#### Outline I

#### **Cooperative Communications**

Lecture 8

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#### Today, Lecture 8

- Distributed Synchronization
  - Brief history
  - Wireless networks
  - Packet-coupling vs. pulse-coupling

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Introduction

- Local clocks at different nodes separated by (large) distances
- Synchronization: achieving and maintaining coordination among these local clock via exchange of local time information [1]
- Synchronization schemes classification by method used for
  - encoding,
  - exchange, and
  - processing

of information.

• Wireless communication in decentralized cooperative communication networks and sensor networks heavily rely on synchronization.

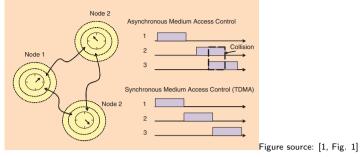
### Brief History

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- 19th century synchronization of distant clock to a reference time (unidirectional or master-slave synchronization)
  - implemented by telegraphy and later by wireless transmission
  - applications enabled
    - railroad transport
    - geodesy (meas. of longitude)
    - localization
- 20th century spontaneous synchronization in nature as role model
  - Fireflies
  - activity of muscle fibres
  - clapping in a concert hall

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#### Wireless Networks I



#### Examples:

- Distributed estimation and data fusion in sensor networks
- Multiple access schemes avoiding collisions
- Cooperative transmission
  - space time coding
  - distributed beamforming

#### Distributed Synchronization

#### Mutual synchronization in distributed wireless networks

- Problems:
  - Random delays between transmission and reception of a timing signal
    - wave propagation
    - processing latency
  - Hardware and clock inaccuracies
- Specific aspects of wireless networks
  - Energy efficiency
  - Scalabillity
  - Application specifity

### Wireless Networks II

Classic synchronization methods:

- Central access point broadcast beacon timing signal (GSM, UMTS, IEEE 802.15.4 ZigBee)
- Satellite-synchronization (oudoor)

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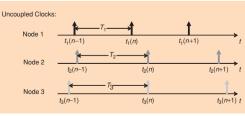
#### Basics I

#### Definitions

- t<sub>i</sub>(n)... nth tick (n = 0, 1, 2, ...) of the *i*th clock (i = 1, 2, ..., N) where N is the number of nodes
- Local periods  $T_i = t_i(n) t_i(n-1)$

#### Uncoupled nodes

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No local timing information is exchanged, local periods  $T_i$  and phases  $t_i(n)$  differ.

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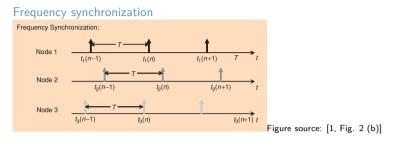
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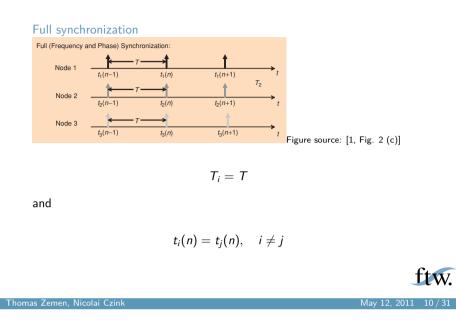
Figure source: [1, Fig. 2 (a)]

Basics II



 $T_i = T$ 

#### Basics III



### Packet Coupling vs. Pulse Coupling I

#### Packet Coupling

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- Periodic exchange of packets carrying time stamps containing the local time t<sub>i</sub>(n) at the sender (point-to-point or broadcast)
- Source of errors through random delays  $q_{ii}$ 
  - packet construction
  - ${\scriptstyle \bullet }$  queuing at the MAC
  - propagation
  - processing at receiver side
- Node *i* receives timing packet from node *j* at time  $t_i(n) + q_{ij}$
- Accuracy in the order of milliseconds to microseconds can be achieved
- Large number of packets must be exchanged limited scalability

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Pulse CouplingLocal time information is encoded in the transmission times of given

Packet Coupling vs. Pulse Coupling II

- waveforms g(t)
- Each nodes radiates a periodic train of waveforms

$$\sum_n g(t-t_i(n))$$

according to its local clock.

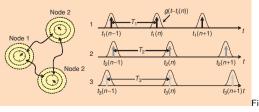


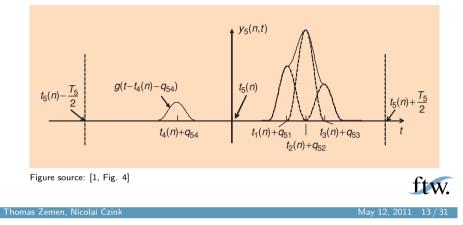
Figure source: [1, Fig. 3]

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#### Packet Coupling vs. Pulse Coupling III

- Update of local clocks by processing received signal
- Better scalability since signalling is independent of N
- Half-duplex constraint requires special attention (cannot receive while sending)



#### Uncoupled Clocks II

#### Discrete-time clock

$$t_i(n) = t_i(0) + nT_i + \nu(n)$$

modeled as sequence  $t_i(n)$  of significant time instants of an analog clock (e.g. upward zero crossing points,  $\phi_i(t_i(n)) = n \cdot 2\pi$ ) with  $n \in \{0, 1, 2, ...\}$ .

 $\nu(n)$  additive phase noise term

#### Uncoupled Clocks I

• Analog clock oscillator

 $s_i(t) = \cos \phi_i(t)$ 

where  $\phi_i(t)$  is the total instantaneous phase evolving as

 $\phi_i(t) = \phi_i(0) + \frac{2\pi}{T_i} + \zeta_i(t)$ 

 $T_{i} = T_{nom} + \Delta T_{i} \quad \dots \text{ free running oscillator period}$   $T_{nom} \dots \text{ nominal period}$   $\Delta T_{i} \dots \text{ random offset (frequency offset, skew)}$   $\zeta_{i}(t) \dots \text{ phase noise (modeled as random process)}$ 

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#### **Coupled Clocks**

#### Analog clocks

• Frequency synchronisity: for *t* sufficient large, there exists a common period of oscillation *T* for all nodes

$$\phi_i(t) = \phi_i(t+T), i = 1, 2, \ldots, N.$$

• Full (frequency and phase) synchronicity: for t sufficiently large

$$\phi_i(t) = \phi_j(t) \quad \forall \quad i \neq j$$

- Digital clocks
  - Frequency synchronisity: for n sufficiently large

$$t_i(n+1) - t_i(n) = T, i = 1, ..., N.$$

• Full (frequency and phase) synchronicity: for *n* sufficiently large

$$t_i(n) = t_j(n) \quad \forall \quad i \neq j \,.$$



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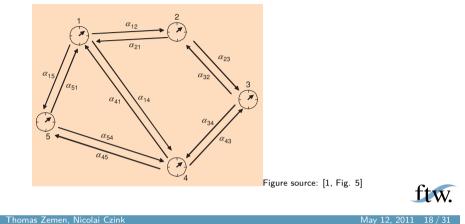
#### **Diffusion Protocols**

#### Basic mechanism

- each node transmits (diffuses) its local time (either phase φ<sub>j</sub>(t) or clock tick t<sub>i</sub>(n)) to its neighboring nodes
- discrete timing  $t_i(n)$  information encoded either as
  - time stamp in a packet (packet coupling)
  - transmission time of a given waveform (pulse coupling)  $g(t t_j(n))$

#### Connectivity Graph I

- Topology of connections between clocks ic crucial for achieving a synchronized state.
- Connectivity graph G for N = 5



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#### Connectivity Graph II

• Edge weight  $\alpha_{ij}$  represents relative signal strength received by *i* from *j* with respect to the other neighbors of *i*,

$$\sum_{j} lpha_{ij} = 1$$
 .

• Typical choice

$$\alpha_{ij} = \frac{P_{ij}}{\sum_{j \in \mathcal{I}_i} P_{ij}}$$

where

 $P_{ij}$  ... power received by node *i* from node *j* 

$$\mathcal{I}_i \dots$$
 set of neighbors of  $i$ ,  $\mathcal{I}_i = \{j : P_{ij} > P_0\}$ 

 $P_0 \ldots$  power threshold

#### Connectivity Graph III

- Diffusion synchronization protocols described by linear dynamic systems
- $\bullet$  System matrix  ${\pmb L}$  is linearly related to connectivity graph  ${\mathcal G}$
- Laplacian matrix  $\boldsymbol{L}$  is key algebraic quantity describing  $\mathcal{G}$ ,

$$\boldsymbol{L} = \boldsymbol{I} - \boldsymbol{A}$$

where  $\boldsymbol{A}$  is the adjacency matrix of the graph

$$[\mathbf{A}]_{ij} = \alpha_{ij} \quad \text{for} \quad i \neq j$$

[**A**]<sub>*ii*</sub> = 0

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#### Connectivity Graph IV

- Performance of mutual synchronization depends on the network topoplogy through the eigenstructure of the Laplacian matrix L
- The directed and weighted graph G = (V, E, A) with N vertices V and edges E ⊆ V × V
- Laplacian matrix  $\boldsymbol{L} = \boldsymbol{I} \boldsymbol{A}$  has the following properties:
  - existence of a zero eigenvalue,  $\lambda_1(\boldsymbol{L}) = 0$
  - all the eigenvalues  $\lambda_k({m L})$  satisfy  $|\lambda_k({m L})-1|\leq 1$
  - if weights are symmetric,  $\alpha_{ij} = \alpha_{ji}$ , matrix  $\boldsymbol{L}$  is symmetric and positive semidefinite so that  $\lambda_k(\boldsymbol{L})$  are real and satisfy  $0 \le \lambda_k(\boldsymbol{L}) \le 2$ .

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#### Continuously Coupled Analog Clocks I

- Applications
  - Cooperative Beamforming
  - FDMA in ad-hoc networks
- Historically the first model studied
- Each node transmits a signal proportional to its local oscillator  $s_i(t)$  and updates the instantaneous phase  $\phi_i(t)$  based on the received signal from the other nodes (full duplex is assumed).
- $\bullet~\mbox{Basic mechanism} \to \mbox{phase locking}$
- Each node measures through its phase detector (PD) the convex combination of phase differences

$$\Delta\phi_i(t) = \sum_{j=1, j \neq i}^N \alpha_{ij} f(\phi_j(t) - \phi_i(t)) \tag{1}$$

where  $f(\cdot)$  is a nonlinear function of the PD.

Continuously Coupled Analog Clocks II

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Connectivity Graph V

Conditions for mutual synchronization

• Pulse-coupled:  $|\lambda_k(\mathbf{L})| > 0$  for  $k \neq 1$ 

"smallest" eigenvalue (see two cases above)

pair of nodes, multiplicity of  $\lambda_1(\mathbf{L}) = 0$  is one.

## • Convex combination in (1) ensures that $\Delta \phi_i(t)$ takes values between

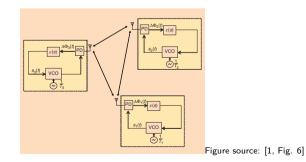
the minimum and maximum of phase differences  $f(\phi_i(t) - \phi_i(t))$ .

• Continuously coupled first order PLL:  $\Re \{\lambda_k(\boldsymbol{L})\} > 0$  for  $k \neq 1$ .

• Exponential rate of convergence of synchronization depends on the

• If graph is strongly connected, i.e. there exists a path between any

 Δφ<sub>i</sub>(t) is fed to a loop filter ε(s) whose output drives a voltage controlled oscillator (VCO)





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#### Continuously Coupled Analog Clocks III

• VCO update the local phase as

$$\dot{\phi}_i(t) = rac{2\pi}{T_i} + \epsilon_0 \sum_{j=1, j \neq i}^N lpha_{ij} f(\phi_j(t) - \phi_i(t))$$

- where a simple loop filter  $\epsilon(s) = \epsilon_0$  was assumed.
- Note that we assumed the following simplifications:
  - no phase noise
  - instantaneous coupling among clocks (nor propagation delay)
  - time invariant network topology

#### Kuramoto's Model

- First model of coupled analog oscillators was proposed by Kuramoto
  - all-to-all connectivity (not directely applicable to wireless networks)
  - sinusoidal phase detector f(x) = sin(x)
  - simple loop filter  $\epsilon(s) = \epsilon_0$  (first order PLL)
- Critical value  $\epsilon_0>\epsilon_0^*$  for loop gain  $\rightarrow$  state of partial frequency synchronization
  - part of the oscillators is in phase
  - and part is out of synchrony
  - full synchronization is eventually achieved for  $\epsilon_0 \rightarrow \infty$ .
- For  $\epsilon_0 < \epsilon_0^*$  the clocks remain in an incoherent state

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#### Continously Coupled Linear PLL

- Linear phase detectors f(x) = x
- Arbitrary connections α<sub>ij</sub>
- Loop filter
  - first order PLL  $\epsilon(s) = \epsilon_0$
  - second order PLL  $\epsilon(s) = \frac{\epsilon_0}{1-\frac{s}{2}}$
- Vector linear time-invariant differential equation

$$\dot{\phi}(t) = \omega - \epsilon_0 \boldsymbol{L} \phi(t)$$

where 
$$\phi(t) = \left[\phi_1(t), \dots, \phi_N(t)\right]^\mathsf{T}$$
 and  $\boldsymbol{\omega} = \left[2\pi/T_1, \dots, 2\pi/T_N\right]^\mathsf{T}$ .

• Steady state frequency synchronization

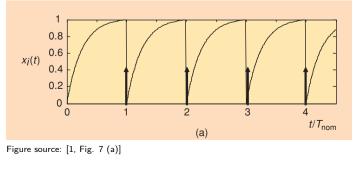
$$\frac{1}{T} = \sum_{i=1}^{N} v_i \frac{1}{T_i}$$

where  $\boldsymbol{v} = [v_1, \dots, v_N]^T$  is the normalized eigenvalue of  $\boldsymbol{L}$  corresponding to the zero eigenvalue  $\boldsymbol{L}^T \boldsymbol{v} = \boldsymbol{0}$ .

• Generally phase synchronization is not attained!

#### Pulse-Coupled Discrete Time Clocks I

- Two approaches
  - integrate-and-fire oscillators
  - distributed discrete time PLLs
- Integrate-and-fire
  - $\bullet\,$  for analysis no frequency mismatch is assumed first  $\,{\cal T}_i={\cal T}_{\rm nom}\,$



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#### Pulse-Coupled Discrete Time Clocks II

- Oscillator described by state variable x<sub>i</sub>(t) = g(φ<sub>i</sub>(t)) where g(·) is a periodic function with period 2π, smooth, concave and monotonically increasing from zero to one.
- Clock ticks  $t_i(n)$  correspond to time instants when variable reaches  $x_i(t_i(n)) = 1$  and returns to zero.
- Upon detection of the pulse sent by any node j at time t<sub>j</sub>(n) the ith clock adds e to its state variable moving its firing instant closer to that of clock j,

$$egin{aligned} x_i(t_j(n)^+) = egin{cases} x_i(t_j(n)^-) + \epsilon & ext{if } x_i(t_j(n)^-) + \epsilon < 1 \ 0 & ext{otherwise} \end{aligned}$$

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References I

 O. Simeone, U. S. andd Yeheskel Bar-Ness, and S. H. Strogatz, "Distributed synchronization in wireless networks," *IEEE Signal Process. Mag.*, pp. 81–97, September 2008.

#### Pulse-Coupled Discrete Time Clocks III

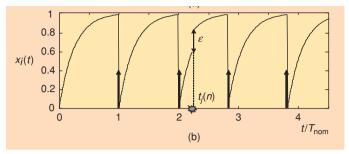


Figure source: [1, Fig. 7 (b)]

• Lyapunov stability theory shows that Laplacian *L* determins stability similarly to the case of analog oscillators.

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