# RPM Workshop: Basic Ratemaking

#### **Ratemaking Relativities**

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Introduction to Ratemaking Relativities

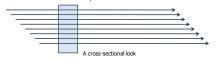
### Agenda

- Purposes & considerations of risk classification systems
- Implementation issues to consider
- Determining rate relativities

#### Introduction to Ratemaking Relativities

How might you determine a fair price for a given risk?

- 1. Wisdom and judgment
- 2. Examine that risk's experience over time  $\xrightarrow[A \text{ longitudinal look}]{}$
- 3. Examine the experience of similar risks



#### Introduction to Ratemaking Relativities

"The grouping of risks with similar risk characteristics for the purpose of setting prices is a fundamental precept of any workable private, voluntary insurance system. This process, called risk classification, is necessary to maintain a financially sound and equitable system. It enables the development of equitable insurance prices, which in turn assures the availability of needed coverage to the public. This is achieved through the grouping of risks to

This is achieved through the grouping of risks to determine averages and the application of these averages to individuals." (page 1)

Note: all quotes in this presentation are from the Americ	an Acad	emy of
Actuaries' Risk Classification Statement of Principles.	Only pa	ige
numbers will be noted.		

### PUBPOSE OF BISK CLASSIFICATION

Three purposes of risk classification:

- 1. Protect an insurer's financial soundness
- 2. Enhance fairness
- 3. Provide an insurer with economic incentive to write large portions of the market

### PURPOSE OF BISK CLASSIFICATION

Adverse selection occurs when economic forces are not in equilibrium: when buyers move in, out, and throughout the market.

For example...

- Group A expected costs = \$100
- Group B expected costs = \$200
- Your company charges \$150 for both
- Competitor charges \$100 for A and \$200 for B
- Assume you still make money at a 60% loss ratio

### PURPOSE OF RISK CLASSIFICATION

At time 0, you price to the total...

γου	Current Exp	Price	Expected Prem	Expected Loss	Expected LR
Group A	10,000	\$150	\$1,500,000	\$900,000	60.0%
Group B	10,000	\$150	\$1,500,000	\$900,000	60.0%
Total	20,000	\$150	\$3,000,000	\$1,800,000	60.0%

Your competitor changes their price to match the cost...

Competitor	Current Exp Price		ent Exp Price Expected Prem		Expected LR	
Group A	10,000	\$100	\$1,000,000	\$600,000	60.0%	
Group B	10,000	\$200	\$2,000,000	\$1,200,000	60.0%	
Total	20,000	\$150	\$3,000,000	\$1,800,000	60.0%	

What happens during the next year at these prices?

# PURPOSE OF RISK CLASSIFICATION

Assume ¼ of customers shop at renewal. During year 1...

γου	U Actual Exp Ave Prem Actual Prem Actual Loss		Actual Loss	Actual LR	
Group A	7,500	\$150	\$1,125,000	\$450,000	40.0%
Group B	12,500	\$150	\$1,875,000	\$1,500,000	80.0%
Total	20,000	\$150	\$3,000,000	\$1,950,000	65.0%

Group A shoppers all choose your competitor. Group B shoppers all choose you.

Competitor	Actual Exp	Ave Prem	Actual Prem	Actual Loss	Actual LR
Group A	12,500	\$100	\$1,250,000	\$750,000	60.0%
Group B	7,500	7,500 \$200 \$1,500,000 \$90		\$900,000	60.0%
Total	20,000	\$150	\$2,750,000	\$1,650,000	60.0%

You don't know about Group A or B. You just see a rate need.

### PURPOSE OF RISK CLASSIFICATION

At time 1, you think you need an 8.3% increase...

YOU	Current Exp	New Price	Expected Prem	Expected Loss	Expected LR
Group A	7,500	\$163	\$1,218,750	\$731,250	60.0%
Group B	12,500	\$163	\$2,031,250	\$1,218,750	60.0%
Total	20,000	\$163	\$3,250,000	\$1,950,000	60.0%

With your new rates, you *expect* to be back at a 60% loss ratio. But what happens during the year?

Competitor	Current Exp	New Price	Expected Prem	Expected Loss	Expected LR	
Group A	Group A 12,500		\$100 \$1,250,000		60.0%	
Group B	7,500	7,500 \$200 \$1,500,000 \$900,000		60.0%		
Total	20,000	\$138	\$2,750,000	\$1,650,000	60.0%	

Note: Your competitor didn't have to change its prices.

### PURPOSE OF RISK CLASSIFICATION

But during year 2, the mix shifts more...

YOU	Actual Exp	Ave Prem	Actual Prem	Actual Loss	Actual LR
Group A	5,625	\$163	\$914,063	\$337,500	36.9%
Group B	14,375	\$163	\$2,335,938	\$1,725,000	73.8%
Total	20,000	\$163	\$3,250,000	\$2,062,500	63.5%

Even with your rate increase, you continue to lose money...

Competitor	Actual Exp	Ave Prem	Actual Prem	Actual Loss	Actual LR
Group A	14,375	\$100	\$1,437,500	\$862,500	60.0%
Group B	5,625	\$200	\$1,125,000	\$675,000	60.0%
Total	20,000	\$128	\$2,562,500	\$1,537,500	60.0%

... and your competitor continues to make money.

### PUBPOSE OF BISK CLASSIFICATION

#### Several notes on the example...

• Your primary defense against adverse selection is risk classification.

• Purpose 1: Protect an insurer's financial soundness

• Because they were properly priced, your competitor was happy to write the whole market.

 Purpose 3: Provide an insurer with economic incentive to write large portions of the market

• Because no subsidization was occurring and each insured's price matched its average risk, your competitor's prices were more fair.

• Purpose 2: Enhance fairness

#### Risk classification considerations

How a risk classification system is designed will affect its ability to achieve the three purposes. We'll consider...

- Underwriting
- Marketing
- Program design
- Statistical considerations
- Hazard reduction
- Public acceptability
- Causality
  Controllability
- Operational considerations
- Controllability
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#### **Underwriting**

"Underwriting is the process of determining the acceptability of a risk based on its own merits." (page 7)

Developing a risk classification system is separate from underwriting, and provides the context in which underwriting is done.

#### Marketing

Marketing impacts the mix of business you write. If there are distortions in the risk classification system, the mix of business can impact profitability.

#### Risk classification considerations

#### Program Design

Degree of choice available to the buyer – If coverage is compulsory and without competitors, broad classifications may be possible without adverse selection.

*Experience-based pricing* – To the extent this is used, less refined initial classifications are needed.

Premium payer – Broad classifications can also be used if the insured is not the one bearing the cost.

#### **Risk classification considerations**

### Statistical considerations

Homogeneity – Expected costs for risks in a class should be reasonably similar.

Credibility – The larger the number of observations, the more accurate are statistical predictions.

Predictive Stability – Ultimately we are trying to predict future costs. "The predictive capability must be responsive to changes in the nature of insurance losses, yet stable in avoiding unwarranted abrupt changes in resulting prices." (page 10)

#### **Operational considerations**

- Expense The cost of the whole risk classification system should be as low as possible. The cost of collecting, storing and processing a given variable should be reasonable in relation to the benefit.
- Constancy Characteristics should remain constant for a given risk, at least over the insured period. To the extent that it is not, this will tend to increase the expense and decrease the utility.

#### **Risk classification considerations**

#### **Operational considerations**

- Availability of coverage While availability of coverage should be increased through the use of a risk classification system, it is possible that the correct highest rate is beyond what can be afforded. Sometimes this can be mitigated through limitations on coverage.
- Avoidance of extreme discontinuities There should be enough classes to establish a reasonable continuum, but few enough classes to leave reasonable differences. The extreme ends should be examined for possible large rate differences between adjacent classes.

#### **Risk classification considerations**

#### **Operational considerations**

- Absence of ambiguity There should be no ambiguity in the assigning of classes. Classifications should be mutually exclusive and exhaustive.
- Manipulation There should be minimal ability for the insured to manipulate or misrepresent their characteristics.
- Measurability Risk classes should be conveniently and reliably measured.

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#### Hazard Reduction

Sometimes a risk classification system can provide an incentive for an insured to reduce their risk.

For example, a stability control discount may encourage the purchase of vehicles with this feature.

While desirable, this is not a necessary feature of a risk classification system.

#### **Risk classification considerations**

#### Public Acceptability

A risk classification system must be in line with society's values. However, this can be difficult because values...

•	"are difficult to ascertain"	(page 14)
•	"vary among segments of the society"	(page 14)
•	"change over time"	(page 14)

To increase public acceptability, a risk classification should...

"...not differentiate unfairly among risks"

- (page 14)
- "...be based upon clearly relevant data" (page 14)
- "...respect personal privacy" (page 14)
- "...be structured so that the risks tend to identify naturally with their classification" (page 14)

#### Risk classification considerations

#### **Causality**

Establishing cause and effect can boost the acceptability of a classification; however, this is not a requirement. It is enough to establish a plausible relationship between the classification and the underlying risk.

#### **Controllability**

There are two sides to this coin. If an insured can control which classification he/she is in, this can mean that the system is encouraging hazard reduction. It can also mean that the system can be manipulated, leading to irrelevant results.

Consider the following potential predictors...

- Having Blue Eyes
- Driving a Red Car
- Living in a Flood Plane
- Current Limits
- Electronic Stability Control
- Credit
- Miles Driven

### IMPLEMENTING BATE BELATIVITIES

#### Rate Impact and Off-Balance

Remember that the overall rate need is determined completely separately from any rate relativity changes.

You find that the rate relativities for Fire Hydrant Distance (FHD) need to be modified.

Currently, houses within 3 miles of a fire hydrant are the base. Houses greater than 3 miles from a hydrant are surcharged 20%.

You believe the surcharge should be changed to 40%. Will this not increase the premium taken in? Will this not impact the overall rate level?

#### IMPLEMENTING BATE BELATIVITIES

#### Rate Impact and Off-Balance

All relativity changes have the potential to impact the overall rate level.

The **rate impact** is the change in the overall rate level that any relativity change would cause in and of itself.

The **off-balance** is the adjustment to the base rates needed to off-set the rate impact so that the total change is revenue neutral.

The off-balance is the inverse of the rate impact.

### IMPLEMENTING BATE BELATIVITIES

#### Rate Impact and Off-Balance

There are at least three ways to calculate the rate impact.

- Exposure-weighted average rate impact Simplest and least accurate. Used when premium and a rerating approach are not available.
- Premium-weighted average rate impact Most accurate approach when a rerating approach is not available. Fails when multiple changes are made.
- Rerated rate impact Works even when multiple changes are made. Can calculate total rate impacts.

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### IMPLEMENTING BATE BELATIVITIES

#### Rate Impact and Off-Balance

Consider again, the current surcharge for being far from a fire hydrant is 20%. You are changing it to 40%.

#### The exposure-weighted method...



Other relativities may impact the average premium of each class. This method ignores that.

### IMPLEMENTING BATE BELATIVITIES

#### Rate Impact and Off-Balance

Consider again, the current surcharge for being far from a fire hydrant is 20%. You are changing it to 40%.

#### The premium-weighted method...

FHD	Exposures	Current Prem	Current Rel	Base Prem	New Rel	New Prem
0-3	12,000	14,142,000	1.00	14,142,000	1.00	14,142,000
3+	8,000	8,061,000	1.20	6,717,500	1.40	9,404,500
Total	20,000	22,203,000		20,859,500		23,546,500

This method assumes that every other relativity, the relativities that generated those premiums, are correct. If you are simultaneously changing other relativities, this is a dubious assumption.

_	1.40	9,404,500
)		23,546,500
	Rate Impact	6.1%
	=23,546,500/2	2,203,000 - 1
	Off-balance	-5.7%
	=1/(1+.	061) - 1
	-/(	



### IMPLEMENTING BATE BELATIVITIES

#### Rate Impact and Off-Balance

Consider again, the current surcharge for being far from a fire hydrant is 20%. You are changing it to 40%.

The rerating method...

- This method works entirely differently. Assume, as before, that the collected premium under the old rate relativities is \$22,203,000.
- Record by record, recalculate the historical premium as if the new relativities were used. This requires extensive preparation and computing power.
- If the rerated premium is \$24,667,000 using the new relativities, then the premium increased 11.1%, and that is the rate impact.

### **DETERMINING BATE BELATIVITIES**

Rates are considered to have two pieces:

Overall Rate Level & Rate Relativity

#### Why?

Having the overall rate separate

- lets you... a) Use all the experience to find
- overall indications. b) Use overall trends and
- Use overall trends and development.
- c) Gives the most credible answer by using all the data.
- Determining correct rate rels requires dealing with all the complexity of different rates... a) Slicing and dicing data.

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- b) Dealing with the multivariate nature of the problem.
- c) Can ignore trends and loss dev – everything's relative!

What assumption do you make by saying trends and loss dev can be ignored?

### **DETERMINING BATE BELATIVITIES**

#### Two approaches for determining rate relativities:

Keep what you have in place and look only to alterations or additions

- Examine existing loss ratios
- Compare actual and expected loss ratio
- Requires current-leveled premium, but allows for modifications to existing factors

Throw out what you have and start from scratch

- · Model loss costs, or alternatively frequency and severity
- Develop expected cost per unit of exposure
- Assumes a from-the-ground-up approach

### Pure Premium Method - Univariate

Class	Exposure	Losses Pure Premium		Proposed Relativity	
1	6,195	\$759,281	\$123	1.00	
2	7,508	\$1,472,719	\$196	1.60	

# **RETERMINING BATE RELATIVITIES**

#### **Pure Premium Method – Univariate** Solve for the rate relativities

Age	Exposure	Loss	Loss Cost	Relativity
Younger	150	6,000		
Older	1000	12,500		1.00
Total	1,150	18,500		
Points	Exposure	Loss		
	Exposure	LOSS	Loss Cost	Relativity
Clean	550	6,500	Loss Cost	Relativity 1.00
			Loss Cost	

### **RETERMINING BATE BELATIVITIES**

### Pure Premium Method – Univariate

Solve for the rate relativities

Age	Exposure	Loss	Loss Cost	Relativity	
Younger	150	6,000	40.0	3.20	
Older	1000	12,500	12.5	1.00	
Total	1,150	18,500			
Points	Exposure	Loss			
	Exposure	LOSS	Loss Cost	Relativity	
Clean	550	6,500	11.8	1.00	
Clean Pointed					

How much should we charge younger, pointed drivers?

3.20 \* 1.69 = 5.42

Or, 5.42 times as much as we charge older, clean drivers.

Where's the problem?

#### Pure Premium Method – Multivariate

Solve for the rate relativities again

Age	Points	Exposure	Loss	Loss Cost	Relativity
Younger	Clean	50	1,500		
Younger	Pointed	100	4,500		
Older	Clean	500	5,000		
Older	Pointed	500	7,500		
Т	Total		18,500		

# *RETERMINING BATE BELATIVITIES*

#### **Pure Premium Method – Multivariate** Solve for the rate relativities again

			U		
Age	Points	Exposure	Loss	Loss Cost	
	~	50	4 500	00.0	

Younger	Clean	50	1,500	30.0	3.00	Our previous
Younger	Pointed	100	4,500	45.0	4.50	estimate was
Older	Clean	500	5,000	10.0	1.00	5.42
Older	Pointed	500	7,500	15.0	1.50	
Total		1,150	18,500			

Now we charge younger, pointed drivers 4.5 times as much as the base driver.

What we have here is a correlation of the exposure distributions of Age and Points.

### **RETERMINING BATE BELATIVITIES**

#### Point of Confusion: Correlation versus Interaction

- Correlations between two variables' exposure distributions cause the results to be linked. This is NOT an interaction. It is an important effect and using multivariate techniques solves this problem. Often referred to as "double counting" the effect of a predictor.
- Interactions are correlations between two variables' indicated factors. When you don't know what factor to use until both variables are specified, you have an interaction.
- It is perfectly possible for two variables to be correlated but have no interaction. It is also possible for two variables to have an interaction but not be correlated!

#### Correlation of exposure distributions -

no Interaction of fields

Exposure	Clean	Pointed	Total	Loss	Clean	Pointed	Total
Younger	50	100	150	Younger	1,500	4,500	6,000
Older	500	500	1000	Older	5,000	7,500	12,500
Total	550	600	1,150	Total	6,500	12,000	18,500

Loss Cost	Clean	Pointed	
Younger	30.0	45.0	
Older	10.0	15.0	

# *RETERMINING BATE BELATIVITIES*

Interaction of fields –

Yc

no Correlation of exposure distributions

oosure	Clean	Pointed	Total	Loss	Clean	Pointed	Total
ounger	50	100	150	Younger	1,500	6,000	7,500
Older	450	900	1,350	Older	6,750	40,500	47,250
Total	500	1,000	1,500	Total	8,250	46,500	54,750

Loss Cost	Clean	Pointed	
Younger	30.0	60.0	
Older	15.0	45.0	

### **RETERMINING BATE BELATIVITIES**

Insurance is inherently a stochastic (random) process.

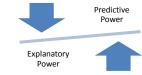
Any set of data you examine will contain random results in addition to true relationships.

Dependent Variable = Signal + Noise

Dependent Variable = Systematic Component + Component

The presence of noise along with our signal is the basic reason credibility was conceived. Due to the presence of noise, we don't fully believe our point estimate.

#### Modeling of any variety is a balance act...



Ultimately, we want to find signal and not noise. Signal represents true relationships which will persist over time. Noise is a random event which will likely not repeat.

### **DETERMINING BATE BELATIVITIES**

#### Multivariate Loss Cost Approaches

Multi-way loss cost tables

- Smaller & smaller segments
- · No estimate of noise. Incorporate credibility weighting.
- Minimum Bias
  - · Can handle many predictors, but still be done in Excel.

No estimate of noise.

#### GLM

- Generalization of classical linear models.
   [y = mx + b]
- Gives estimate of noise: significance testing; confidence intervals
- GIA
  - Generalization of minimum bias models. (Fu, Wu, 2007)
  - More flexible model assumptions than GLM.

# **RETERMINING BATE BELATIVITIES**

#### Loss Ratio Method - Univariate

Class	Premium @CRL	Losses	Loss Ratio	Loss Ratio Adjustment	
1	\$1,168,125	\$759,281	0.65	1.00	
2	\$2,831,500	\$1,472,719	0.52	0.80	

Which class is the higher risk?

#### Loss Ratio Method - Univariate

Class	Premium @CRL	Losses	Loss Ratio	Loss Ratio Adjustment	Current Relativity	Proposed Relativity
1	\$1,168,125	\$759,281	0.65	1.00	1.00	1.00
2	\$2,831,500	\$1,472,719	0.52	0.80	2.00	1.60

Which class is the higher risk?

# *RETERMINING BATE BELATIVITIES*

#### Advantages of using Loss Ratio

Even one-way loss ratios are inherently multivariate because the premium "takes into account" the rest of the class plan.

- For example, if you look at the relative loss ratios between youthful and adult drivers, the premium within that loss ratio will reflect the current factors for points.
- Because youthfuls have a higher percentage of points, their average premium will be higher due to the higher pointed factors. This will lower the loss ratio. In this way we don't "double count" the effect of points and age.

### **RETERMINING BATE BELATIVITIES**

#### Why aren't one-way loss ratios sufficient?

- One-way studies using loss ratios assume that the rest of the class plan is good. This is a big assumption when there are multiple changes which need to be made.
- Suppose you want to examine the adequacy of both your age and points curves. When you look at loss ratios by age, you are assuming your current points factors are good. Vice versa for when you look at loss ratios by points.
- Univariate studies of any type will also not uncover interactions.

#### Multivariate Loss Ratio Approaches

Machine Learning / Data Mining

- Search the residual space after the existing model has predicted risk.
- · Is there signal that the underlying rates have missed?
- Uses techniques like trees and clustering.
- Can use sampling, bootstrapping, bagging, etc. to understand model stability and enhance model results.
- Prone to over-fitting models. Must make use of unseen validation data to evaluate and select models.

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### **RETERMINING BATE BELATIVITIES**

#### Summary of Approaches for Determining Relativities

Univariate Loss Ratios <ul> <li>Allows for correlation of exposures,</li> <li>but assumes the rest of the class</li> <li>plan rels are correct</li> <li>Ignores interactions</li> </ul>	Univariate Loss Costs <ul> <li>Ignores correlation of exposures</li> <li>Ignores interactions</li> </ul>		
Multivariate Loss Ratios • Explore residual space using an automated routine (trees, machine learning, data mining) • Allows for correlation of exposures • Good at finding interactions • Must validate results	Multivariate Loss Costs           • Build a model from the ground up (GLM, GIA, Minimum Bias)           • Allows for correlation of exposures           • Allows for interactions           • Difficult to explore entire solution space		

### **RETERMINING BATE BELATIVITIES**

#### Summary of Implementation Issues

#### Expense Flattening

Are fixed expenses handled as a separate fee or not?

 Flatten rate relativities if they were determined by looking at losses but will be applied to the loss and fixed expense portion of the premium

#### Rate Impact and Off-Balance

Determine the rate impact of any rate relativity changes.
Off-balance the base rates so that the overall rate change is unaffected.

#### Summary of Risk Classification Purpose & Considerations

- Purposes of a Risk Classification System
- Protect an insurer's financial soundness
- Enhance fairness

Provide an insurer with economic incentive to write large portions of the market

#### Considerations when using a Risk Classification System

- Underwriting & Marketing
- Program designStatistical & Operational considerations
- Hazard reduction, Public acceptability, Causality, and Controllability

# RPM Workshop 1: Basic Ratemaking

#### QUESTIONS?

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