# Clock Composition by Wiener filtering Illustrated on Two Atomic Clocks

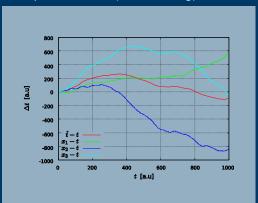
Marek Peca

Serenum, a.s.

24 July 2013, European Frequency and Time Forum, Praha

## Clock ensembling Introduction

▶ What is composite clock (ensembling)?



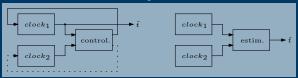
compute "best" time given N noisy & drifting clock readings

## Clock ensembling

Feedback vs. estimation

#### Two distinct approaches to clock ensembling:

- feedback control
  - corrected time is fed back into controller
  - ▶ e.g.: PLLs, FLLs,...
- estimation only
  - corrected time does not go back into the estimator



- due to separation principle:
  - $ightharpoonup \sigma_{control} \geq \sigma_{estimation}$
  - → estimation is better than control
    - (where applicable; e.g.: NTP, ACES)

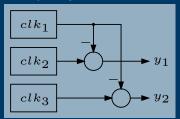
#### Clock model

- linear clock model assumed
  - ▶ 1/f-noise is not linear (chaos or  $\infty$  order)  $\Rightarrow$  approximation
- equivalent descriptions
  - ▶ phase spectrum  $S_{xx}(f)$
  - ▶ state-space model  $\mathbf{x}(t+1) = \Phi \mathbf{x}(t) + \mathbf{u}(t)$
  - ▶ transfer function G(z)
- ► MISO → SISO conversion by spectral factorization (spf(·))

#### Ensemble measurement

... and implied difficulty

- only time differences can be measured
  - ► *N* clocks means *N* 1 readings
  - measurement matrix is singular
  - system not completely observable

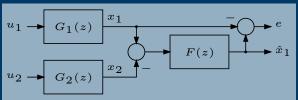


▶ non-observable system & all clocks drift ⇒ unbounded output error (ensemble drifts, too)

#### Linear estimator

Kalman & Wiener filters

- MSE optimal for linear system
- ► Kalman filter (KF) can handle time-varying process
- Wiener filter (WF) ≡ to KF for time-invariant
  - especially simple & insightful in SISO case (N = 2 clocks)



- $\blacktriangleright \ G_1 \leftrightarrow G_2 \Rightarrow F'(z) = 1 F(z)$
- ▶ measurement noise may be incorporated into G<sub>2</sub>

#### Wiener filter

- 3 variants
  - ► non-causal  $F_{nc}(z) = \frac{S_{xy}}{S_{wv}} = \frac{B_1^* B_1}{C^* C}$
  - rightarrow causal  $F(z) = [S_{xy}W^*]_+W = \left[\frac{B_1^*B_1}{AC^*}\right]_+\frac{A}{C}$
  - finite-lag  $F_T(z) = z^T [z^{-T} S_{xy} W^*]_+ W$
- ▶ design = 2 operations
  - $C = \text{spf}(B_1^*B_1 + B_2^*B_2)$  (root finding)
  - ► [·]<sub>+</sub> (system of linear equations)

## Design procedure

Clock-specific problems

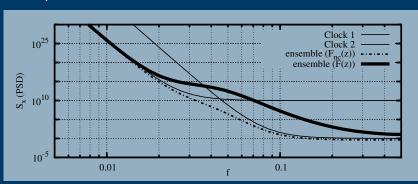
- ► marginally stable factors  $A(z) = (z 1)^m \tilde{A}(z)$ 
  - treat as  $A(z) = (z (1 \epsilon))^m \tilde{A}(z)$
  - lacktriangleright  $\epsilon$  is only a notion to help splitting causal/non-causal
- huge frequency range
  - ▶ hard to perform spf(·)
  - solution: root-finding in arbitrary precision math

#### Non-causal WF

- best MSE of all
- ▶ needs to know future  $y(t+1)...y(\infty)$
- ightharpoonup = average weighted by  $1/S_{11}$ ,  $1/S_{22}$
- ▶  $G_1 \propto G_2 \Rightarrow$  static weighted average

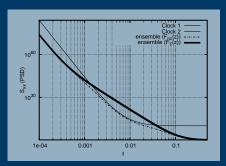
### Causal WF

#### Example #1 – causal vs. non-causal



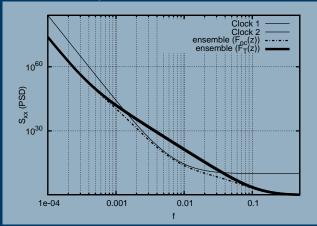
#### Causal WF

Example #2 - causal vs. non-causal

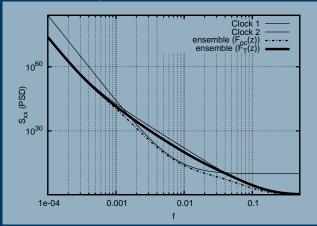


▶ F(z) almost completely discards  $x_2(t)$  ⇒ ensemble almost reduced to  $clock_1$ 

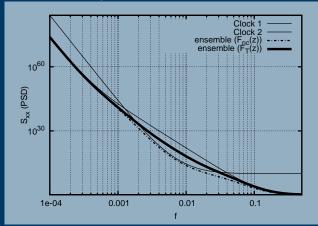
#### Example #2 – finite-lag WF, $T = 1 T_s$



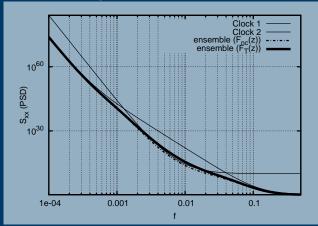
#### Example #2 – finite-lag WF, $T = 30 T_s$



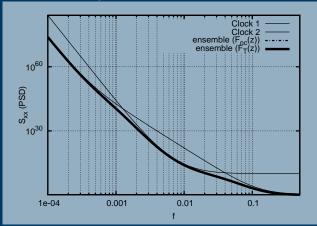
#### Example #2 – finite-lag WF, $T = 70 T_s$



#### Example #2 – finite-lag WF, $T = 150 T_s$



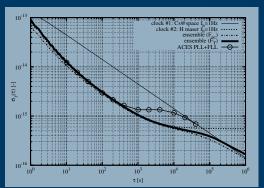
#### Example #2 – finite-lag WF, $T = 300 T_s$



## WF performance on real example

Atomic Clock Ensemble in Space

#### Example #3 – Atomic Clock Ensemble in Space (ACES) model



- current solution based on PLL & FLL
- finite-lag WF is better & substantially simpler

#### Conclusion

- given optimal linear estimator for stationary ensemble
- $ightharpoonup F_T(z)$  may be significant improvement over F(z)
- do not feedback, estimate wherever possible
- ▶ save raw data allow multiple different  $F_T(z)$
- outlook
  - ▶ unify with KF approach, generalize for N > 2