

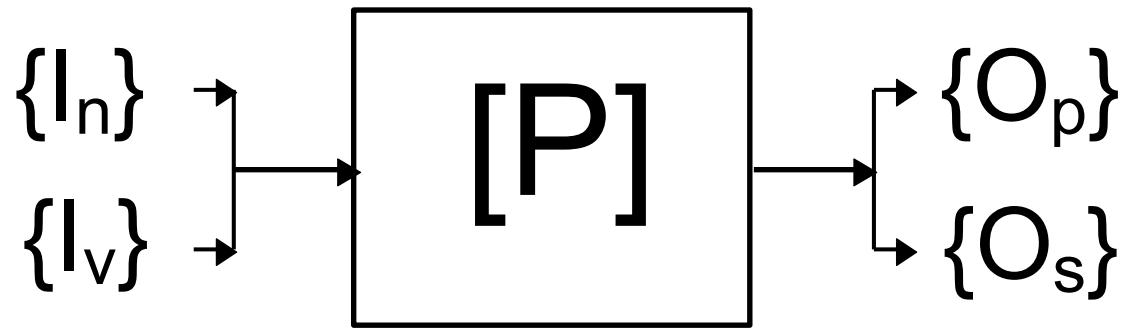
# Prediction Augmentation Through Reinforcing Interactions Amongst Modeling, Sensing and Learning

Patri K. Venuvinod  
City University of Hong Kong

At the last meeting, the Working Group opined that “we need to give a nudge or push in a specific direction to suit our engineering purposes as we perceive them in the short as well as the long term”

This paper describes and argues for some specific ‘nudges’ which the author believes would be particularly useful at this point in the history of machining research.

# The Process



$\{I_n\}$  = Nominal Input

$\{I_v\}$  = Unanticipated Input Variations

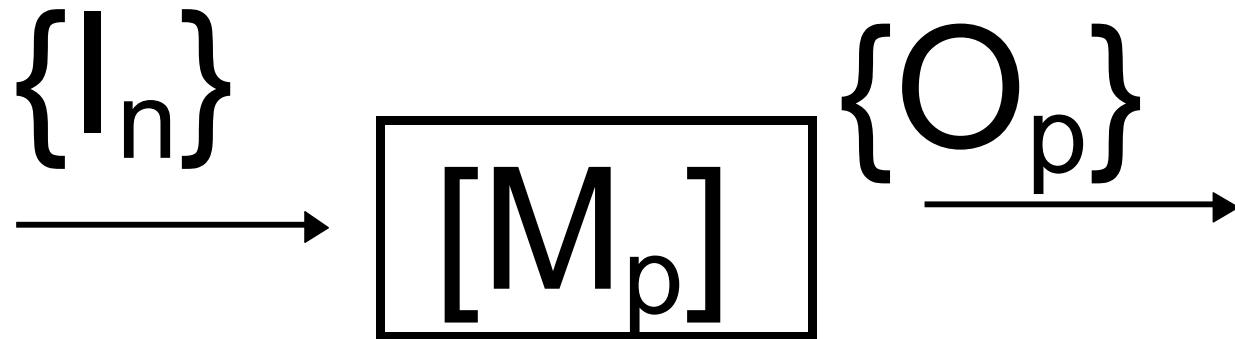
$P$  = The Process

$\{O_p\}$  = Performance Measure (Output)

$\{O_s\}$  = Output capable of being sensed

**Aim of WG:**

**Quantitatively Predict  $\{O_p\}$  from  $\{I_n\}$**



$M_p$  = The process model aimed  
at predicting  $\{O_p\}$  from given  
nominal inputs  $\{I_n\}$

News Brief: May 1997  
“Manufacturing Eng.”, SME.

“A metal cutting   modeling software called       to be released by Third Wave to be realized in 1997.

Capable of modeling *forces, temperatures, material removal rate, chip growth, chip breaking, chatter, and vibration.*”

# Modeling of Machining Operations: Literature Database

Patri K. Venuvinod

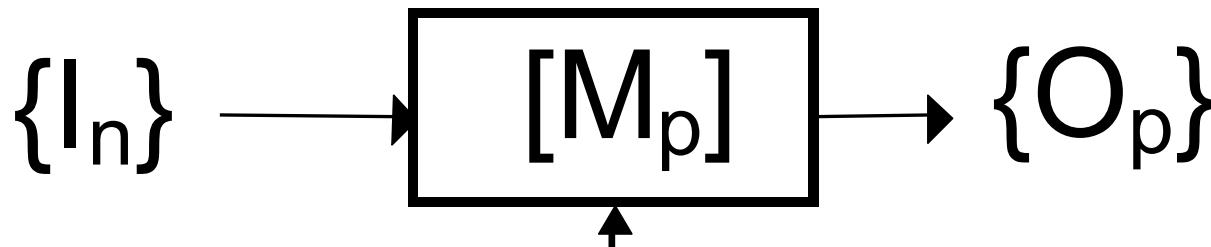
2801 articles, Labelled

Much insight into current status of  
modeling of machining operations

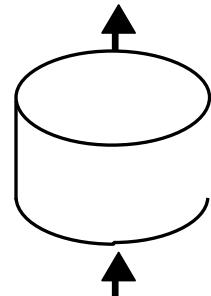
# Current Status of Modeling

- Still grappling with single edge cutting
- Still dominated by plane rake face
- Dominated by Analytical Modeling
- Some FEM recently (mostly 2D)
- Need expensive and, often, unreliable Machining Databases
- Good at qualitative prediction and developing understanding
- Quantitative prediction : Limited success

- The Current Ethos of Modeling



$\{C\}$  = Model Coefficients



MDB  
Machining  
Database

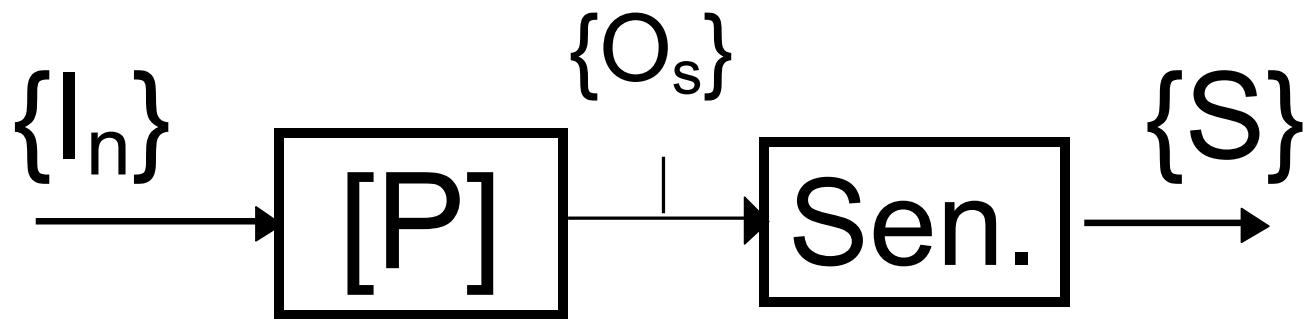
$X_{\text{off}}$ : Off-line Experiments

# Persisting Problems

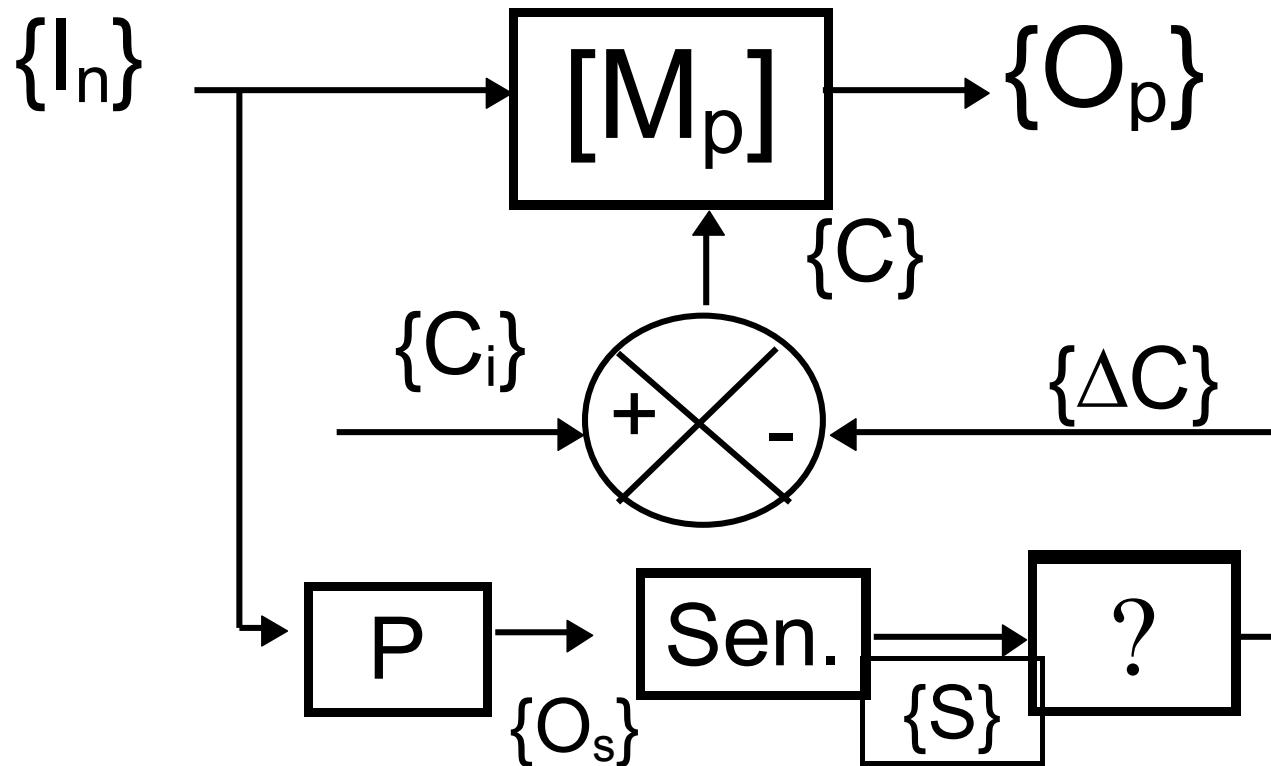
- Very few practical operations adequately modeled
- Limited success with quantitative prediction
- Models must change when chip forms change. Need to anticipate chip form change.
- Expensive and static Machining Data Base

**Can we find an alternative to MDB?**

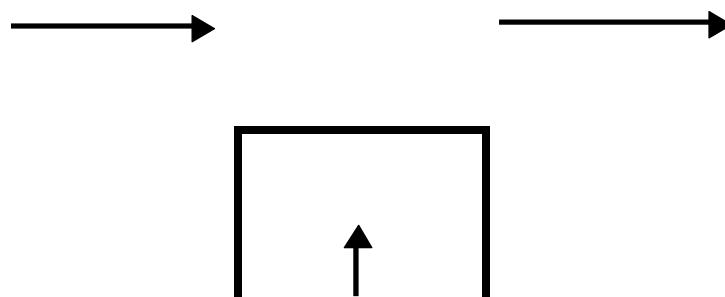
- Sensing



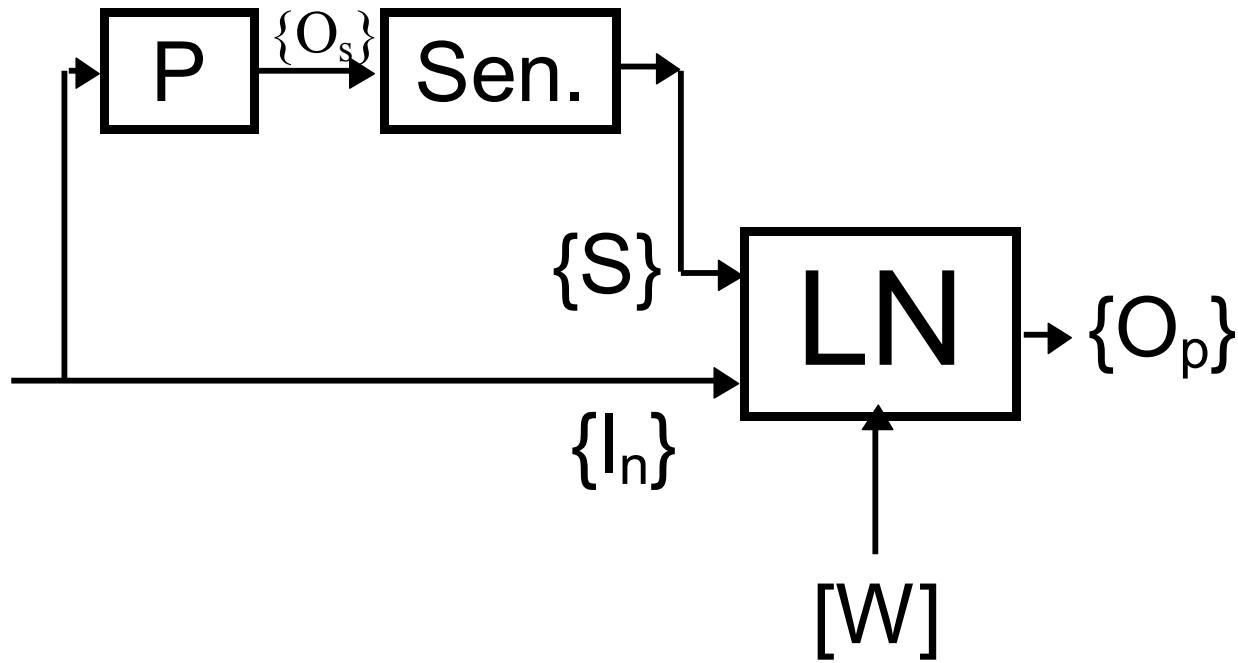
- Calibrating A Predictive Model Using Sensed Output



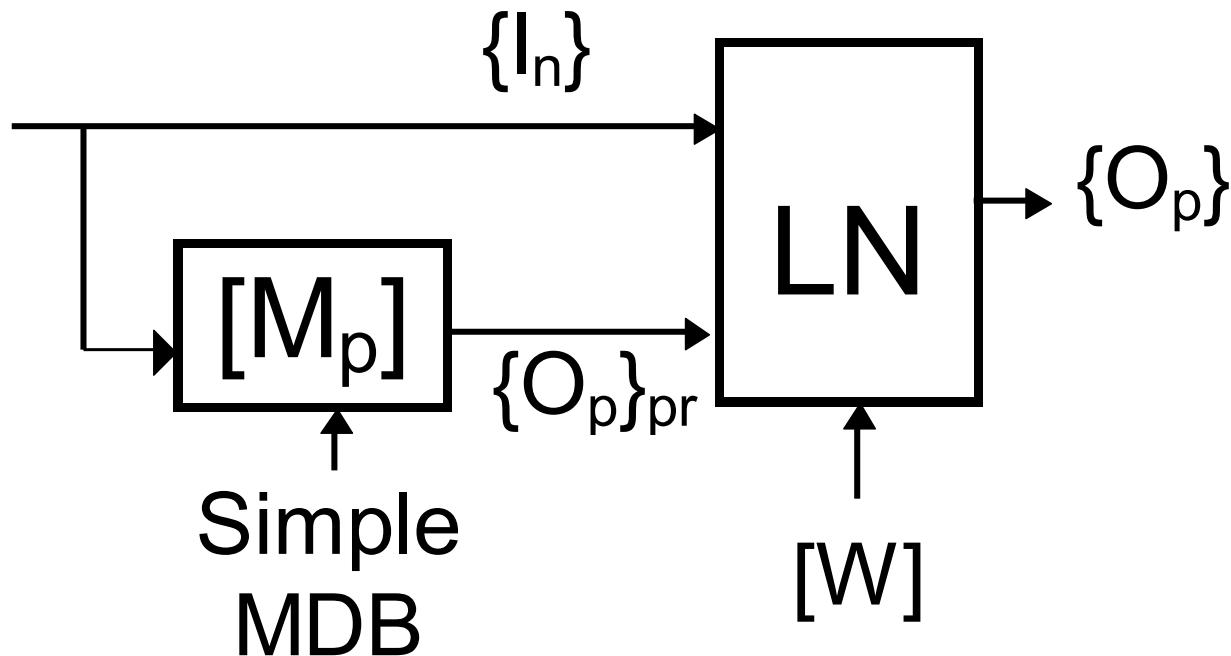
- Learning



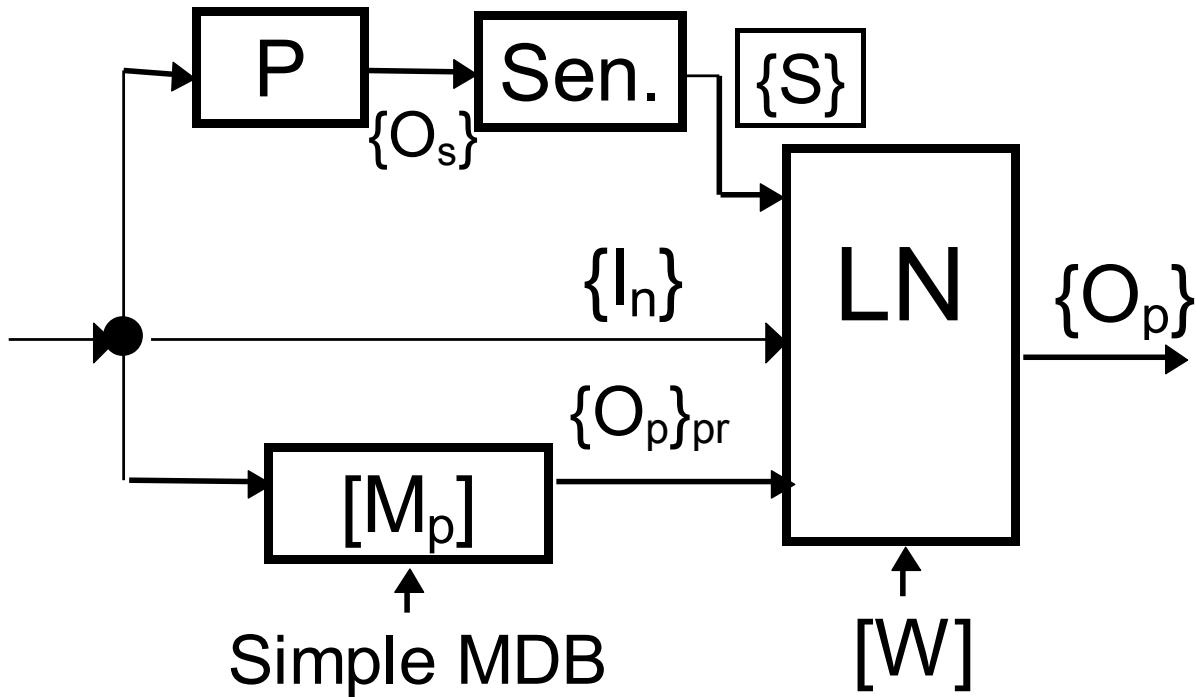
- Augmenting a Learning System  
Through  $\{O_s\}$



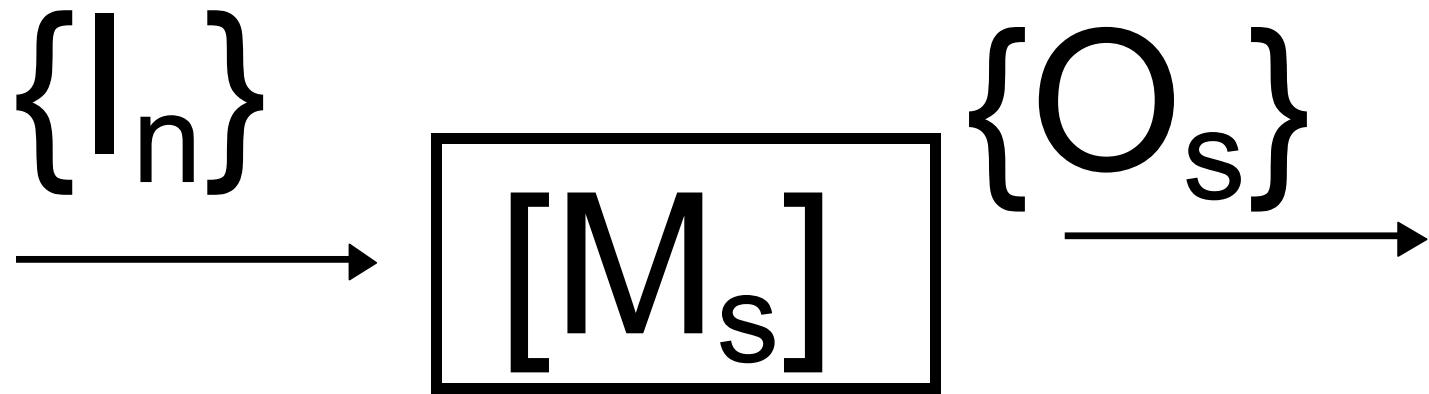
# Augmenting Learning with Modeling



# Augmenting Learning Through Modeling as well as Sensing



- A Possible Nudge



$[M_s]$  = The process model aimed at predicting  $\{O_s\}$  — unlike  $[M_p]$  which predicts  $\{O_p\}$

