# Manufacturing and uncertainty

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#### Goal

Select processing parameters to achieve the desired outcome for the manufactured product (properties, dimensions, function...)

#### Obstacles

- Requires input-output relationship between parameters and outcome
- Inputs are not perfectly known
- Input-output relationship includes approximations and omissions
- Outputs cannot be perfectly measured [1, 2]

#### Situation

- Establish input-output model (materials science, physics, chemistry...)
- Predict output(s) given input(s)
- Incorporate uncertainty

Consider machining as an example manufacturing operation.

- 1. ISO, 1993, Guide to the Expression of Uncertainty in Measurement, International Organization for Standardization, Geneva, Switzerland
- 2. Barry N. Taylor and Chris E. Kuyatt, 2001, Guidelines for Evaluating and Expressing the Uncertainty of NIST Measurement Results, http://physics.nist.gov/TN1297, National Institute of Standards and Technology, Gaithersburg, MD.

## Machining background



## Machining background





feedback

**Regeneration** is a primary mechanism for chatter

• force depends on chip thickness

 chip thickness depends on current vibration and previous pass

• current vibration depends on force



Chip thickness is nearly constant – small force variation  $\rightarrow$  stable

# Chatter – self-excited vibration that occurs in machining (large forces, poor finish)

## Machining background

Stable and unstable (chatter) milling examples



#### Stable:

Forced vibration Repeats with each tooth passage Tooth passing frequency and multiples



#### <u>Chatter:</u> Self-excited vibration Does not repeat each tooth passage Natural frequency of structure

Forced vibration during stable cutting can lead to **surface location error** 

- vibration state of tool when leaving surface defines location
- magnitude and phase of vibration is frequency dependent (tooth passing frequency or spindle speed).





System dynamics are described by a set of **second order time-delay differential equations**.

$$m_x \ddot{x}(t) + c_x \dot{x}(t) + k_x x(t) = F_x(t)$$

$$m_y \ddot{y}(t) + c_y \dot{y}(t) + k_y y(t) = F_y(t)$$
Include time-

Include x and y time-delay terms.



Describe tool/workpiece mass, damping, and stiffness in x/y directions.

Closed-form solution for set of delay differential equations is not available. Solution techniques include:

- analytical approximate solution used to determine stability limit as a function of operating parameters (spindle speed, axial depth of cut)
- numerical time domain simulation.

Solve set of second order time-delay differential equations using numerical integration.

Simulation steps  

$$s = \frac{2\pi}{N_t \cdot d\phi}$$

$$h(i) = x(i-1) \sin \phi(i) - y(i-1) \cos \phi(i)$$

$$h(i) = f_t \sin \phi(i) + n(i-S) - n(i)$$

$$F_t = k_{tc}bh(i) + k_{te}b$$

$$F_n = k_{nc}bh(i) + k_{ne}b$$

$$x = \frac{1}{N_t \cdot d\phi}$$

$$d\phi$$

$$F_x(i) = F_t \cos \phi(i) + F_n \sin \phi(i)$$

$$F_y(i) = F_t \sin \phi(i) - F_n \cos \phi(i)$$

$$\ddot{x}(i) = \frac{F_x(i) - c_x \dot{x}(i-1) - k_x x(i-1)}{m_x}$$

$$\ddot{y}(i) = \frac{F_y(i) - c_y \dot{y}(i-1) - k_y y(i-1)}{m_y}$$

$$\dot{x}(i) = \dot{x}(i-1) + \ddot{x}(i) \cdot dt$$

$$\dot{y}(i) = \dot{y}(i-1) + \ddot{y}(i) \cdot dt$$

$$x(i) = x(i-1) + \dot{x}(i) \cdot dt$$

$$y(i) = y(i-1) + \dot{y}(i) \cdot dt$$

- Cutting conditions: spindle speed, radial/axial depth, feed per tooth, cutting force Simulation coefficients. inputs
  - Tool geometry: number of teeth, diameter, helix angle.
  - Tool point modal parameters: m, c, k in the x and y directions.



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For dynamic systems, a *bifurcation is a dramatic change in the system state, or behavior*.

Milling exhibits various bifurcation (instability) types.

- A powerful interrogation tool for milling dynamics is **periodic sampling at the tooth period**.
- This sampling establishes the synchronicity of the motion (response) with the cutting force (excitation).
- For stable cutting conditions, only forced vibration is present and the sampled point repeats for each tooth passage (stable).
- For unstable cutting, on the other hand, the repetition of a single point is not observed and the character of the sampled points identifies the type of instability (chatter): secondary **Hopf** or period-n **bifurcations**.

#### <u>Example</u>

- 5% radial immersion up milling
- 30000 rpm spindle speed
- 721 Hz natural frequency, 0.009 damping ratio, and 4.1×10<sup>5</sup> N/m stiffness
- cutter has one tooth, a 45 deg helix angle, and an 8 mm diameter
- aluminum alloy cutting force coefficients are: k<sub>tc</sub> = 604×10<sup>6</sup> N/m<sup>2</sup> and k<sub>nc</sub> = 223×10<sup>6</sup> N/m<sup>2</sup> (zero edge coefficients)





#### Bifurcation prediction



**Period-2 bifurcation** – once-per-tooth sampled points repeat at two distinct locations (special type of instability or chatter).

## Bifurcation prediction



**Secondary Hopf bifurcation** – once-per-tooth sampled points do not repeat.

Chatter frequency is near the system natural frequency. This incommensurate frequency yields an **elliptical distribution** of points in the Poincaré map.

Experimental setup for stability and SLE

#### Flexure dynamics

- Stiffness: 1.75×10<sup>6</sup> N/m
- Damping ratio: 1.36%
- Natural frequency: 125.8 Hz

#### Tool dynamics

- Stiffness: 4.24×10<sup>7</sup> N/m
- Damping ratio: 9.5%
- Natural frequency: 1188 Hz



- Initial ribs machined on flexure (9.82 mm wide).
- Final pass completed with 2 mm radial depth of cut, 5 mm axial depth of cut.
- Spindle speed was varied.
- 0.35 mm/tooth
- Up milling
- Single carbide insert cutter
- 6061-T6 aluminum workpiece
- Surface location error (SLE) was measured.

#### SLE = commanded width – actual width



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Spindle speed		50 _				_
(rpm)	Behavior	<b>((</b> )		T		
3180	Period-2	dx/dt (mm/s)				-
3190	Period-2	کې -50 -				_
3200	Period-2					
3210	Period-2	-100 -200	-100	0	100	200
3270	Stable	100		x ( $\mu^{m)}$		
3300	Stable			I	I	
3330	Stable	50 _				_
3360	Stable	dx/dt (mm/s)				_
3400	Stable	•				
3500	Stable	-50 _		-		-
3600	Stable	-100 -200	-100	0	100	200

x (  $\mu^{m}$ )

		100	1	1	1	
Spindle speed		50 _				-
(rpm)	Behavior	8				
3180	Period-2	dx/dt (mm/s)				_
3190	Period-2	් -50 _				_
3200	Period-2					
3210	Period-2	-100 -200	-100	0	100	200
3270	Stable	100		x ( µm)		
3300	Stable			·	·	
3330	Stable	50 _				-
3360	Stable	dx/dt (mm/s)				-
3400	Stable	•				
3500	Stable	-50 _				-
3600	Stable	-100 -200	-100	0	100	200
		200	100	0	100	200

x (  $\mu^{m)}$ 

		100		1	
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Spindle speed		50 _			
(rpm)	Behavior	(s			
3180	Period-2	dx/dt (mm/s)	ø		
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3200	Period-2				
3210	Period-2	-100 -200	-100	0	100
3270	Stable	100		x ( $\mu^{m}$ )	
3300	Stable				
3330	Stable	50 _			
3360	Stable	dx/dt (mm/s)			
3400	Stable	-			
3500	Stable	-50 _			
3600	Stable	-100 -200	-100	0	100
		-200	-100	0	100

200

200

x (  $\mu^{m)}$ 



- Parts were measured on CMM and SLE was calculated.
- Experimental results compared to prediction.



# Opportunities



Similar opportunities available for other manufacturing operations.

Requirements:

- Process knowledge to define first-principles models (or AI?)
- Materials modeling to relate alloy composition to process behavior
- Experimental capabilities to validate models
- Propagation of input uncertainty to output uncertainty (numerical or analytical)
- Parameter selection under uncertainty (optimization)

Thank you.

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