07, App. Ana.), ...

#### Remark

These works only consider the existence of P/AP solutions, but do not concern the limit behaviors.

#### Our works on limit distribution

- Fu-L. (10, PAMS): Introduced almost automorphic (AA) stochastic processes and proved that the law of the unique AA solution is the limit distribution
- Wang-L. (12, Non.), L.-Sun (14, JFA): Introduced Lévy noise perturbation, and investigated big jump impact (intuitively harmful) on the limit distribution (AP/AA solution)
- Cheban-L. (17, preprint; 18, in preparation): The law of general<sup>1</sup> recurrent solutions is the limit distribution

<sup>&</sup>lt;sup>1</sup>Includes stationary, periodic, quasi-periodic, almost periodic, pseudo-periodic, almost automorphic, Levitan almost periodic, Birkhoff recurrent, almost recurrent, pseudo-recurrent, Poisson stable.

#### Averaging and limit distribution Consider the SDE

$$dx(t) = (Ax(t) + F(\frac{t}{\epsilon}, x(t)))dt + G(\frac{t}{\epsilon}, x(t))dW(t)$$
(1)

with A, F, G the same as above, and the averaged SDE

$$dx(t) = (Ax(t) + \overline{F}(x(t)))dt + \overline{G}(x(t))dW(t).$$
<sup>(2)</sup>

Cheban-L. (18, preprint): the unique recurrent solution φ<sub>ε</sub> of (1) will converge to the unique stationary solution φ̄ of (2):

$$\lim_{\epsilon \to 0} \sup_{t \in \mathbb{R}} \mathbf{E} |\varphi_{\epsilon}(t) - \bar{\varphi}|^2 = 0,$$

and hence in distribution sense.

#### Remark

Different from existing works, our work considers averaging on *infinite* interval (Bogolyubov 2nd Th.)

AP limit distribution by separation and Lyapunov method

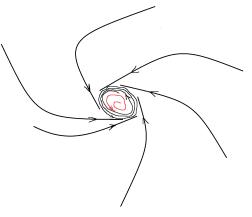
Consider the SDE on  $\mathbb{R}^d$ 

$$\mathrm{d}X = f(t, X)\mathrm{d}t + g(t, X)\mathrm{d}W$$

with f, g AP in t.

- L.-Wang (16, JDE): boundedness + separation => AP solution
- Li-L.-Wang (19, DCDS-B): Lyapunov function + finite L<sup>2</sup>-bounded solution ⇒ AP solution

#### Conclusion: an overview of inhomogeneous case



## Convergence to a recurrent orbit (inhomogeneous case)

# Limit distribution of inhomogeneous Markov processes Limit distribution of homogeneous Markov processes Inhomogeneous Markov processes

Our works on limit behaviors of inhomogeneous MP

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#### $\S2.1$ Kolmogorov's problem

#### Kolmogorov's problem

Stochastically perturbed ODE:

$$\mathrm{d} x = V(x)\mathrm{d} t + \sqrt{2\epsilon} \ G(x)\mathrm{d} W, \qquad x \in \mathbb{R}^n;$$

the associated stationary Fokker-Planck equation:

$$\epsilon \partial^2_{ij}(a^{ij}u) - 
abla \cdot (Vu) = 0, \qquad x \in \mathbb{R}^n$$

with  $(a^{ij}) = GG^{\top} > 0$ .

**Kolmogorov's Problem**<sup>2</sup> (1950s): the asymptotic behavior of stationary distribution  $\mu_{\epsilon}$  of the diffusion process as  $\epsilon \to 0$ .

<sup>&</sup>lt;sup>2</sup>Ya. Sinai (1989) calls it "famous problem". It will be seen below that this problem is closely related to stochastic stability.

## $\S2.2$ Existing works

#### Existing works

Nevelson (1964): flows on the circle.

- Khasminskii (1963): flows on the 2-torus.
- Khasminskii (1963,1964): 2-D Hamiltonian systems.
- Freidlin-Wentzell (1970): the limit measures of μ<sub>ε</sub> are supported on finite fixed points and periodic orbits.
- Kifer (1974), Young (1986): the limit of μ<sub>ε</sub> is SRB measure for flow and diffeomorphism, respectively.

### §2.3 Our work on Kolmogorov's problem Joint with W. Huang, M. Ji, Y. Yi (15, AoP; 15-16, JDDE I-III; 16, Phy. D.; 18, Phy. D.)

#### Lyapunov function

Consider the probability measure solution  $\mu_\epsilon$  to the above stationary F-P equation; typically it is an invariant measure of the SDE.

#### Definition

U is a Lyapunov function for the SDE or the F-P equation, if

$$LU = \epsilon a^{ij} \partial_{ij}^2 U + V \cdot \nabla U \le -\gamma.$$

#### Remark

Note: if the SDE admits a Lyapunov function, then the unperturbed ODE admits the same one.

#### Theorem (Huang, Ji, L., Yi)

If the SDE admits a Lyapunov function, then

- the stationary measure μ<sub>ε</sub> exists (even with degenerate diffusion);
- the family  $\{\mu_{\epsilon}\}$  is tight, hence the set  $\mathcal{M}$  of limit measures of  $\mu_{\epsilon}$ , as  $\epsilon \searrow 0$ , is nonempty;
- any limit measure  $\mu \in \mathcal{M}$  is an invariant measure of the ODE, supported on the global attractor;
- (stochastic LaSalle invariance principle) if *U* is entirely weak Lyapunov, then any limit measure  $\mu \in \mathcal{M}$  is supported on the set  $\{x : V(x) \cdot \nabla U(x) = 0\}$ .

#### Remark

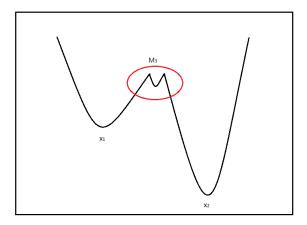
1. The set  $\mathcal{M}$  depends essentially on G.

2. If  $\mathcal{M} = {\mu_0}$  is a singleton set, then  $\mu_0$  is G-stable; if  $\mathcal{M}$  not singleton, then none invariant measure of ODE can be G-stable.

#### Theorem (Huang, Ji, L., Yi)

If the ODE admits a Lyapunov function with bounded 2nd derivatives (*can be weakened*), then

- for a strong local attractor, there is *G* s.t. all the limit measures are supported on the attractor;
- for a strong local repeller, there is *G* s.t. all the limit measures are supported away the repeller;
- for a strong repelling equilibrium, for any typical *G*, all the limit measures are supported away the equilibrium.



#### Connections with stochastic stability

Given finite # invariant sets  $\{M_i\}_{i=1}^N$ , as before, let  $\mathcal{M}$  be the limit measures of  $\mu_{\epsilon}$ . Then

$$\bigcup_{\mu \in \mathcal{M}} \operatorname{supp} \mu \subset M_k \quad \Rightarrow \quad M_k \text{ is } G\text{-stable}$$

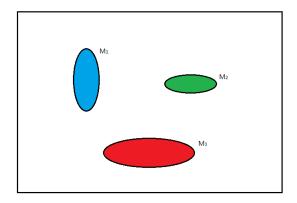
and others are G-negligible. If for  $\epsilon \ll 1$ ,

$$\mu_{\epsilon}(M_i) < \mu_{\epsilon}(M_j) \quad \Rightarrow \quad M_j \text{ is more } G \text{-stable than } M_i.$$

#### Remark

1. In this way, we can discuss the (relative) stochastic stability of invariant sets under the perturbations  $o(G\dot{W})$ .

2. The stochastic stability of invariant measures is much more complicated than invariant sets, cf [16, Phy. D].



## THANK YOU!