## Predictive Modeling for Workers Compensation

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## Agenda

- □ Unique Features of Workers Compensation Insurance
- □ Predictive Modeling for Workers Compensation: Overview of Current Status
- □ Predictive Modeling Challenges Specific to Workers Compensation
- Key Considerations for Workers Compensation Predictive Modeling
- Examples of PM for WC Pricing/UW
- Conclusions

### Uniqueness of WC Insurance

- Benefit or insurance?
  - Workers Compensation = Liability + Healthcare + Disability/Life
- Only know half of the true exposure information
- Highly regulated line of business
- Highly publicized line of business
- Sensitive to external economic development
- □ Risky and cyclical business
- Prone to fraud
- Long tailed
- Unique, independent, and uniform rating structure
- □ Less interaction with other lines of business

### Uniqueness of WC Insurance

- Highly diverse business
  - Many different industries, classes, and types of risks
  - Wide range of policy size
- **□** Fragmented industry
  - No dominant players in the industry
  - National players, regional players, multi-line players, mono-line players
  - State funds are also competitive
- Uniqueness of the product:
  - Highly uniform
  - Rating bureau driven, no independent rating plans
  - Limited flexibility in coverage
  - Limited product and coverage options for competitive strategy (retro, large deductibles, dividends)
  - No territorial rating

# Current Status of Workers Compensation Predictive Modeling

- Across-the-board interest for WC predictive modeling:
  - National carriers, regional carriers, multi-line carriers, mono-line carriers, State Funds.
  - Even excess writers and re-insurers are paying interest in predictive modeling for WC as well
  - Multi-line carriers are interested in growing WC for their accounts

## Current Status of Workers Compensation Predictive Modeling

- PM applications for WC include:
  - Pricing and underwriting
    - □ A significant portion of small business WC is using PM for pricing or underwriting
    - □ Interest starts to spread to middle market segment
    - □ PM may replace past/current competitive tools, such as, large dividends plans, retro products, large deductible products, etc
  - Retention
    - Classical PM application
  - Claim management/fraud
    - □ Return to work program, case management, soft and hard fraud detection, adjuster assignment, bill review, etc
  - Premium audit/premium leakage
    - □ Natural application of using PM for premium audit

## Challenges for Workers Compensation Predictive Modeling

#### □ Data challenges:

- Data quality
  - □ Generally low data quality for commercial line insurance
- Experience of IT support for WC predictive modeling data (also for commercial lines in general)
- Limited exposure, business, and risk characteristics available for prediction
- Lack of "account view" for multi-line carriers
- For some multi-line carriers, WC is a "secondary" or "addon" business for a commercial account.

# Challenges for Workers Compensation Predictive Modeling

- Model design challenges:
  - Exposure/pure premium modeling approach challenges:
    - □ Hundreds of industry class rates by state
    - □ Limited amount of data for modeling
    - Modeling "severity" is challenging
  - Policy level/loss ratio modeling approach challenges:
    - □ "Mixed" distribution for loss ratio Tweedie distribution?
    - □ Wide range of policy sizes
    - □ Actual premium vs. on-leveled premium
  - Long tailed loss development
  - Lack of predictive variables for modeling
  - Implementation challenges

# Challenges for Workers Compensation Predictive Modeling

- Implementation challenges
  - Pricing implementation challenges:
    - □ Can have independent class plan and class rates?
    - □ Other pricing options?
  - Underwriting implementation challenges:
    - □ How to interpret the models results?
    - □ How to implement the models through underwriting actions?
      - Credit/debits vs. Company Placement vs. Cancellation?
  - System implementation challenges:
    - □ Challenges if models include "non-traditional" variables
  - Business implementation challenges: operation, new business writing, renewal cycle, agency management, etc.

### Key Considerations for Workers Compensation Predictive Modeling

- □ Carefully design the models:
  - Clearly define the goal:
    - class plan optimization, pricing, or UW? Consider business and implementation factors
- Enrich the list of predictive variables:
  - External data sources such as business, crime, demographic, etc
  - Account variables (non WC variables)
  - Non-traditional variables
  - "Creative" variables

## Key Considerations for Workers Compensation Predictive Modeling

- □ It is not just a statistical or technical exercise
  - Need to understand the business issue and the data issue
    - □ "prediction" patterns may be different between regional vs. national, multi-line vs. mono-line, private carriers vs. state fund etc.
  - In-depth reasonability check
    - □ Is the result "reasonable"?
    - □ Avoid "ivory tower" modeling approach
  - In-depth diagnostic check

## What will You Do with Territorial Finding?

- □ File rating territories to insurance departments
- □ Ask rating bureaus to create rating territories
- Use it in underwriting, such as company placement or credit/debit
- Ask marketing department and product managers to write more in the good territories
- Do nothing

#### **Conclusions**

- WC is a fairly unique line of business and is difficult to model compared to other lines
- However, with careful model design, Workers Compensation models can be as powerful as other insurance models (such as credit score model) and can bring significant values to the industry
- Longer term impact of predictive modeling on the Workers Compensation industry may include:
  - More in-depth understanding of exposures and risks
  - More pressure on less sophisticated carriers
  - Underwriting cycle may be minimized winners vs. losers
  - More independence from Rating Bureaus
  - More pressure on Rating Bureaus for additional services for their members
  - Enhanced data collection and continuing search for powerful variables
  - Traditional pricing and UW will be challenged
- Be creative, be careful, and avoid "ivory tower" modeling