

# Complex Dynamics Is Abolished in Delayed Recurrent Systems with Distributed Feedback Times

by Thiel et al. (2003)

CPSC 644

Presented by Yoonsuck Choe

1

## Background

- In time-lagged recurrent feedback systems, feedback gain and delay may serve as a bifurcation parameter whose increase yields a sequence of bifurcations leading from fixed point behavior to periodic orbits, and finally chaos.
- In most studies, recurrent signals are assumed to come from a singular instant in the past.
- However, in biological systems, there may be a wider range of delay in the feedback.

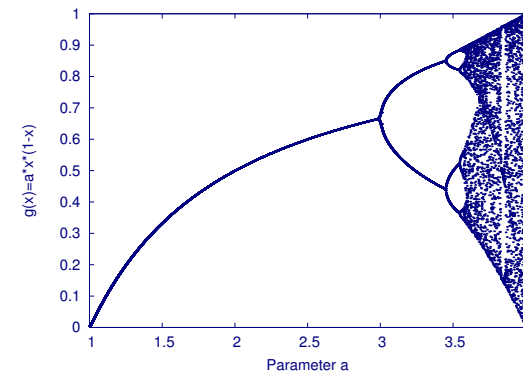
3

## Introduction

- Feedback systems with a single delay time: known to exhibit various dynamical behaviors including complex oscillations and chaos.
- With broad distribution of delays, yields a larger set of parameter values that results in fixed point behavior or simple oscillatory behavior.

2

## Basic Concept: Bifurcation



- Logistic map:  $x = a \times x \times (1 - x)$ .
- With random initial values  $x_0$ , calculate sequence of  $x$ 's, and find the steady-state.
- Plot the steady states for different parameter values: Bifurcation diagram.

4

## Approach

- Build up from existing models (with singular delay) showing complex dynamic.
  - Inhibitory feedback in hippocampus.
  - Mackey-Glass equation (regulation process of white blood cells).
  - Logistic growth of an ecological population under resource limits.
- Introduce distributed delay and observe resulting change in behavior.

5

## Distribution of Delay

- Some assumptions:

$$\int_0^{\infty} \xi(\tau) d\tau = 1$$

- Simplest form:

$$\xi(\tau) = \begin{cases} 1/2\sigma & \text{if } \tau_m - \sigma \leq \tau \leq \tau_m + \sigma \\ 0 & \text{otherwise} \end{cases}$$

7

## Neural Feedback in the Hippocampus

- Mossy fibers (exc) → CA3 pyramidal cell (exc) → interneuronal basket cells (inh) → CA3 pyramidal cell
- Delay in the feedback inhibitory loop can vary.
- Amount of feedback may also affect dynamic behavior: penicillin can modulate this (GABA antagonist).
- Model:

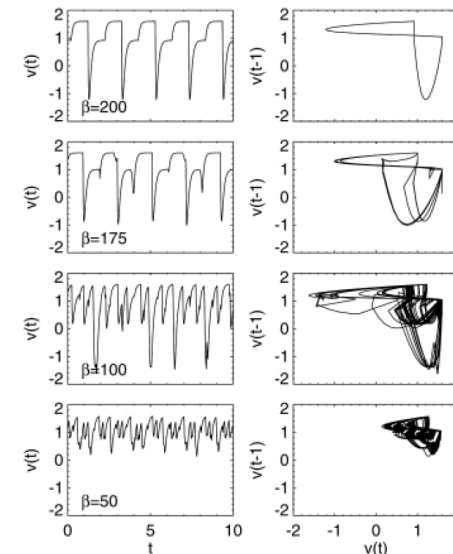
$$\frac{dv(t)}{dt} = -\Gamma v(t) + \Gamma e - \beta \frac{F_{\xi}(v(t))}{1 + F_{\xi}(v(t))^n},$$

$$F_{\xi}(v(t)) = f_0 \int_0^{\infty} [v(t - \tau) - \theta]_+ \xi(\tau) d\tau.$$

$v(t)$ : membrane potential;  $\Gamma$ : inverse time const.;  $e$ : external input;  $\beta$ : feedback gain factor;  $F(\cdot)$ : basket cell firing rate;  $\theta$ : threshold;  $[x]_+ = xH(x)$ ;  $\xi$ : distribution function.

6

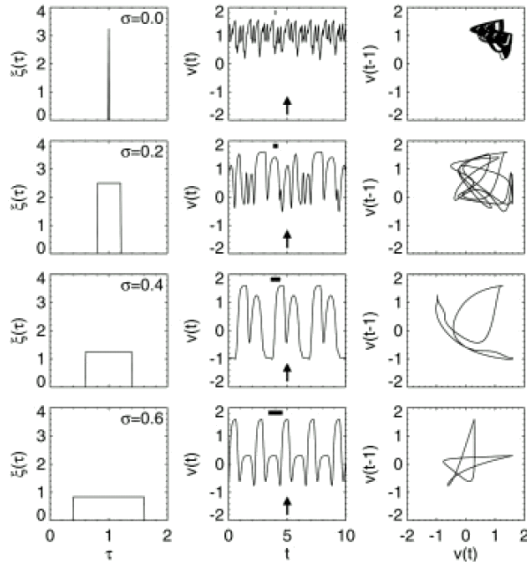
## Results: Hippocampus Model with Singular Delay



- Singular delay.
- Bifurcation parameter  $\beta$  increased from top to bottom.
- Complex dynamic results.

8

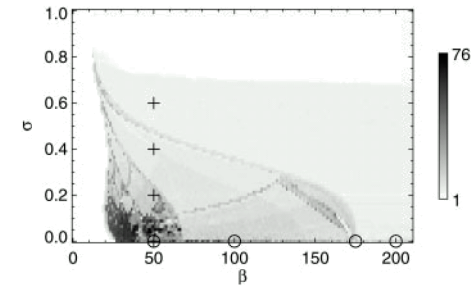
## Results: Hippocampus Model with Distributed Delay



- Various delay distributions.
- Dynamic becomes simpler.

9

## Results: Period Numbers against Parameters



- $\beta$ : bifurcation parameter (inhibitory gain).
- $\sigma$ : temporal dispersion.
- Higher  $\sigma$  gives wider region with low period number as  $\beta$  varies.

10

## Mackey-Glass System: White Blood Cell Regulation

- Production of neutrophil granulocytes (a type of white blood cell).
- Production depends on present amount, but new production matures with a delay.
- Altered feedback gain or delay causes period-doubling bifurcations leading to chaos: Suspected cause of chronic granulocytic leukemia.

11

## Mackey-Glass System

- Normalized concentration of cells:

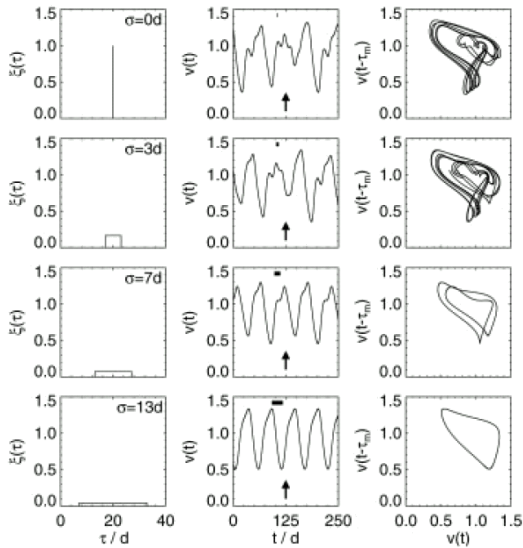
$$\frac{dv(t)}{dt} = -\gamma v(t) + \beta \frac{V_{\xi}(v(t))}{1 + V_{\xi}(v(t))^n},$$

$$V_{\xi}(v(t)) = \int_0^{\infty} v(t - \tau) \xi(\tau) d\tau,$$

$\gamma$ : cell loss rate;  $\beta$ : gain in regulation; Same  $\xi$  as before.

12

## Results: Mackay-Glass Model with Distributed Delay



- More distributed delay gives simpler dynamic.
- Bar indicates the integration interval.

13

## Population Density

- Delay-differential equation for population density  $N$ :

$$\frac{dN(t)}{dt} = rN(t) \left( 1 - \frac{1}{K} N_{\xi}(N(t)) \right),$$

$$N_{\xi}(N(t)) = \int_0^{\infty} N(t - \tau) \xi(\tau) d\tau,$$

$$\xi(\tau) = \begin{cases} 0 & \text{if } 0 \leq \tau \leq \tau_{\min} \\ (\tau - \tau_{\min}) \exp(-(\tau - \tau_{\min})/\theta) / \theta^2 & \text{if } \tau > \tau_{\min} \end{cases}$$

Mean delay:  $\tau_m = \tau_{\min} + 2\theta$ ; Variance in delay:  $\sigma^2 = 2\theta^2$ .

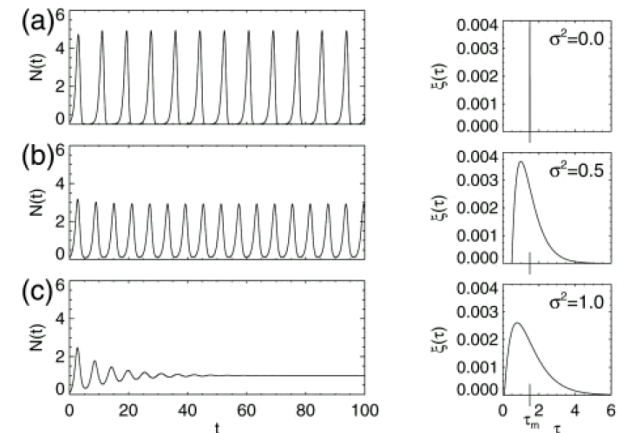
15

## Population Dynamics

- Typical model is the logistic equation (introduced earlier).
- Individual maturation time may differ, causing a spread in the delay distribution.

14

## Population Density for Different Delay Distributions



- High-amplitude oscillation is not good due to the risk of extinction during low-population periods.
- Distributed delay causes population to stabilize into a stable equilibrium.

16

## Summary and Discussions

- Increasing the spread of delay distribution has a profound effect of dynamics in biological systems.
- Why does the dynamic become simpler in this case?: smoothing, reduced variance.
- Integration interval is shorter than period of oscillation, so there's no over-smoothing.
- The observed effects are robust.

## References

Thiel, A., Schwegler, H., and Eurich, C. W. (2003). Complex dynamics is abolished in delayed recurrent systems with distributed feedback times. *Complexity*, 8:102–108.