#### **NLD SENSOR NETWORKS:**

#### **THEORETICAL STUDIES**

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# **Areas of Theoretical Work**

- Modeling and simulation of devices and systems in direct support of specific experiments underway or planned.
- Development of applicable theory.
- •Theoretical and computational exploration of generic sensor concepts.

#### This Talk Briefly Discusses Three Current Research Projects

- Adaptive Learning Network Sensor Using Chaos Sync Postdoc: Francesco Sorrentino Faculty: E. Ott
- Modeling Chaotic TWT's Student: W. S. Lee Faculty: T. M. Antonsen, J. Rodgers, and E. Ott
- Stability and Chaos in Boolean Networks Student: Andrew Pomerance Faculty: E. Ott, M. Girvan, and W. Losert

## **Adaptive Network Sync. of Chaos**

- $A_{ij}$ : Strength of j  $\rightarrow$ i link.
- $\overline{x}_i(t)$ :State of system i (e.g., a laser or TWT).
- $s_i(t) = H(\overline{x}_i(t))$ : signal broadcast by system i.
- $r_i(t) = \sum_{j \neq i} A_{ij}(t) s_j(t)$  : signal received by system i.



GOAL: Determine {A<sub>ii</sub>}

Ref: Sorrentino & Ott, PRL, 2008 & PRE (submitted)

# **Evolution of System** Chaotic system $\dot{x}_i(t) = F(\bar{x}_i(t)) + \gamma(r_i(t) - \sum_{j \neq i} \bar{A}_{ij}(t) H(\bar{x}_i(t - \tau_{ij})))$ $r_i(t) = \sum_{j \neq i} A_{ij}(t) H(\bar{x}_j(t - \tau_{ij}))$ TIME DELAYS

If  $A_{ij}(t) = A_{ij}(t)$ , then there is a synchronized solution  $\bar{x}_1(t) = \bar{x}_2(t) = \dots = \bar{x}_N(t) = \bar{x}_s(t)$ where  $\dot{\bar{x}}_s(t) = F(\bar{x}_s(t))$ 

**Q. Is this solution stable? A. Maybe** 

## Learning the Ntk: $\underline{A}_{ij}(t) \rightarrow A_{ij}(t)$

• Define a 'potential':  $\Psi_i = \langle Y_i(t)^2 \rangle_{\nu}$ 

where 
$$\langle G(t) \rangle_{v} = \int^{t} v dt' G(t') e^{-v(t-t')}$$

• Evolution of A<sub>ij</sub>(t):

For A<sub>ii</sub>(t) evolution slow w.r.t. v<sup>-1</sup>.

 $\frac{dA_{ij}}{dt} = -\beta \frac{\partial \Psi_i}{\partial \overline{A}_{ij}} = 2\beta \left\{ c_{ij}(t) + \sum_{k \neq i} \overline{A}_{ik}(t) C_{ijk}(t) \right\}$  $< s_i(t - \tau_{ij}) r_i(t) >_{\nu} < s_i(t - \tau_{ij}) s_i(t - \tau_{ik}) >_{\nu}$ 

#### **Preliminary Numerical Test**

- Rössler system:  $\dot{\overline{x}}(t) = F(\overline{x}(t))$  (uncoupled)
- 4 node network, 12 links

•Links: 
$$A_{ij}(t) = [1 + \varepsilon_{ij} \sin(\omega_{ij}t + \phi_{ij})]$$
  
•Error:  $E_A(t) = (\#links)^{-1} \sum_{links} |A_{ij}(t) - \overline{A}_{ij}(t)|$ 



#### **Modeling Chaotic TWTs**



Previous model (normalized) Linear part:  $y(t) = \hat{H}[kO(t-\tau)]; H(s) = G \frac{\Delta}{s+\Delta}$  (Low-pass)

NL part: 
$$O(t) = y(t) \frac{\exp(i\eta |y(t)|^2)}{1 + |y(t)|^2}$$
<sup>8</sup>



•Linear:  

$$H(s) = G \frac{a}{s^{2} + bs + c}$$
•NL description of phase shift:  

$$\eta |y(t)|^{2} \rightarrow \frac{\eta |y(t)|^{2}}{1 + d |y(t)|^{2}}$$

•Fitting of parameters to experiments gives good description of device.

## **Current and Future Work**

- •Current: Modeling experiments on synchronization of two coupled TWT chaotic oscillators.
- •Future: Use model to simulate coupled systems of several chaotic oscillators acting in a sensor network.
- •Talk on experiments by John Rodgers.
- Poster presentation by Wai-Shing Lee (advised by E. Ott, T. Antonsen and J. Rodgers) 10

## **Stability of Boolean Networks**



•State of node i at time t, S<sub>i</sub>(t)=0 or 1

•Output of node i depends on its inputs with delays:  $S_i(t)=F[S_1(t-\tau_{i1}), S_2(t-\tau_{i2}),...]$ E.g.,  $S_1(t)$  depends on  $S_2(t-\tau_{12})$  and  $S_6(t-\tau_{16})$ 

Our Motivation for looking at these systems: Sensor motivated experiments of Lathrop at UMD and of Gauthier at Duke Previous Motivation (S.A. Kaufman '69): Gene ntks

# **Stability/Robustness**

- Large networks of this type can have many attractors.
- How stable are these attractors?
- I.e., if we flip the state of a randomly chosen S<sub>i</sub> is the orbit likely to go to some far away attractor?
- Kaufman: 'Life at the edge of chaos'. Evolution prefers gene networks to be at the border of stability.



•The stability question also has implications for our exps., particularly wrt the number of attractors and robustness to perturbations.

•Stability has previously been addressed only for a rather trivial class of networks. We show how to analize stability for general networks.

•See poster by Andrew Pomerance (grad student) E. Ott, M. Girvan and <u>W. Losert</u>.