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### Robustness Metrics For Time-Dependent Quality Characteristics

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# Outline

- Quality loss function
- Time-dependent quality loss function
- Robustness metrics
- Example



USL

V

Target

m

LSL

# **Quality Loss Function**

Constant

- Nominal-the-best type performance Y
- Quality loss  $L = A(Y m)^2_{L^{(s)}}$
- Robustness metric
  - Expected L

$$E_L = A[(\mu_Y - m)^2 + \sigma_Y^2]$$

 $\min E_L \Rightarrow \mu_Y \to m \text{ and } \min\{\sigma_Y\}$ 

Traditional robust design: Y is time invariant, and so is  $L_{1}$ .

### Reality: Time-Dependent Performances Y=g(X(t),t) with input X(t)



#### Hydrokinetic turbine



20

40

60

80

100

120





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# Challenge: We have stochastic processes now

- Input
  - $\mathbf{X}(t)$
- Performance:  $Y(t) = g[\mathbf{X}(t), t]$
- Quality loss

$$L(t) = A(t)[Y(t) - m(t)]^2$$



# Why Is It a Challenge?

- Over  $[t_0, t_f]$ , for a stochastic process, we need to know
  - its instantaneous distributions at any t
  - its auto-dependence of any pair  $t_1$  and  $t_2$
- Example: two Gaussian processes
  - same instantaneous distributions (standard normal)
  - different auto correlation coefficients  $\rho=0.999$  (red) and  $\rho=0.01$  (weak).
- Both processes behave totally differently.



• Point expected QLF  $E_L(t) = A(t)[(\mu_Y(t) - m(t))^2 + \sigma_Y^2(t)]$  is not a good metric.



# **Quality Loss Process**



7



# Interval Quality Loss Function

- QL is irreversible L(t) once it occurred; L(t<sub>0</sub>, there is no way to go back.
- Over [t<sub>0</sub>, t<sub>f</sub>], QL is the maximal instantaneous QL.



$$L(t_0, t_f) = \max_{\tau} A(\tau) [Y(\tau) - m(\tau)]^2 , t_0 \le \tau \le t_f$$



New Metrics  $E_L(t_0, t_f)$ 

- True quality loss
- Can account for auto-dependence of L(t)

Two L(t) processes

- Same distributions at t
- Different autocorrelation coefficients

Result in

- Same P-QLF at t
- Different I-QLF over  $[t_0, t_f]$ .





## Example

Required motion (time  $t = \theta [0^{\circ}, 120^{\circ}]$ )

 $\psi_d(\theta) = \psi_0 + 50^{\circ} \sin\left[\frac{3}{4}(\theta + \theta_0)\right]$ 

QC – motion error

$$Y(\mathbf{X},\theta) = \psi(\mathbf{X},\theta) + \psi_0 - \psi_d(\theta)$$

$$\mathbf{X} = (R_1, R_2, R_3, R_4)^T$$

Traditional P-QLF	New I-QLD	
$L(\theta) = A[Y(\theta)]^2$	$L(0^\circ, 120^\circ) = A \max\{L(\theta)\}$	
0°≤ <i>θ</i> ≤120°	0°≤ <i>θ</i> ≤120°	
Min $\sum_{i=1 \text{ to } N} E_L(\theta_i)/N$	Min E <sub>L</sub> (0°,120°)	
s.t. constraints	s.t. constraints	

Design variables  $(\mu_2,\mu_3,\mu_4, heta_0,\psi_0)$ 



### Results

Method	P-QLF	I-QLF
$\mu_{R_2}(\text{mm})$	48.14	43.08
$\mu_{R_3}(\text{mm})$	100.48	103.57
$\mu_{R_4}$ (mm)	74.13	66.51
$\theta_0$ (deg)	100.46	97.15
$\psi_0 (\text{deg})$	99.01	93.89
Average expected I-QLF $\overline{L}_{E}(\theta)$ (\$)	21.60	24.76
Maximal expected I-QLF max $L_E(\theta)$ (\$)	70.0	28.33
Expected I-QLF $L_E(0^\circ, 120^\circ)$ (\$)	84.21	43.87

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Ave. motion error: The new is better than the traditional.



How does auto correlation look like?

 Between 0° and θ (0°≤θ≤120°)



# Conclusions

- Static robustness metrics are not good for time-dependent problems.
- New metrics should account for auto dependence of time-dependent performances.
- The proposed metric is the only one of many possible metrics.