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# Object-Oriented Measurement

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***National Research Council of Canada***



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# Agenda

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- Definition of Object-Oriented Measures
- Theory Behind Object-Oriented Measures
- Object-Oriented Measurement in Practice
- Utility of Object-Oriented Measures
  - Preventative Action
  - Quality Prediction
  - Design Guidelines
- Cautions and Myths
  - Confounding Effects
  - Using Prediction Models Across Projects
  - Optimal Class Size & Faults
- Conclusions



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# Definition

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- Object-oriented measures quantitatively characterize the structure of a software system
- We are only concerned with static measures that can be collected from design documents or source code
- We are only concerned with class-level measures (as opposed to, for example, method-level measures)

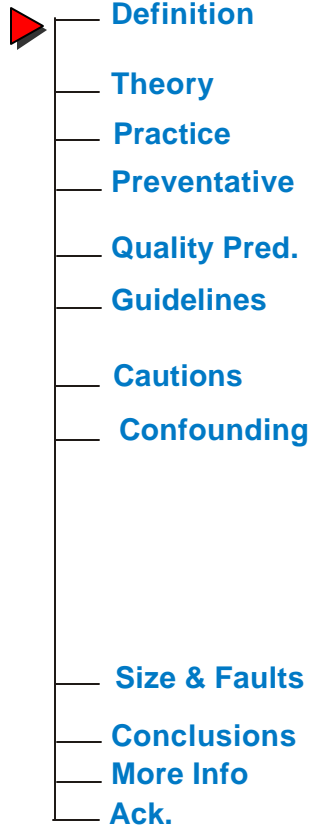


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# Types of Measures

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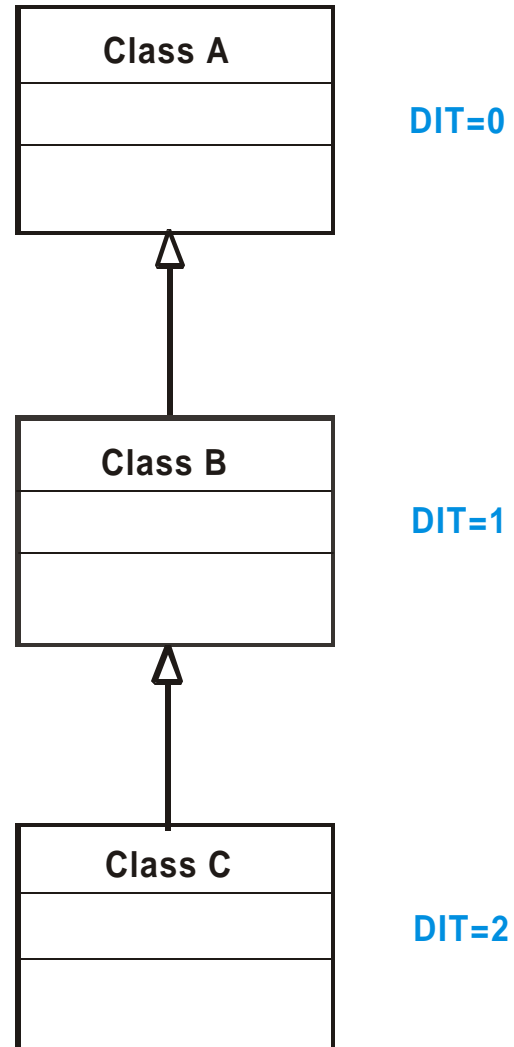
- Many OO measures have been developed (at least 100)
- Types of measures developed:
  - **size** (measure how big a class is)
  - **inheritance** (characterize inheritance hierarchy)
  - **coupling** (characterize relations amongst classes)
  - **cohesion** (characterize relations within classes)
  - **complexity** (aggregates of method measures)



# Example of Inheritance Measure: DIT

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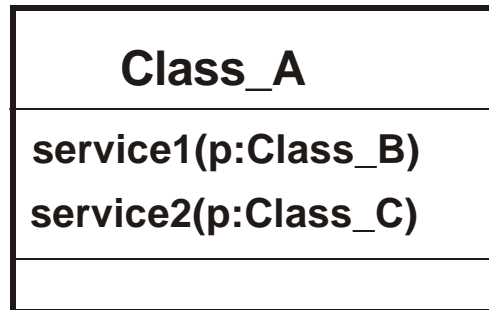
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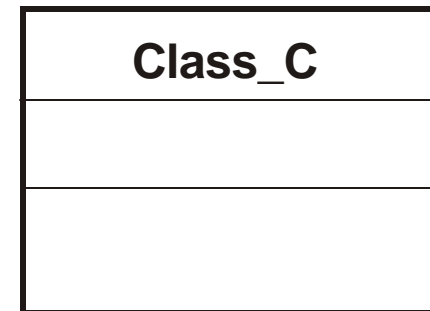
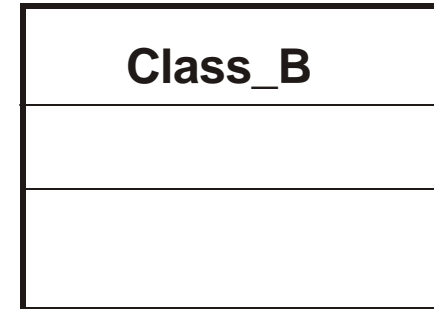
# Example of Coupling Measure: Class-Method Import Coupling

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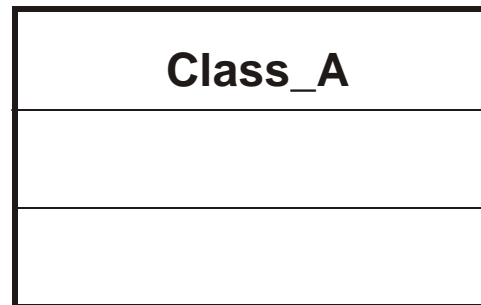
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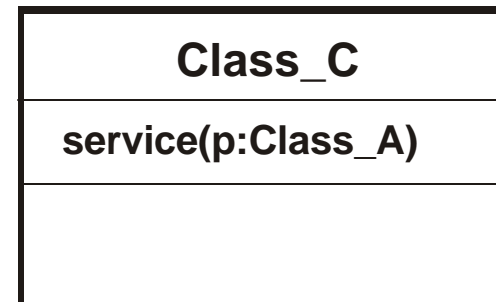
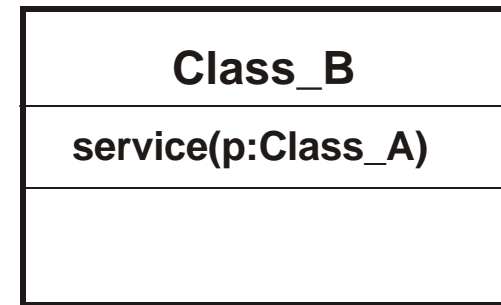
# Example of Coupling Measure: Class-Method Export Coupling

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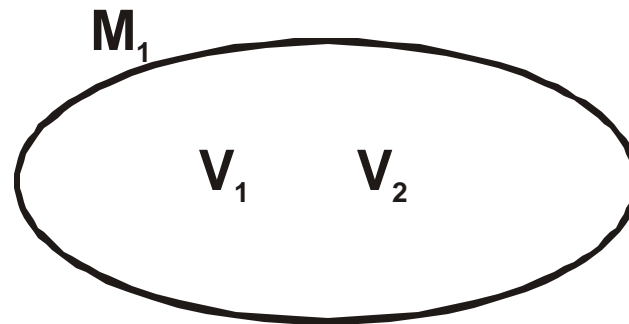
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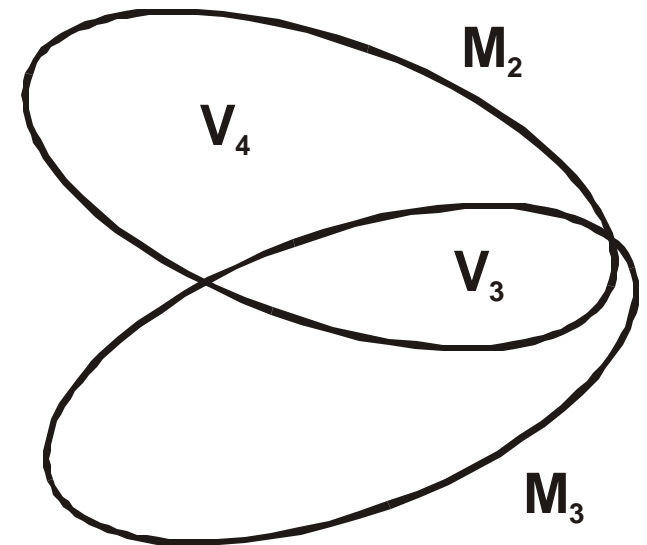
# Example of Cohesion Measure: Lack of Cohesion

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**LCOM=1**

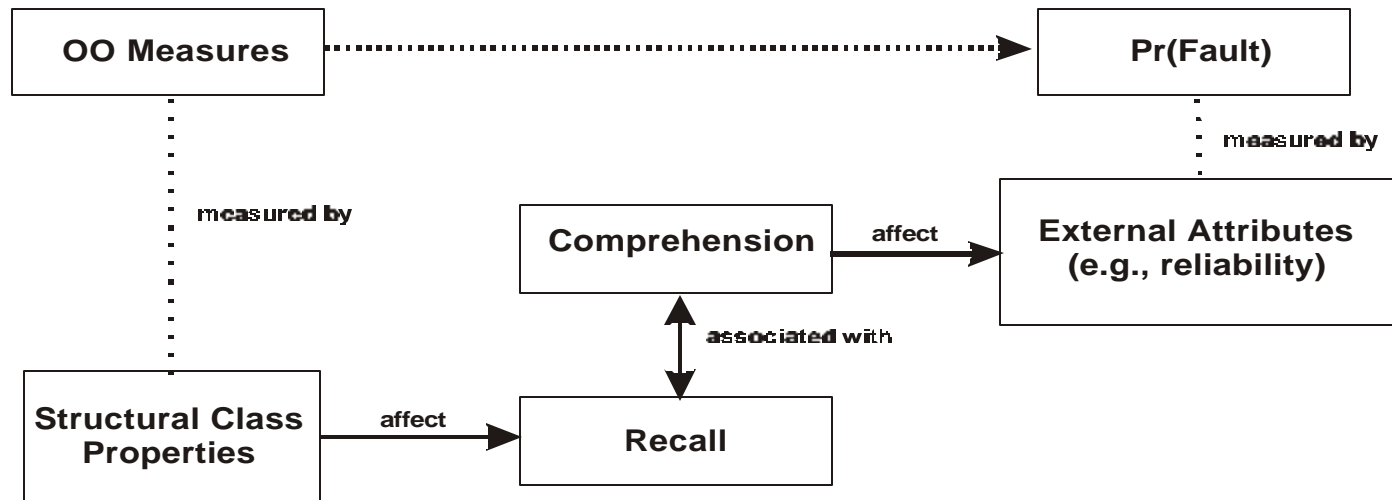




# A Theory of Object-Oriented Measures - I

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# A Theory of Object-Oriented Measures - II

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## Cognitive Complexity Theory

- The structural properties of a class have an impact on recall
  - interference effects
  - fan effects
  - familiarity
- Recall is associated with comprehension
- Comprehension is associated with reliability



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# The Most Useful Measures

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- It is necessary to have a good measure of class size
- Import and export coupling measures, separately, have been found to work well across studies
- Depth of Inheritance Tree has equivocal evidence
- Number of Children is not a good measure
- Cohesion measures are not related to much



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# Putting Object-Oriented Measurement Into Practice

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- Tools:
  - Tools to collect the measures
  - Tools to perform data analysis
- Expertise:
  - Object-oriented measurement
  - Statistics
  - The systems being analyzed
- Process:
  - ISO/IEC 15939



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# Utility of Object-Oriented Measures

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- Object-oriented measures can potentially be used for:
  - Taking preventative action
  - Quality (and cost) estimation
  - Developing design guidelines
- You can get different results depending on which criterion you are talking about:
  - pre-release faults
  - **post-release faults**
  - development & maintenance effort



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# Preventative Action - I

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- There exists evidence showing that most faults in a software system are detected in a small percentage of its components
- To improve defect detection effectiveness and efficiency it is desirable to identify these components early on
- Then one can take mitigating actions, such as more inspections, targeted testing, or even a redesign



# Preventative Action - II

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## Quality Models

- Quantitative models are constructed to predict which components are likely to have a fault



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# Preventative Action - Example (1)

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- A commercial Java application
- A quality model was constructed to predict the probability of a post-release fault
- Quality model was used to identify the classes that should be inspected
- Evaluated the cost savings from using the quality model (we had data on the cost of inspections and dealing with post-release faults)

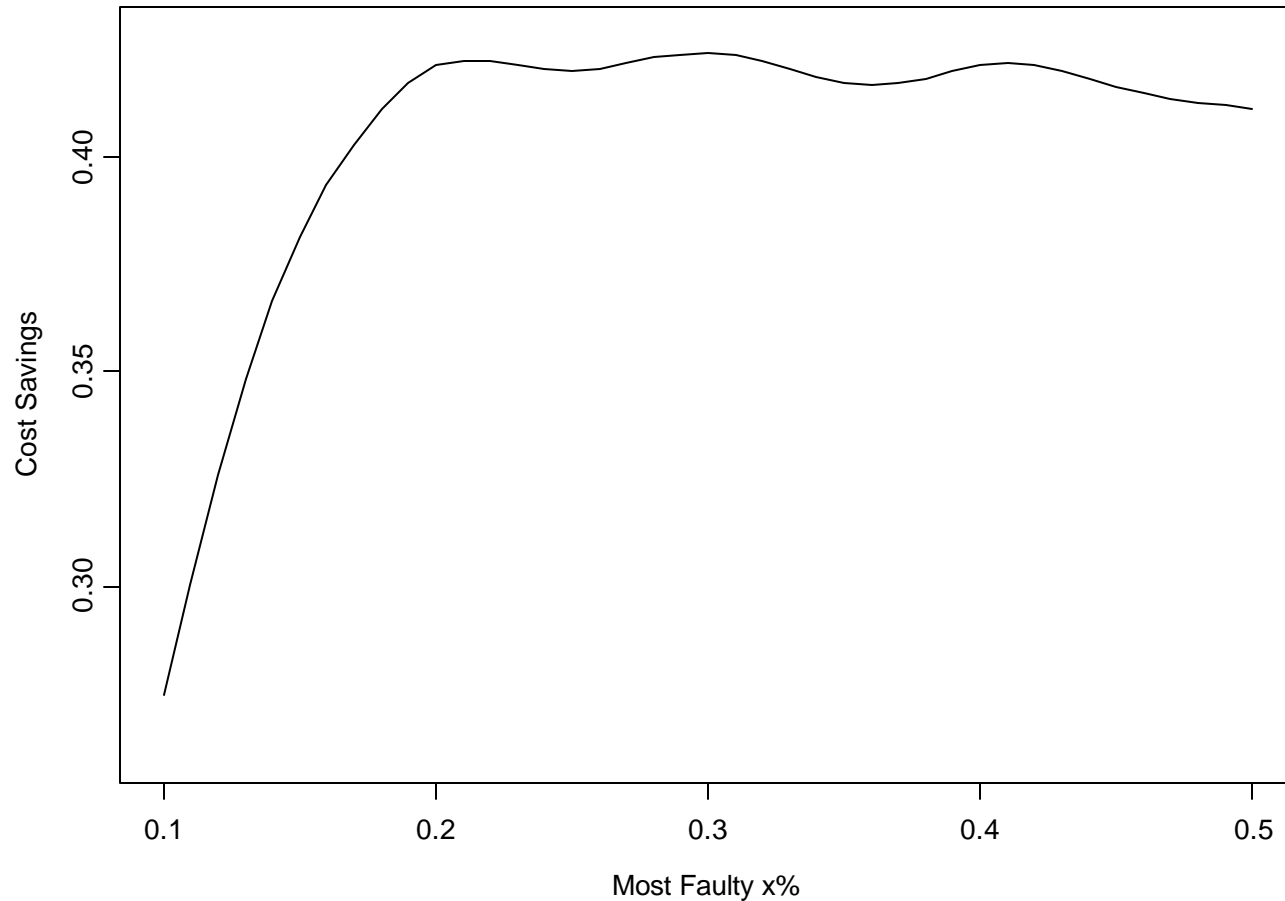




# Preventative Action - Example (2)

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# Quality Prediction

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- Developed a quality model on one release of a commercial Java application
- Used that model to predict the proportion of classes in the next release that will have a fault in them
- The prediction has approx. 9% error (i.e., underestimated the proportion by 9%)
- This can be considered a good prediction accuracy



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# Design Guidelines - I

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- It is also possible to empirically identify which structural properties of the software cause problems (e.g., which types of coupling)
- This information can then be used to construct proscriptive design guidelines to minimize problems in future development efforts
- Guidelines can be enforced automatically or through inspections



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# Design Guidelines - II

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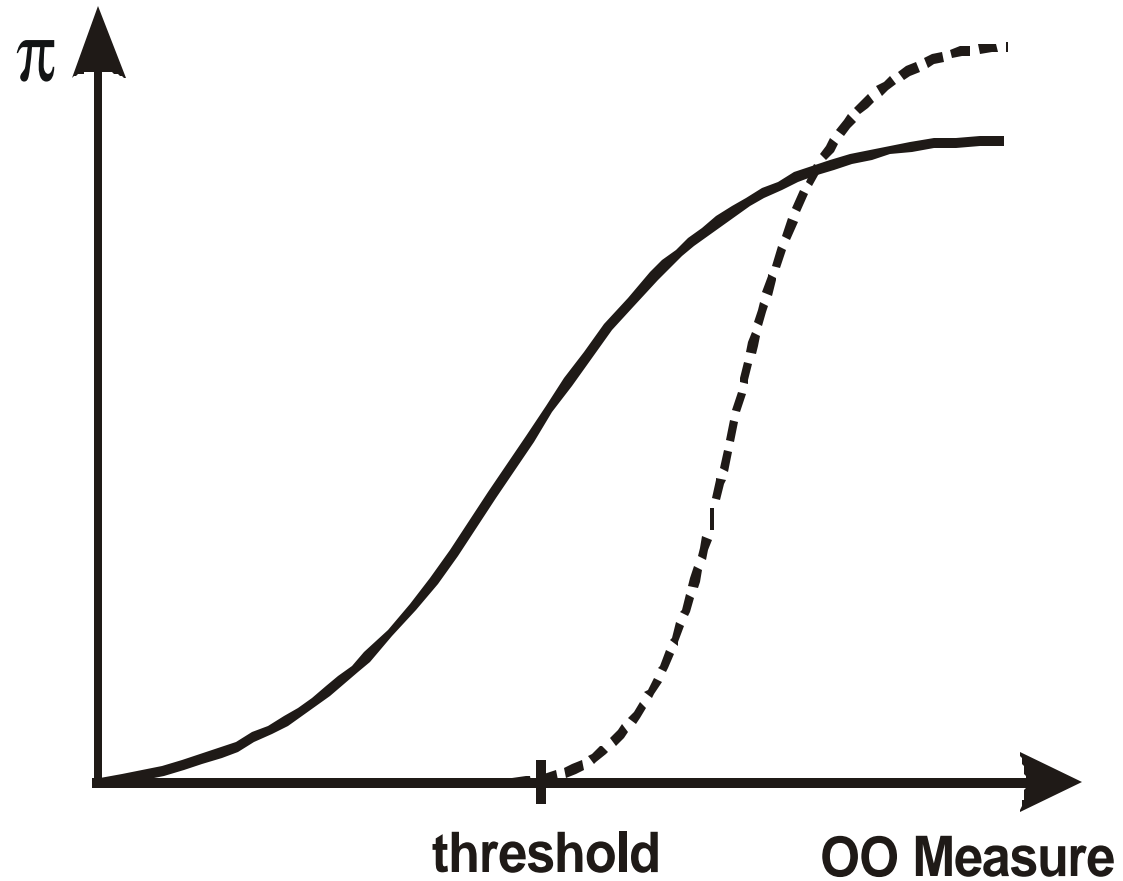
- Design guidelines expressed in the form of thresholds on the measures
- Types of design guidelines (hypothetical):
  - coupling should be less than 7
  - cohesion should be greater than 20
- If rule is not satisfied then there is a greater risk of a fault



# Design Guidelines - III

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- Thus far, no evidence that thresholds exist
- We could not identify a specific value on any of the object-oriented measures where the probability of a fault suddenly increases
- Does this mean that thresholds are useless ?



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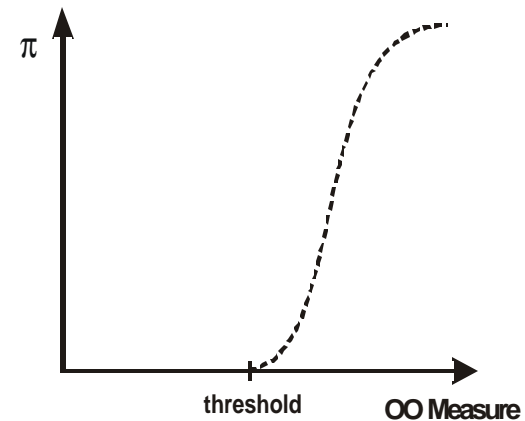
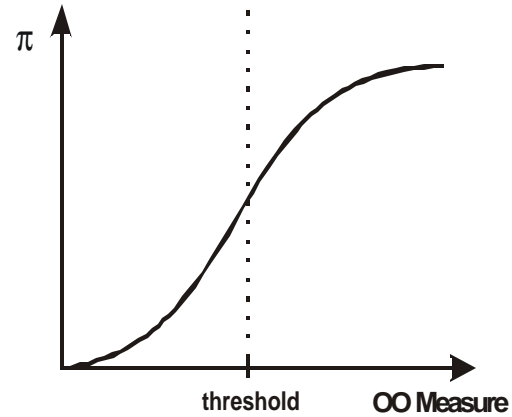
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# Cautions and Myths

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- Confounding effects
- The same models can be used across projects
- There is an optimal class size



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# Common Validation Method

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OO  
Measure

+

Fault-Proneness

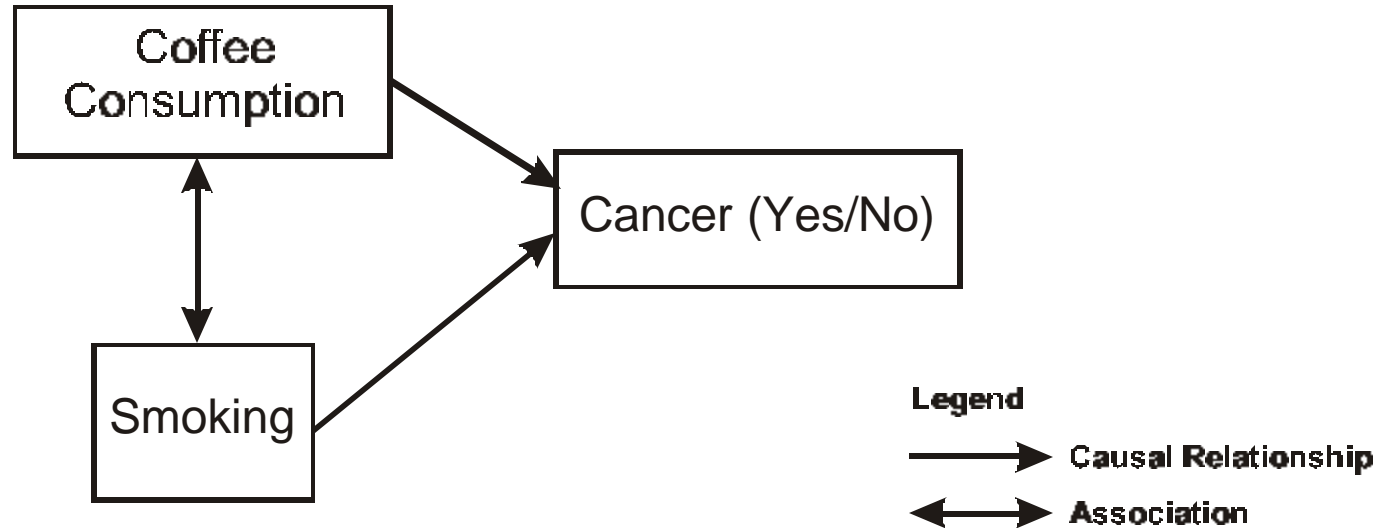
- You collect data on the object-oriented measure and on whether a fault occurs in a class
- If there is a positive relationship between the measure and fault-proneness, then the measure is said to be validated
- At least 12 “successful” validation studies



# An Epidemiological Example

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- If you look only at the coffee consumption **®** cancer relationship, you can get very misleading results
- Smoking is a confounder



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# Confounding Effects

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- It is known that smoking and coffee consumption are associated
- It is known that smoking causes cancer
- If smoking is not controlled during the study, then it is likely that an **inflated** coffee effect will be found
- This is a classic confounding effect
- Without proper controls, the study results can show a relationship where none really exists



# Confounding with Object-Oriented Measures

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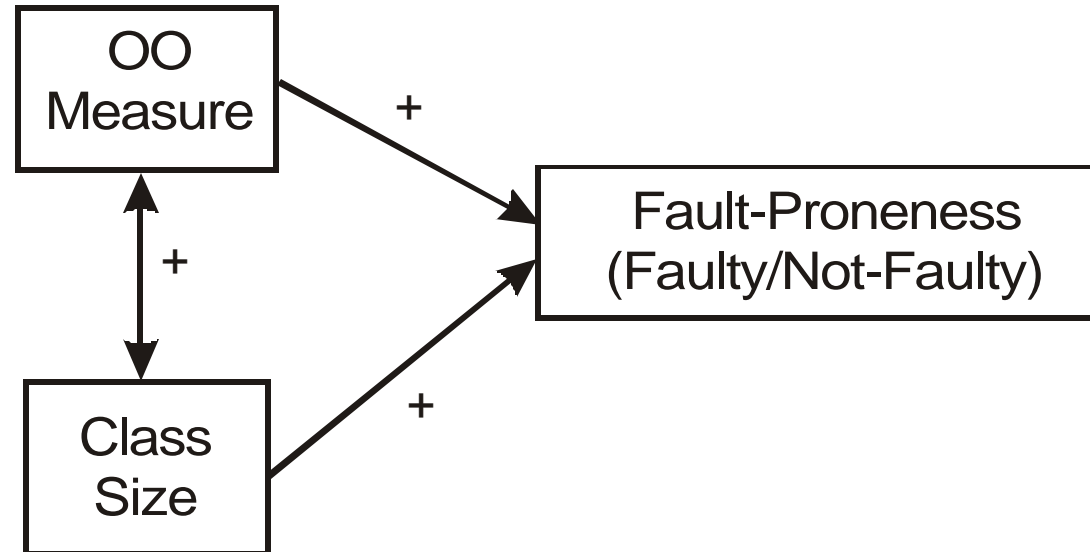
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- In this case, size is the confounder
- There is substantial evidence that most object-oriented measures are associated with class size



# Example Relationship with Size

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OO Metric	LOC	
	Rho	p-value
WMC	0.88	<0.0001
DIT	0.098	0.19
CBO	0.46	<0.0001
RFC	0.88	<0.0001
LCOM	0.24	0.0011
NMA	0.86	<0.0001
NPAVG	0.27	0.000256



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# The Confounding Effect of Size

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- Just looking at the relationship between an object-oriented measure and faults does not make sense
- It is necessary to at least control for size



# The Confounding Effect of Inheritance Depth - I

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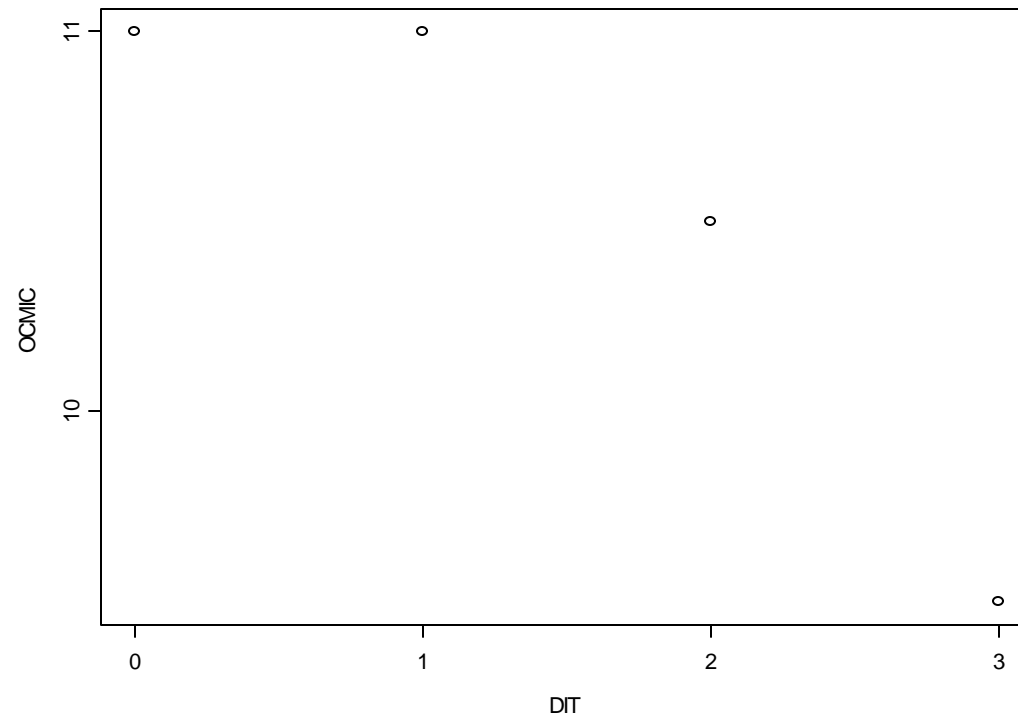
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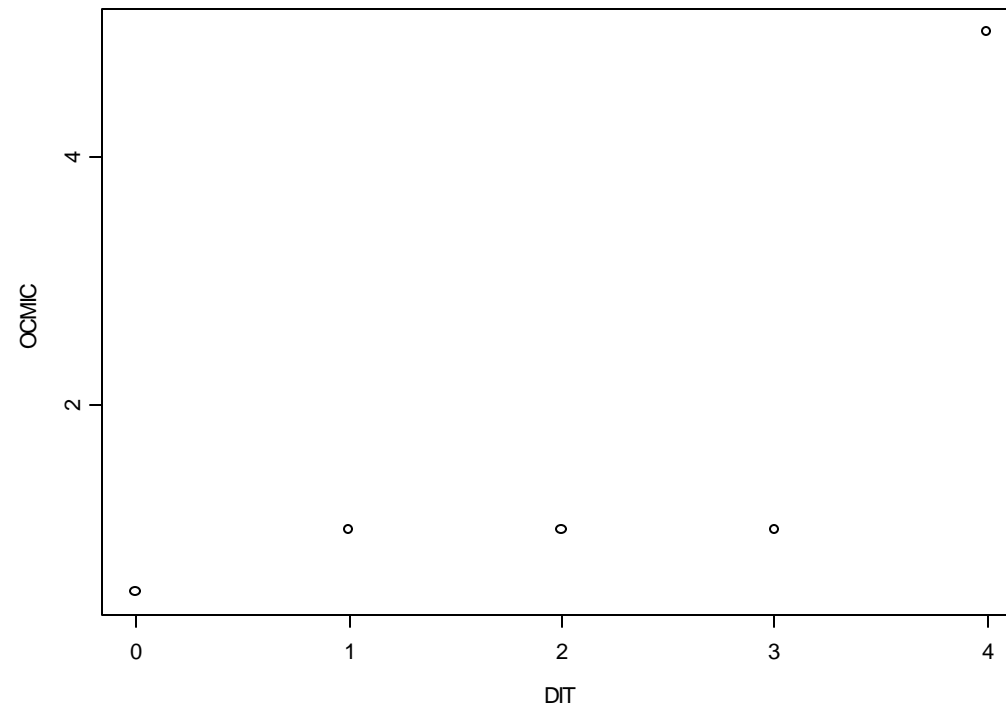
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# Usage Effects

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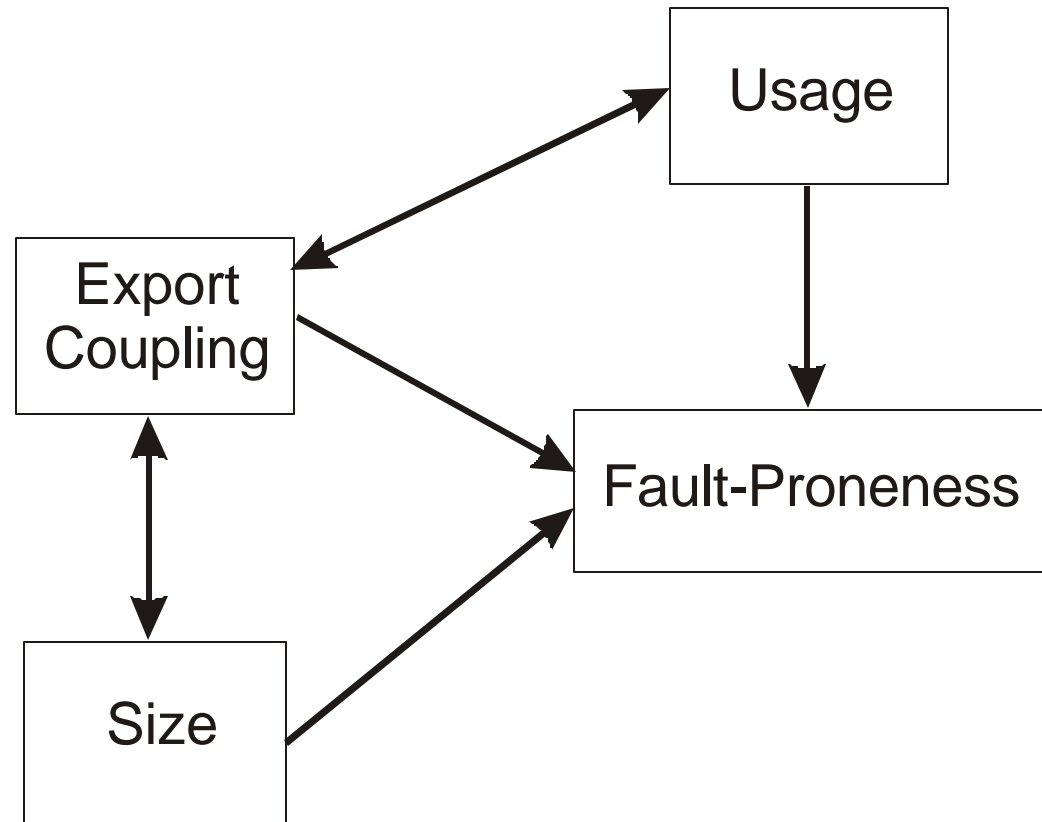
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## Analysis Technique

- The form of a logistic regression model is:

$$p = \frac{1}{1 + e^{-\left(b_0 + \sum_{i=1}^k b_i x_i\right)}}$$

- Parameter estimates through the maximization of a log-likelihood, including estimates of the threshold
- Standard technique for validation of object-oriented measures



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# Monte Carlo Simulation

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- We performed a Monte Carlo simulation to illustrate how usage can give very different results
- The scenario was that of looking at the relationship between export coupling and fault-proneness assuming:
  - Usage has a bigger effect on fault-proneness
  - Export-coupling has a bigger effect on fault-proneness



# Export Coupling Has a Bigger Effect

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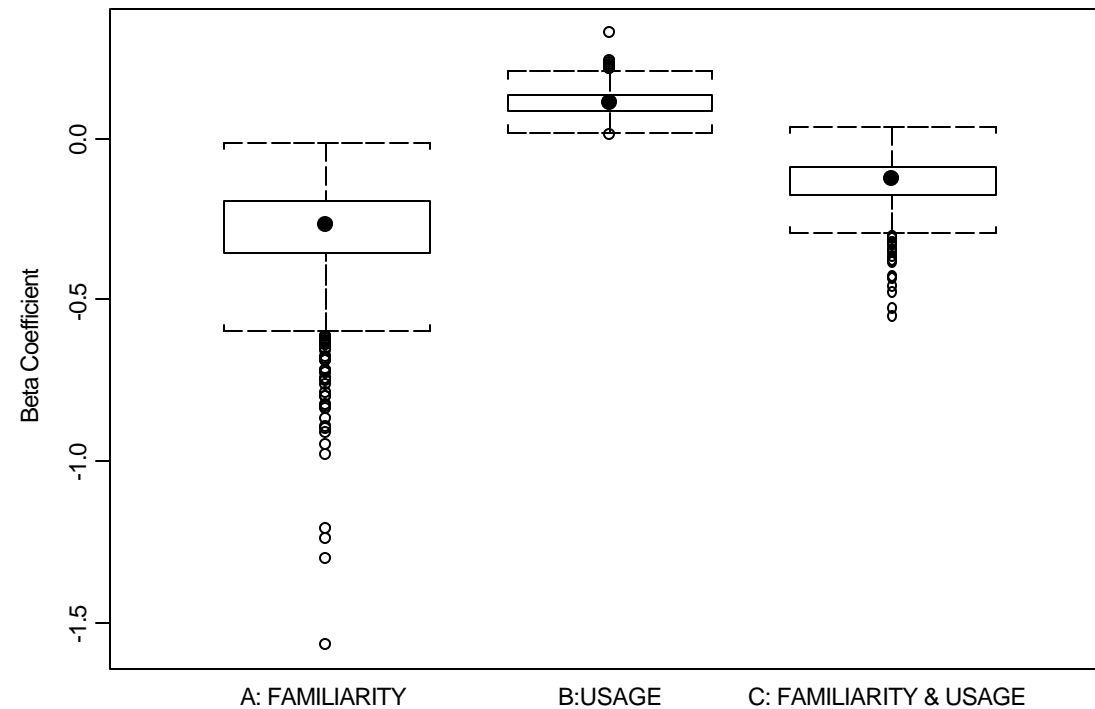


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# Usage Has a Bigger Effect

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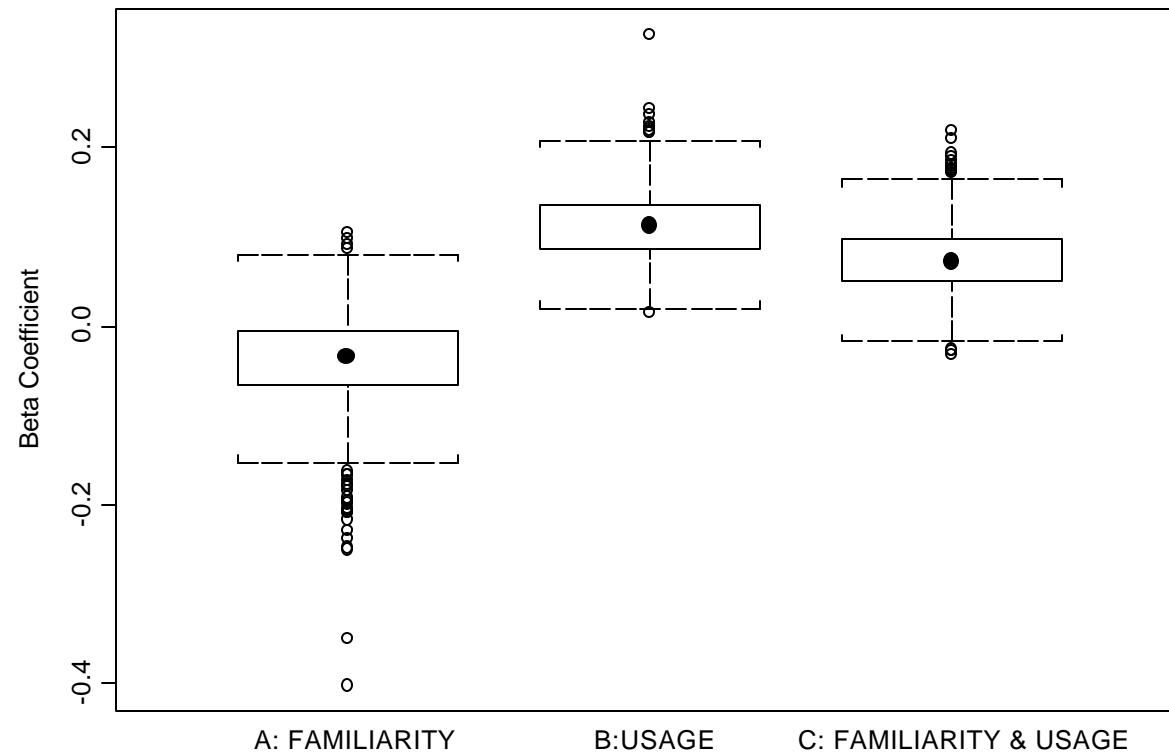


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# Using Models Across Projects

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- Unless you have a measure for usage or unless the usage patterns are the same across projects, then it is dangerous to use models across projects
- Using models across multiple releases is probably a safer bet



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# Optimal Class Size & Faults - I

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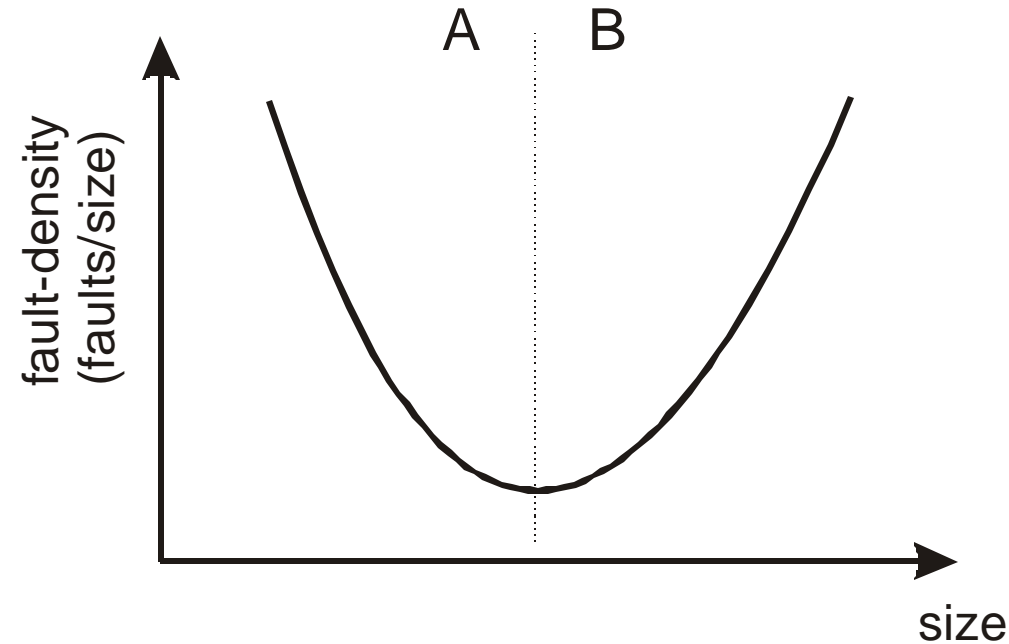
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- Smaller classes (or modules) are more faulty than larger ones (program decomposition is bad)
- There is an optimal class size



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# Optimal Class Size & Faults - II

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- The first conclusion is due to a mathematical artifact of plotting  $Y/X$  vs.  $X$
- You will always get a negative association, even if there is no association between the raw variables
- It is easy to obtain absurd conclusions (turn a positive association to a negative one) this way
- Some examples ...





# Smoking and Mortality Rate

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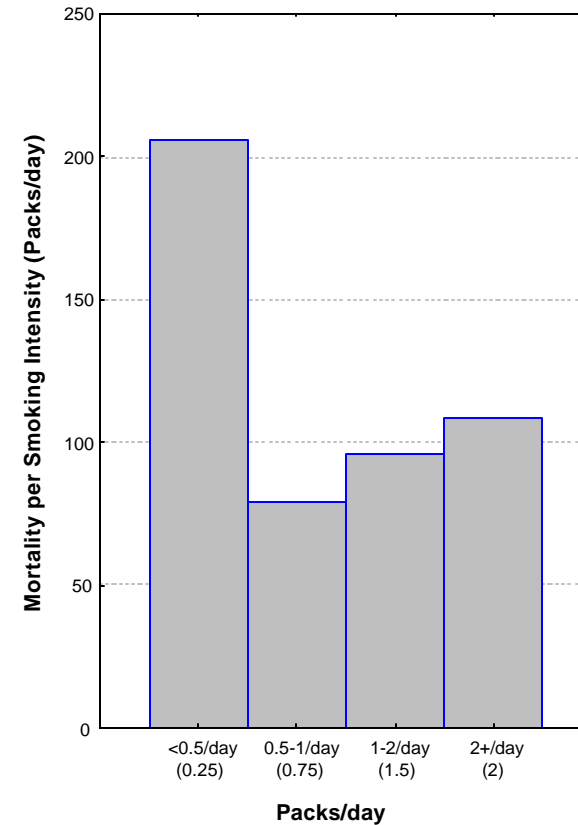
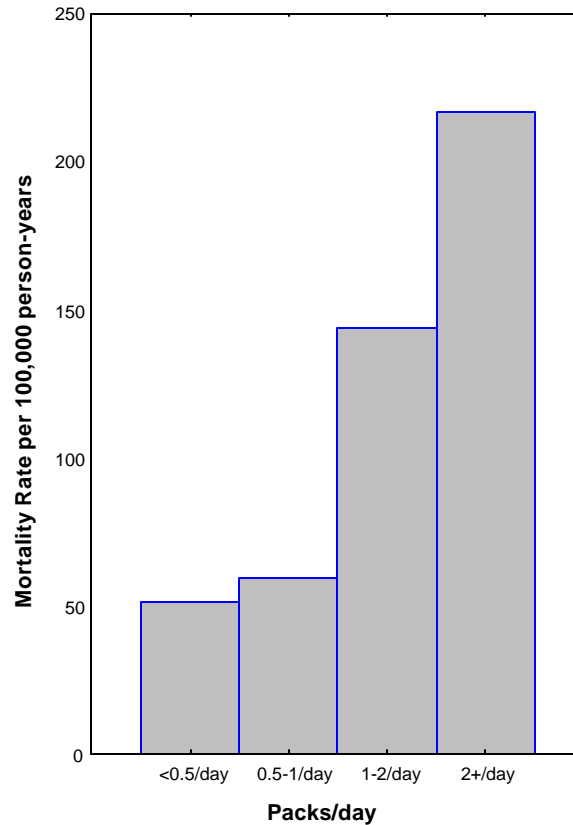
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- Optimal smoking: 0.75 packs/day



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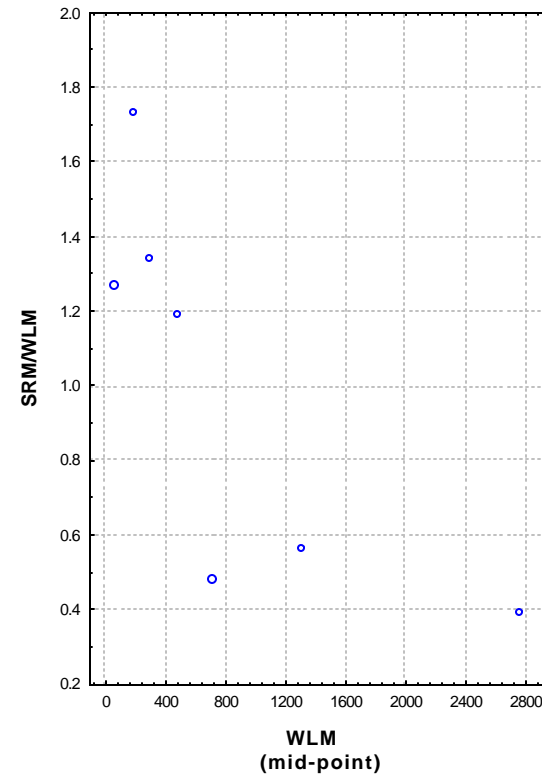
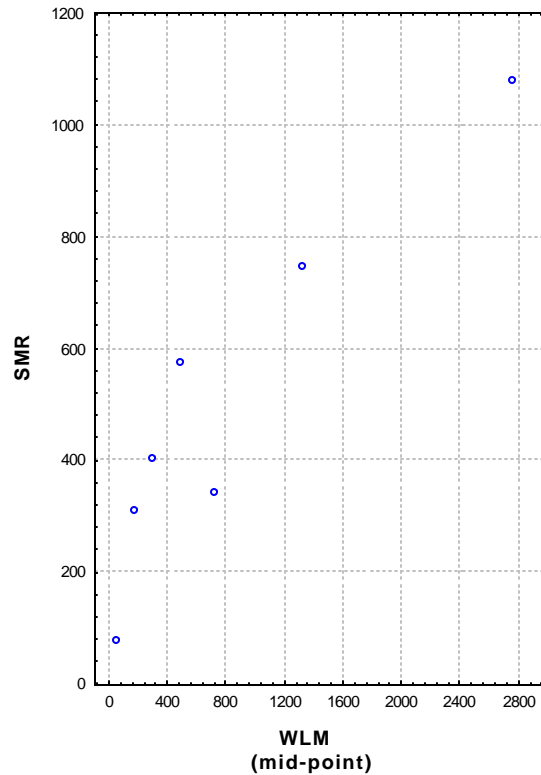
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# Uranium Exposure & Mortality

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- Quickly, move closer to a uranium mine



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# Conclusions

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- Object-oriented measures can be very useful for identifying fault-prone classes early on, but:
  - be cautious about thresholds
  - it is safer to use the prediction models across releases of the same product
  - watch out for statistical artifacts



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# More Information

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Ack.

- The research work supporting this presentation can be found at:

<http://www.object-oriented.org>



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# Acknowledgements

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Ack.

- Saida Benlarbi, Alcatel
- Nishith Goel, Cistel Technology
- Shesh Rai, Statistics Canada & St. Jude Children's Research Hospital
- Walcelio Melo, Oracle Brazil
- Hakim Lounis, CRIM
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