



Treatment of Uncertainties in ESH Assessments - New Approaches and Data Needs

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- Background
- Proposed ESH analysis methodology
- Construction of database for ESH assessment

Key Environmental Challenges and Needs



- More quantitative environmental metrics
- Systematical evaluation approach to environmental impacts
- Database that includes important chemical properties
- *Consideration of uncertainty in the environmental evaluation*
- Rapid environmental evaluation
- Life Cycle Assessment (LCA) beyond the factory
- Dynamic simulation of the processes
- Advanced process control, sensing and metrology
- Multi-objective optimization and decision support





- Develop methodologies and metrics for *rapid economic* and environmental evaluation
- Integrate the treatment of uncertainties into decision making about alternative technologies
- Identify opportunities for creating 'win-win' situations
- Test procedures using case studies
- Collaboration with University of Maryland and UC Berkeley.

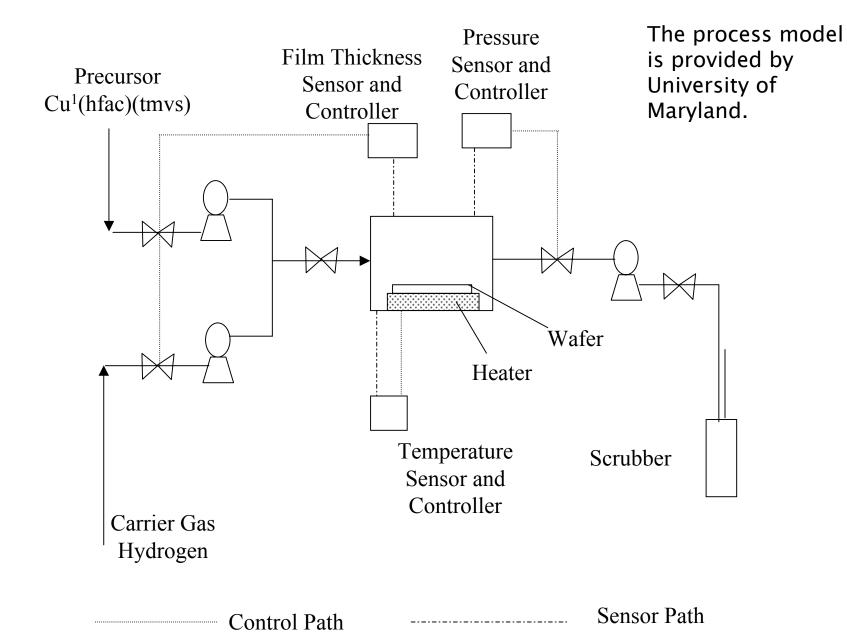




- 1. Process model
- 2. Economic evaluation of technology choice (CoO Model)
- 3. Life cycle assessment model of environmental impacts
- 4. Treatment of uncertainties





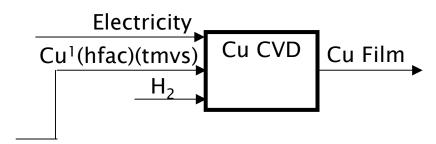




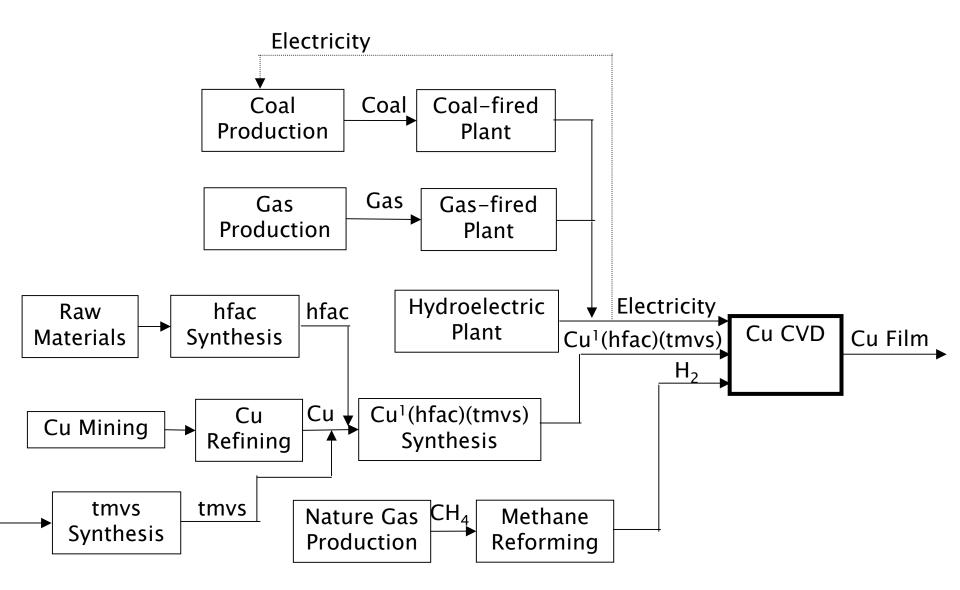


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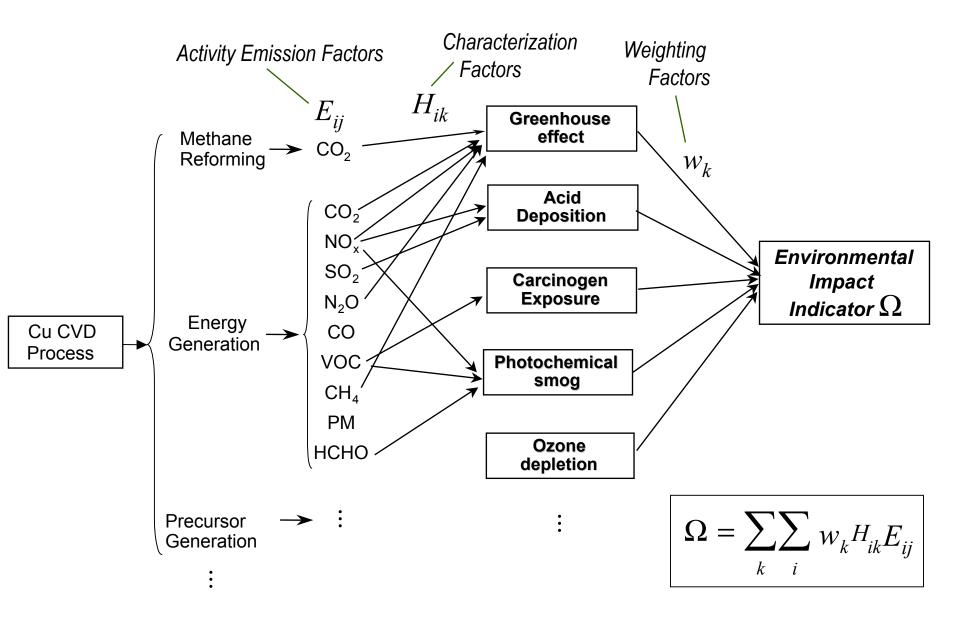






Components of an Environmental Valuation Model*



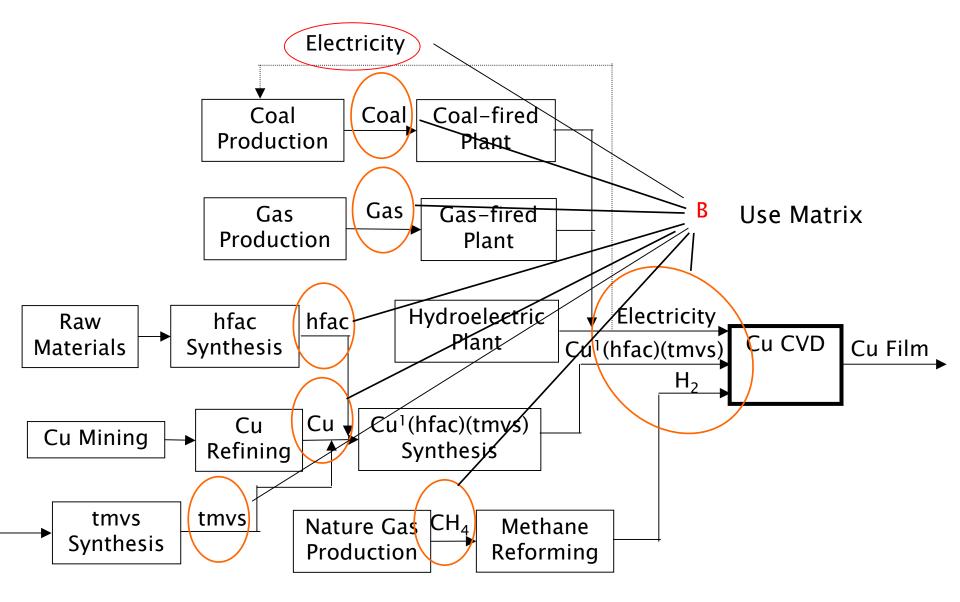


NSE/SRC ERC for Environmentally Benjan Semiconductor Manufacturing

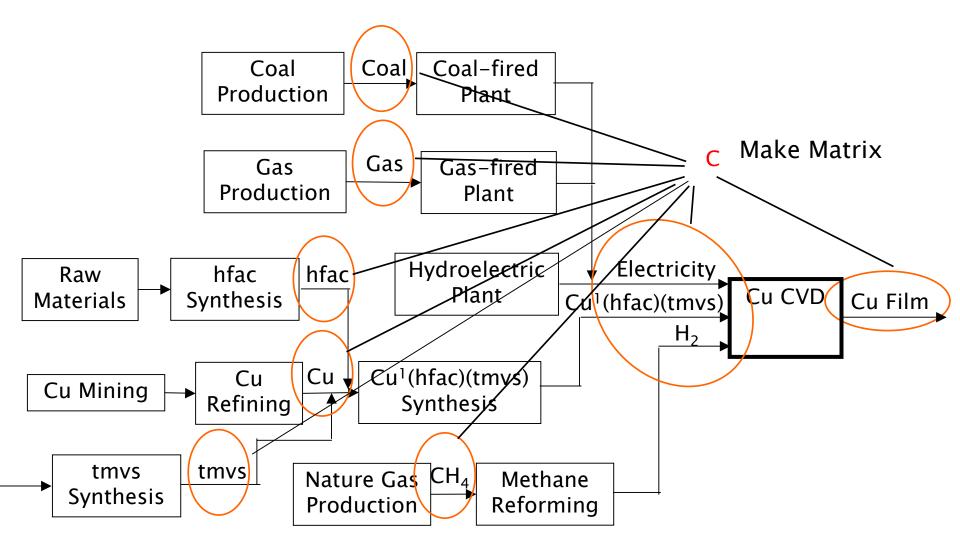
* Cano-Ruiz 2000



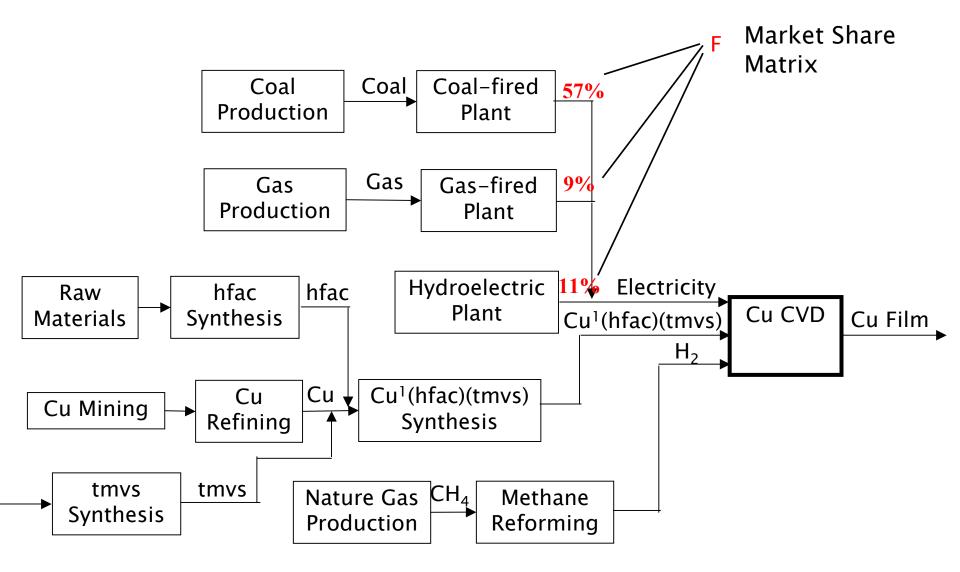




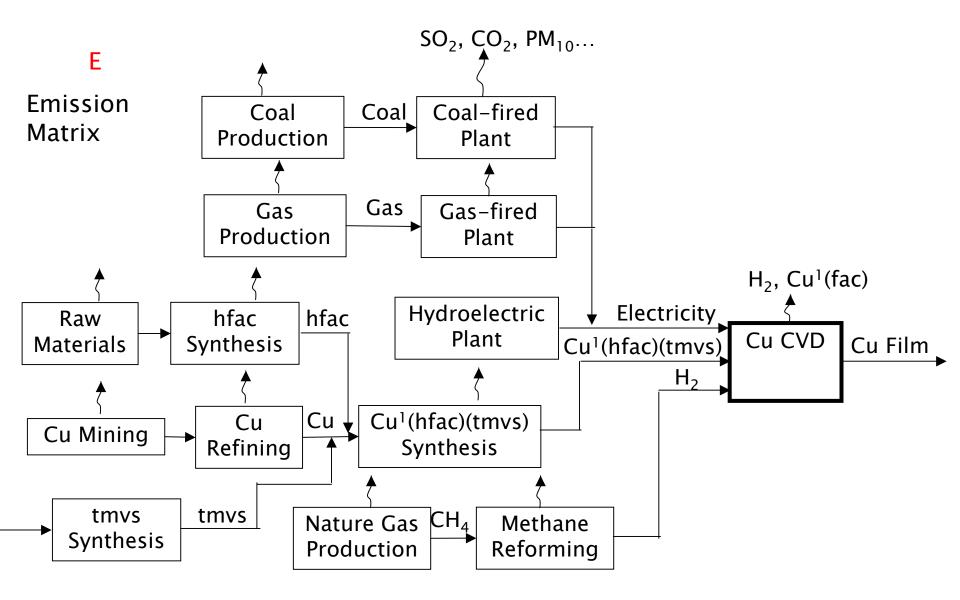






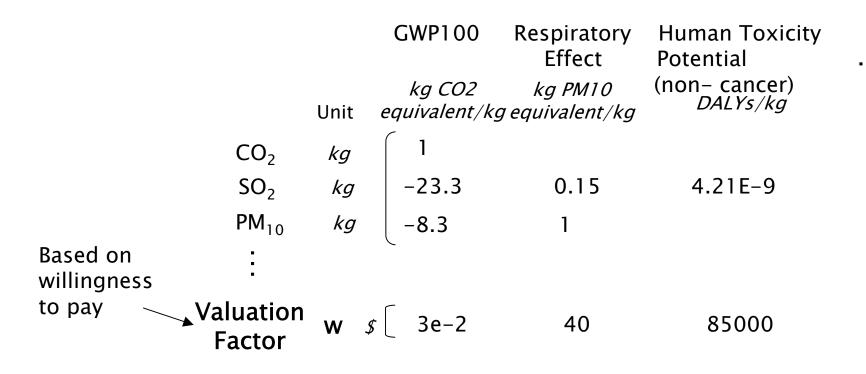






Model Input Five: Characterization Matrix (H)

• Characterization matrix (H)



Large uncertainties imbedded in the values





- Model Input Six: Price vector (p)
- Allocation matrix (G): for multiple product processes

$$G_{ji} = \begin{cases} \frac{p_i}{\sum_{k} C_{kj} p_k} & \forall C_{ij} \neq 0\\ 0 & \forall C_{ij} = 0 \end{cases}$$

G_{ji}: the amount of throughput of process j that is attributed to one unit of product i made in process j

• Throughput matrix (D)

$$\mathsf{D}_{\mathsf{j}\mathsf{i}} = \mathsf{F}_{\mathsf{j}\mathsf{i}}\mathsf{G}_{\mathsf{j}\mathsf{i}}$$

D_{ji}: the amount of throughput of process j that is attributed to the demand of one unit of product I at current price and market share

• Direct product requirement (q_{direct})

 $q_{direct} = (I + BD)d$

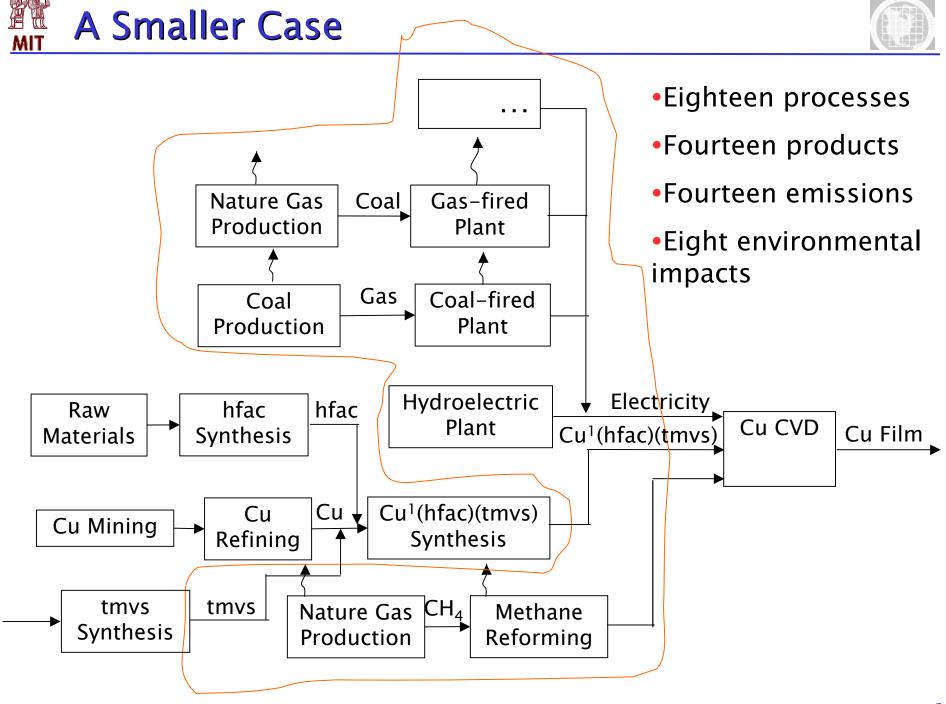
Total product requirements

 $\label{eq:q} q = (I + A_{prod} + A_{prod}A_{prod} + A_{prod}A_{prod}A_{prod} + \ldots)d = (I - A_{prod})^{-1}d$ where $A_{prod} \equiv BD$



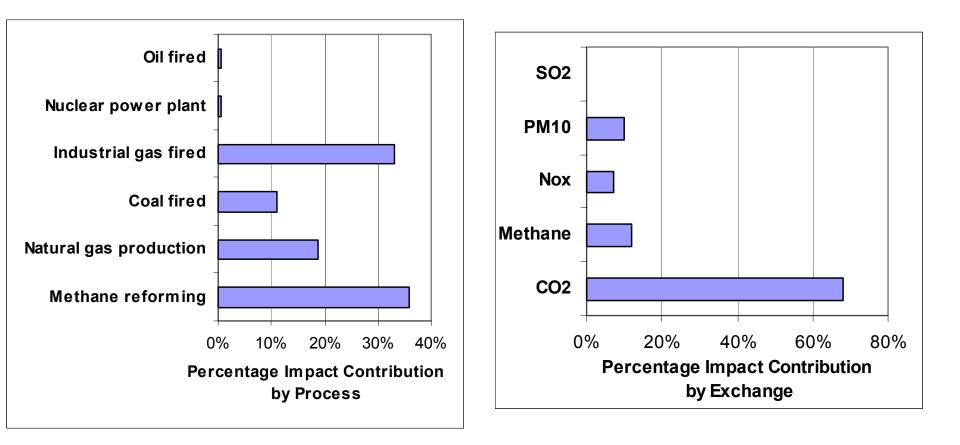


- Total process throughput requirements (x)
 x = Dq
- Life cycle environmental exchanges inventory (e)
 e = Ex
- Impact valuation by process (Ω_{process}) $\Omega_{\text{process}} = \text{Diag}(x) E^T H w$
- Impact valuation by emission ($\Omega_{emission}$) $\Omega_{emission} = Diag(e) H w$









- Large impact is also from methane reforming to produce H₂ in contrast to common perception that power generation has the dominant impact
- Changing carrier gas may reduce environmental impact

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- Production methods of hfac, tmvs, and Cu¹(hfac)(tmvs)
- ESH information of hfac, tmvs, and Cu¹(fac)





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- To better identify important parameters
- To decrease decision uncertainty in choosing alternative technologies
- Large uncertainties are imbedded in environmental evaluation

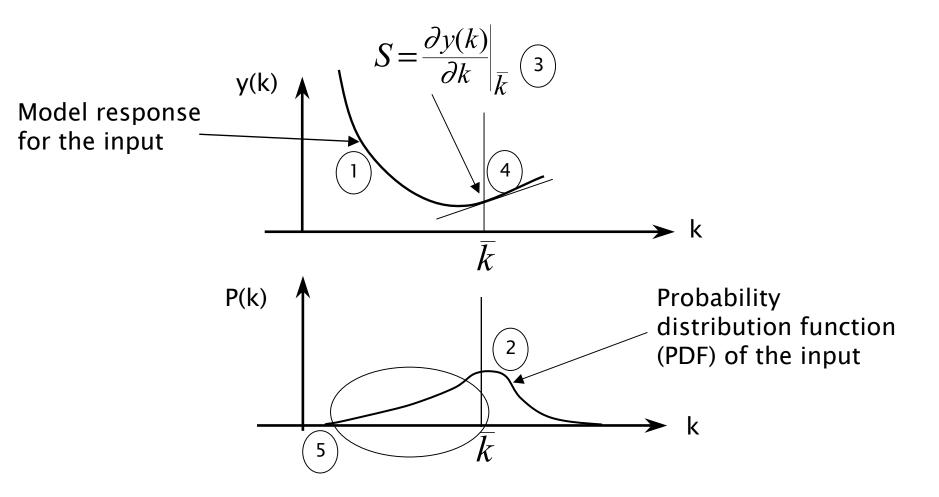
Example: ~1 order of magnitude in air pollutant emission factors

- 2 ~ 3 orders of magnitude in cancer indicators
- 3 ~ 6 orders of magnitude in non-cancer indicators

Limitation of Sensitivity Analysis



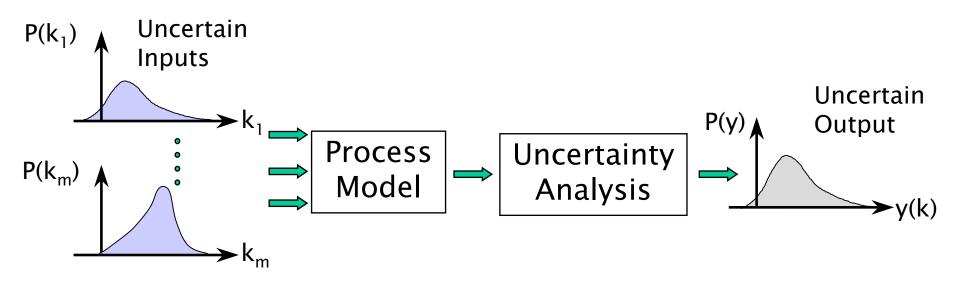
Insufficient when inputs vary over a wide range







• Combine model response with parameter variability to better present the reality







- Analyzed the uncertainty of which parameter has larger effect on the uncertainty of the outputs
- Compared uncertainty analysis with sensitivity analysis and analysis of variance (ANOVA)
- System specification
 - Precursor flow rate F: 0.1 2.5 \pm 10% ccm
 - Temperature T : 150–250 \pm 2 °C
- Nominal values

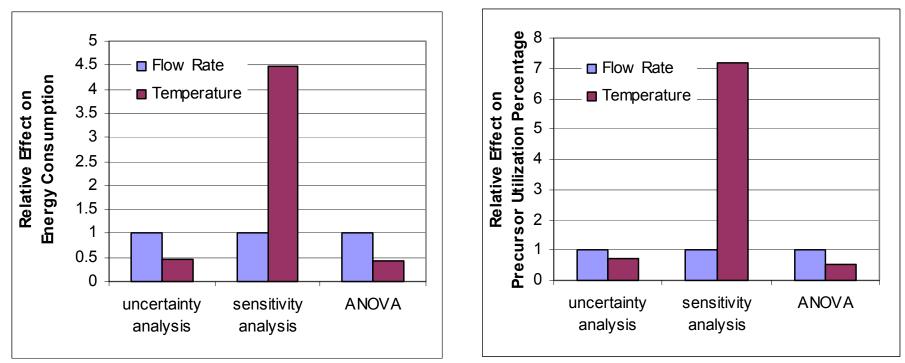
 $F_0 = 2 \text{ ccm}, T_0 = 190 \text{ °C}$

- PDFs of parameters
 - F ~ Normal Distributed, N(2, 0.04)
 - T ~ Normal Distributed, N(190, 4)
- Sensitivity analysis perturb \pm 0.2% around nominal values





• Uncertainty analysis tells the relative importance of parameters.



Energy Consumption

Precursor Utilization

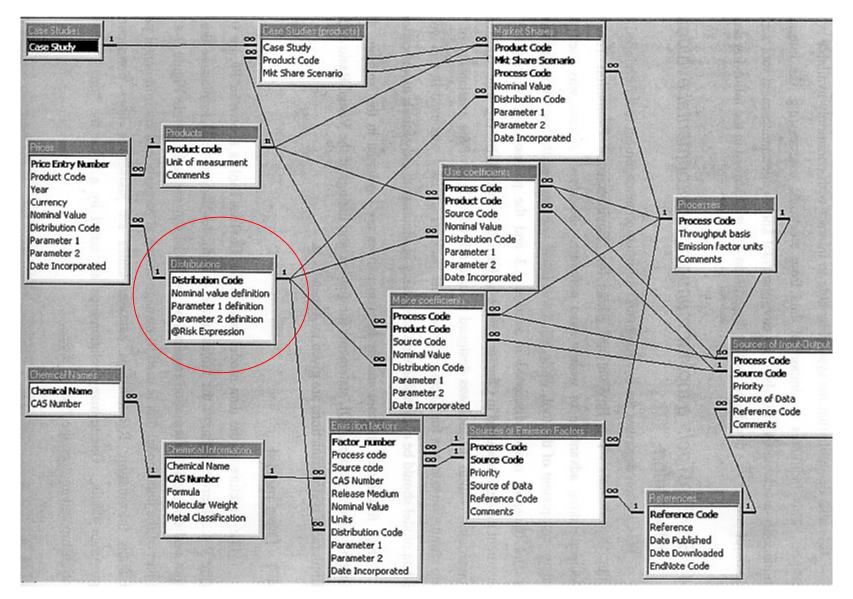
- Important parameter: Flow Rate
- To reduce process fluctuation, reduce the fluctuation of flow rate first

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Data Storage: Database Structure* MIT



Input-output data and economic information

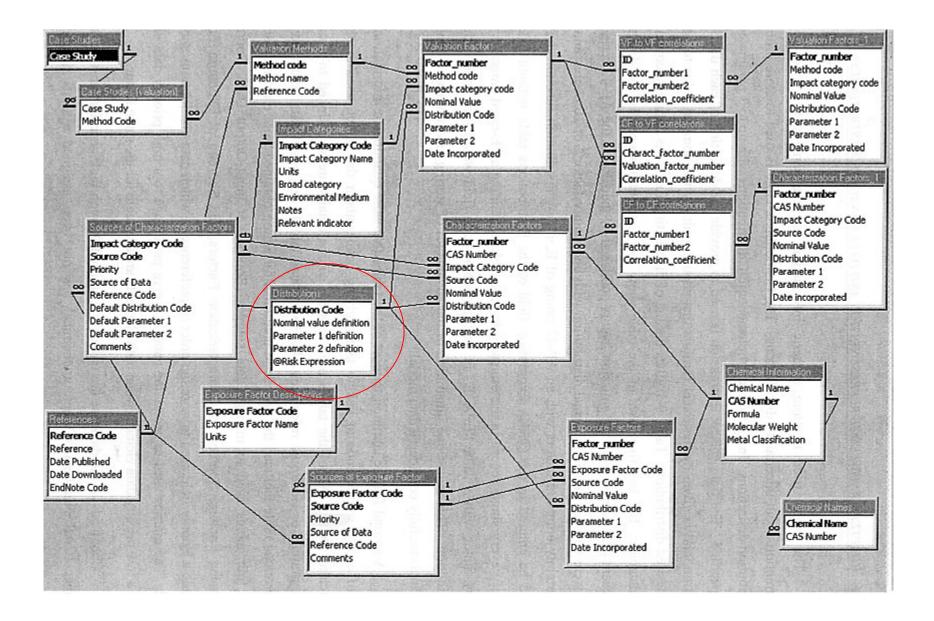


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NSE/SPC EPC for Environmentally Renign Semiconductor Manufacturing * Come Duits 2000 27

Chemical Properties and Valuation Factors









- 1. Complete uncertainty analysis on environmental evaluation of Cu CVD
- 2. Determine the important parameters through uncertainty analysis
- 3. Based on the Cu CVD case, evaluate existing metrics according to:
 - 1. Relevance to semiconductor industry
 - 2. Time length needed for data collection
 - 3. Accuracy of available data
- 4. Reevaluate Cu CVD case based on the chosen metrics
- Establish collaboration with interested companies/organizations, such as SEMATECH (the chemical data acquisition project)





- Performed life cycle analysis on Cu CVD process
 - Large impact from methane reforming
 - Changing carrier gas may reduce environmental impact
- Performed uncertainty analysis on Cu CVD process model
 - Flow rate is the important parameter
 - To reduce process fluctuation, reduce the fluctuation of flow rate first
- Proposed standardized database structure and including probability distribution in data collection
- Future steps