

# Applying Credibility Concepts to Develop Weights for Ultimate Claim Estimators

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Rajesh Sahasrabuddhe Philadelphia



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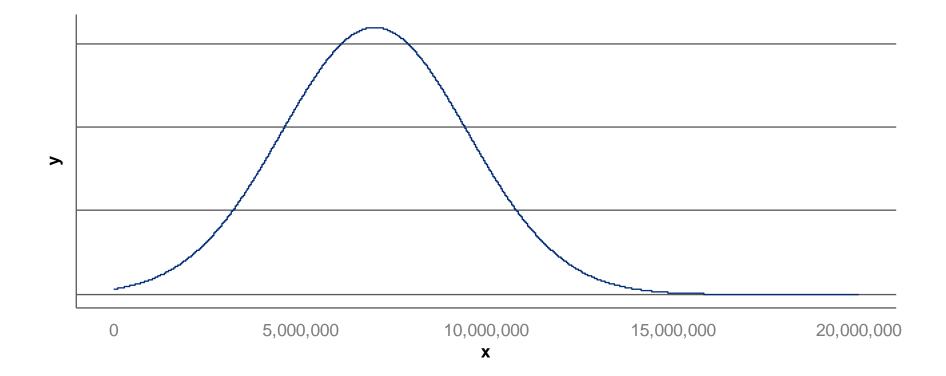
# 1 Current Approach

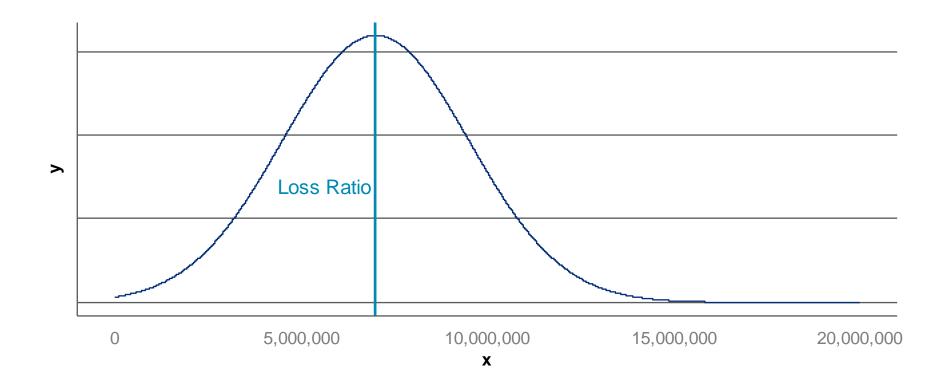
#### Assume the following

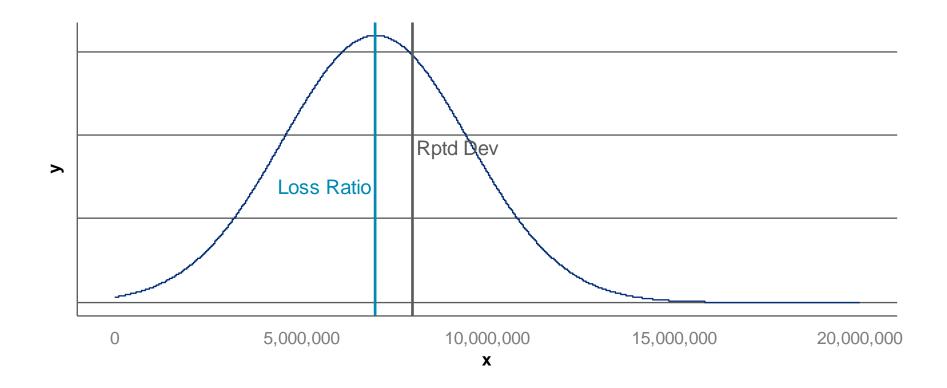
- Premium = \$10 million
- Expected loss ratio = 70%
- Reported claims at 12 months = \$4 million
- Paid claims at 12 months = \$1.5 million
- Reported development factor = 2.00
- Paid development factor = 3.00

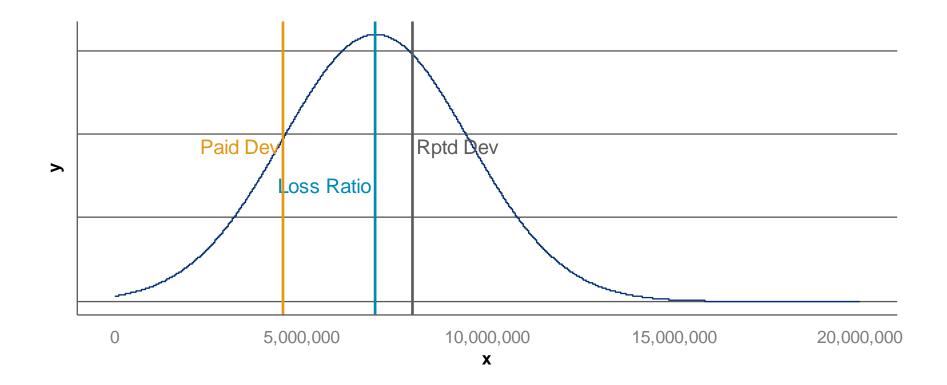
#### Indications

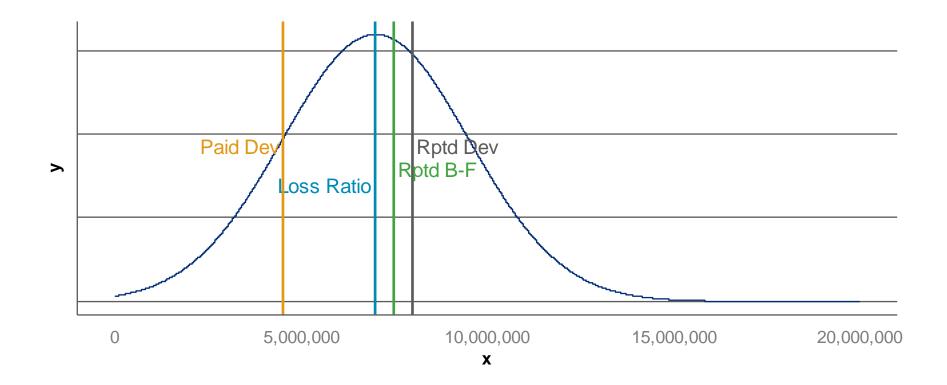
- Loss Ratio Method = \$7.0 million
- Reported Development = \$8.0 million
- Paid Development = \$4.5 million
- Reported B-F = \$7.5 million
- Paid B-F = \$6.2 million

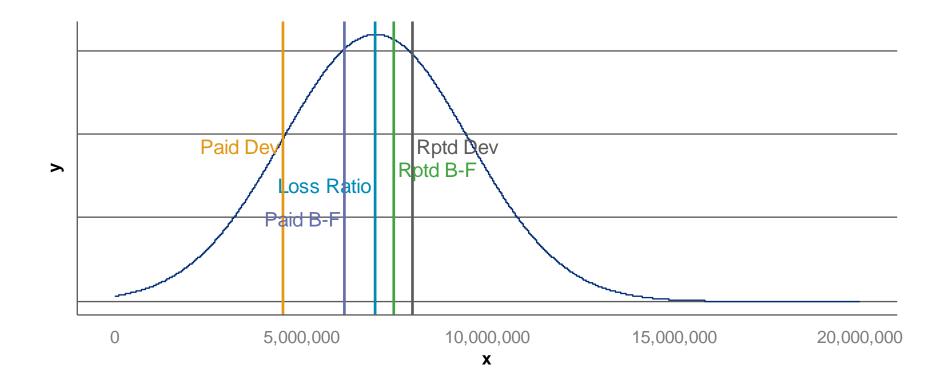






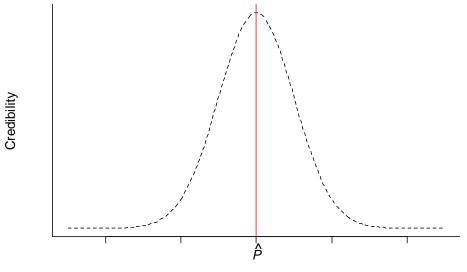






#### The Selected Estimate

- Generally a weighted average of indications
  - Explicit weighting
  - Implicit weighting
- How do actuaries develop the weights?
  - The actuarial judgment function



Estimated Ultimate Claims

2 Proposed Approach

#### Is there another way to combine the estimates

- Each method represents a competing estimator
- Each estimator is (assumed) unbiased
- Credibility?
  - Terminology
  - Measurement
- Simplifying assumptions
  - Symmetric distribution centered around 0: for simplicity, we use only the positive domain of x and consider both tails of the distribution of  $x_1$
  - -F and f to represent the distribution and density functions, respectively, of the residuals

#### Two Method Example

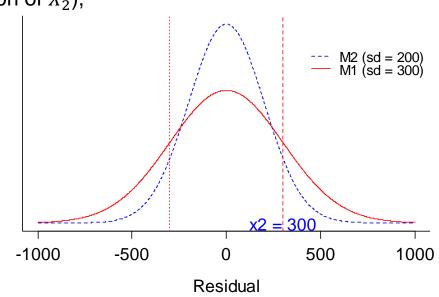
- Paid chain-ladder (Method 1,  $M_1$ )
- Reported incurred chain-ladder (Method 2, M<sub>2</sub>).
- The credibility of the reported incurred chain-ladder is the probability that:

Density

- the error of  $M_2$  (random variable denoted  $X_2$ )

is less than or equal to

- the error of  $M_1$  (random variable denoted  $X_1$ )
- So for any  $X_2 = x_2$  (where  $x_2$  is an observation of  $X_2$ ), we have the following possibilities:
  - *1.*  $|X_1| < |x_2|$  (Credibility to Method 1)
  - 2.  $|X_1| > |x_2|$  (Credibility to Method 2)



# The Credibility Model

- Math Speak:  $Z_2 \div 2 = \int_0^\infty 2[1 F_1(x)]f_2(x)dx$
- English
  - Over the domain of positive values of  $x: \int_0^\infty$
  - the credibility assigned to Method 2:  $Z_2$
  - is the probability that the error of Method 1 is greater than x:  $(1 F_1(x))$
  - or less than  $-x: (1 F_1(x))$  by symmetry
  - $\text{ for all } X_2 = x : f_2(x) dx$
  - The 2 inside the integral provides consideration for both:
    - values of  $X_1 < -x_2$
    - values of  $X_1 > +x_2$
    - For example, if  $x_2 = 100$ , we would assign credibility to Method 2 for
    - $X_1 > 100$  and
    - $X_1 < 100$
  - The 2 on the left-side is necessary as our limits of integration only consider one-half the domain of possible x values.

#### The Credibility Model

• Algebraic Simplification

$$Z_2 \div 2 = \int_0^\infty 2[1 - F_1(x)]f_2(x)dx$$
$$Z_2 = 2 - 4 \int_0^\infty F_1(x)f_2(x)dx$$

- The Limiting Case: Method 1 has no error
- But how do we calculate this?
  - Option 1: Numerical Integration (examples provided with paper on CAS website)
  - Option 2: Simulation (R, @Risk) (sample R code provided in paper)
  - Option 3: Computational integration (R, SAS?) (sample R code provided in paper)

#### Assumptions and Generalization

- Assumptions / Implementation Issues
  - Normality of Residuals: Rehman & Klugman; Central Limit Theorem
  - Calculation of Errors: Look at history, testable relative uncertainty estimates
  - Managements Recorded Estimate: Just another method
- Generalization for *n* methods

$$Z_2 \div 2 = \int_0^\infty 2[1 - F_1(x)]f_2(x)dx$$
  
$$Z_i = \int_0^\infty 2^n \begin{cases} [1 - F_1(x)] \cdots [1 - F_{i-1}(x)] \\ [1 - F_{i-1}(x)] \cdots [1 - F_n(x)] \end{cases} f_i(x)dx$$

- Remove / relax simplifying assumptions: See Appendix
  - Symmetry
  - Centered at 0

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#### **Contact Information**

Rajesh Sahasrabuddhe Oliver Wyman Three Logan Square 1717 Arch Street, Suite 1100 Philadelphia, PA 19103

Phone: +1 215 246 1028 Cell: +1 610 209 0143 rajesh.sahasrabuddhe@oliverwyman.com rajesh1004@gmail.com