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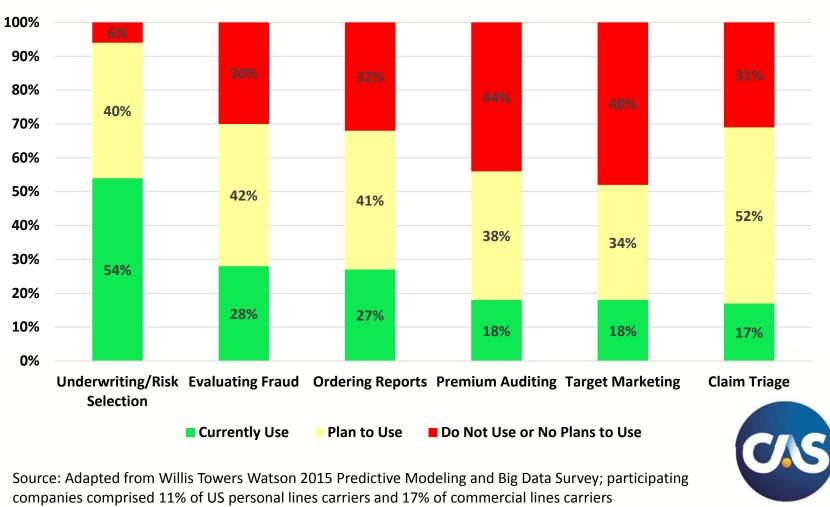
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Agenda

- Trends in usage of predictive analytics in insurance
- Questions the underwriter should ask the data scientist
- Questions the data scientist should ask the underwriter
- Collaboration beyond single projects
- Questions

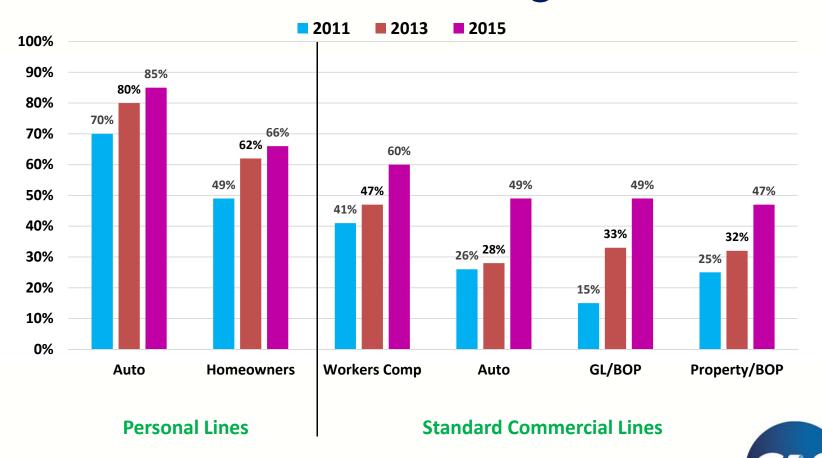


Industry Usage of Predictive Modeling



(www.towerswatson.com).

Predictive Modeling for Risk Selection and Pricing





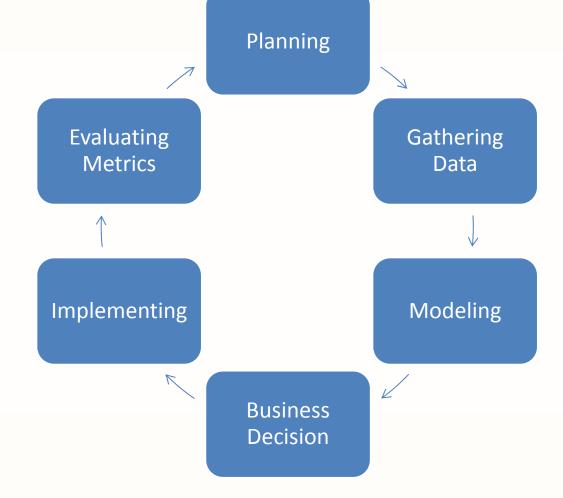


What Should the Underwriter Ask the Data Scientist?

- What does the process look like?
- What does the model take into account?
- Can you prove to me the model actually works?
- What does the model do to my book of business?
- Miscellaneous?



Overall Process





Modeling Process

iterate



Build statistical model Discuss with business owners

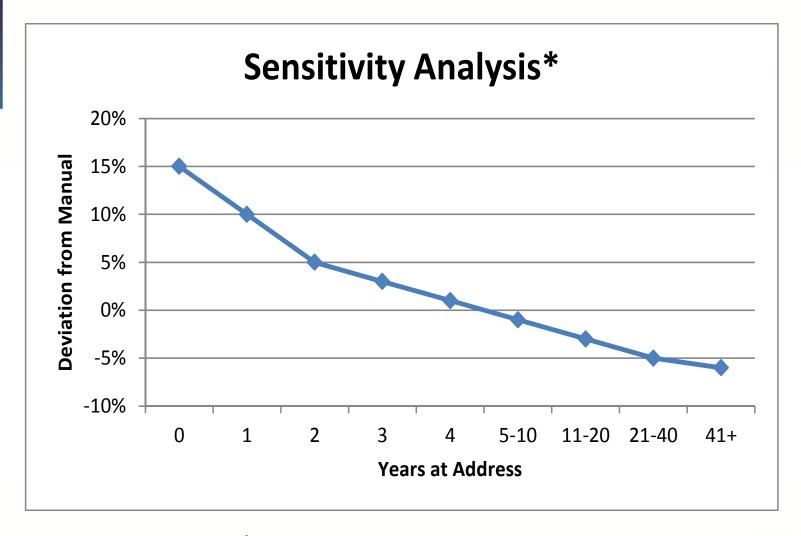
Evaluate final model on holdout data

Re-estimate model on full data



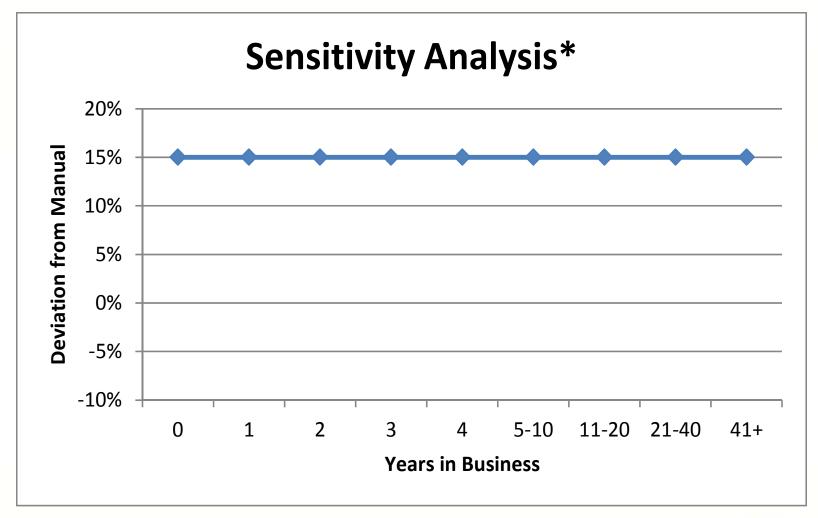
iterate





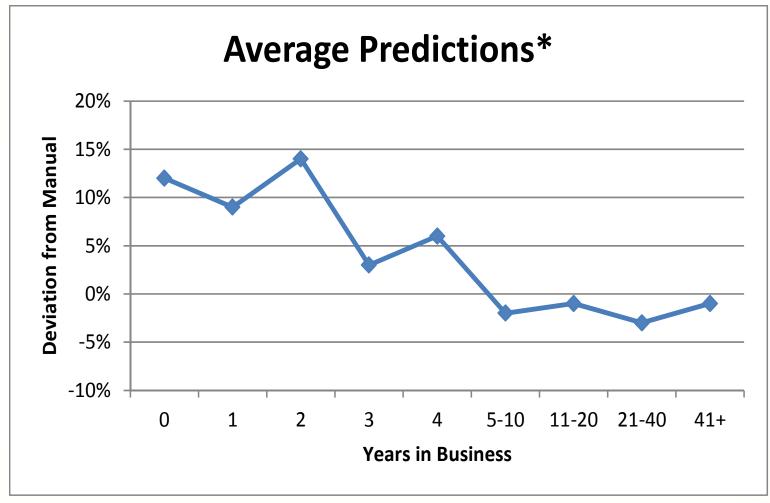
^{*} For a Foundry with \$10M annual revenue, no late payments, no recent claims...





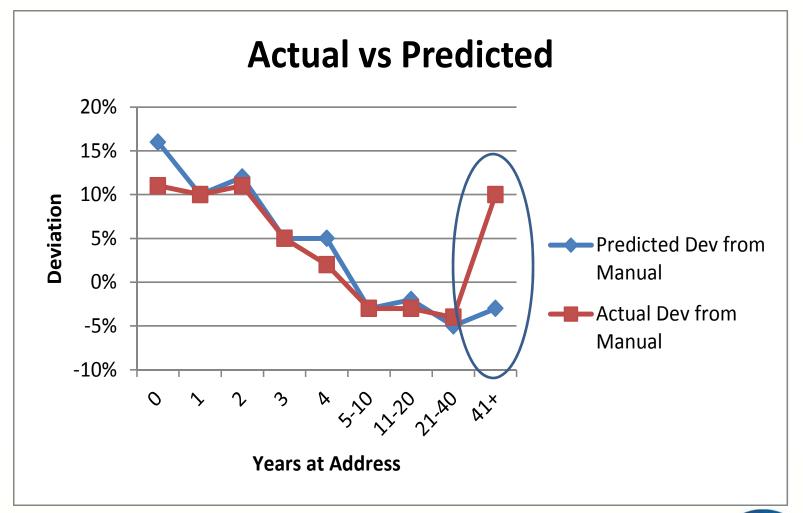
^{*} For a foundry with \$10M annual revenue, no late payments, no recent claims, zero years at address...





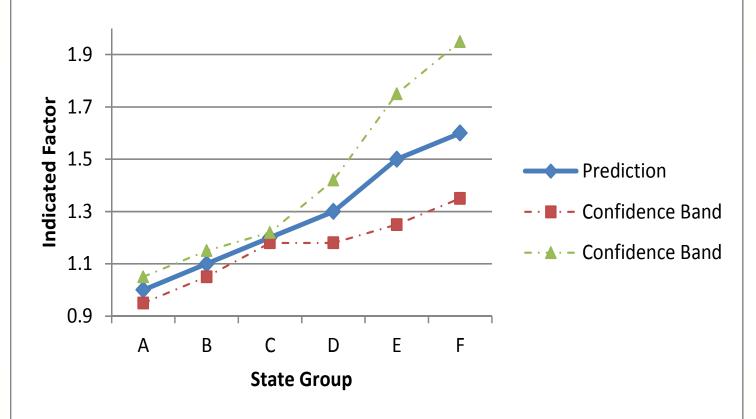
^{*} Average across all risks on the book



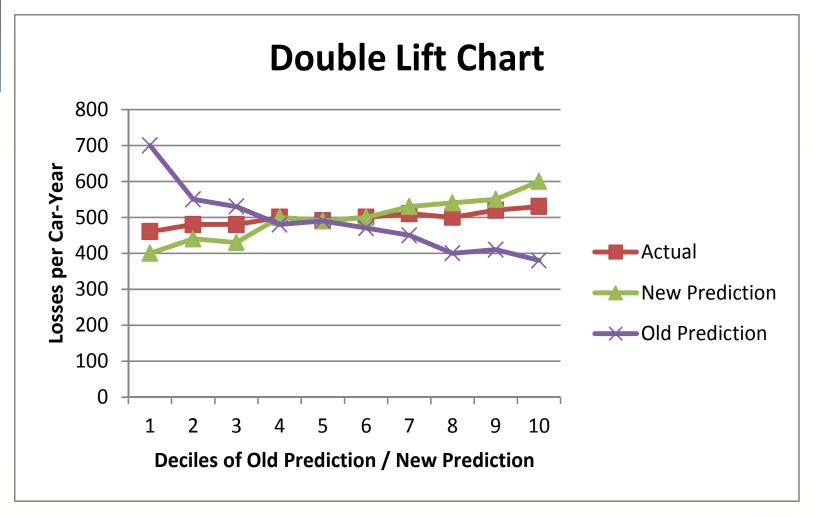




Confidence Bands for Factors



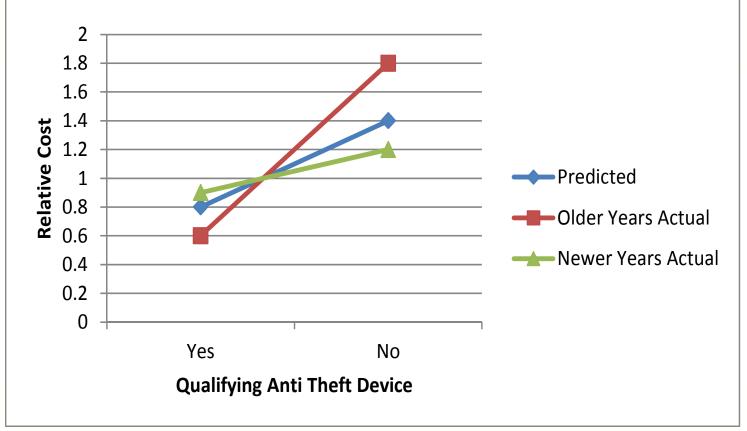




^{*} For data not used in fitting either model



Older vs Later Years





Change in Mix

- Suppose we model on mature years 2007-2014
 - Identifies that accounts in SIC abcd are terrible...need a 100% surcharge
 - In 2015-2016, book was re-underwritten and SIC abcd, which used to be 10% of the book, is no longer represented.



Change in Mix

- If we off-balance to keep same rate level
 - Old rate level 500
 - New rate must average 500
 - No abcd left in book
 - So new rate for everything else is 500

- If we balance for the book we modeled
 - Old rate level 500
 - Should have been charging abcd 950 and everyone else 450
 - So new rate for everything else is 450



Disruption

Branch	Volume	% Change from Current Indicated	% Indicated Change from Charged
Boston	900	-30%	-15%
NYC	2,000	-10%	-10%
Philly	400	10%	5%
DC	600	5%	-5%
Charlotte	1,200	-10%	-15%
Atlanta	700	0%	40%
Miami	2,000	26%	5%
Total	7,800	0%	-2%



What Should the Data Scientist Ask the Underwriter?

- Which facts about customers matter?
- What third-party data is already in use by underwriters?
- What issues are they experiencing in the marketplace?



What Should the Data Scientist Ask the Underwriter?

- What should be provided to the tactical decision-maker?
 - Reason codes (color coded)
 - Comparison to similar risks
 - Soliciting feedback from the field



What Should the Data Scientist Ask the Underwriter?

- What does the new business transaction look like and are there challenges that may make collected data in the future different from the past?
 - What is known when in the underwriting process
 - Shifting of reporting of data elements
 - Technological advancements
 - Privacy and legal issues
 - Digital competitors and distribution

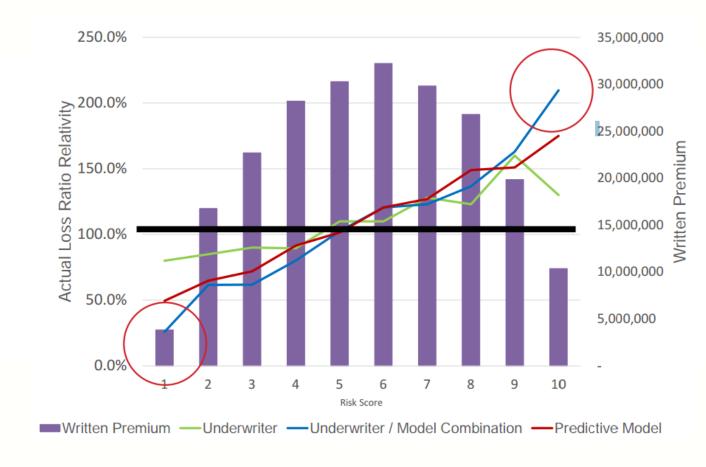


What Should the Data Scientist Ask the Underwriter?

- What business is desired to be written in the future?
 - Broaden risk appetite
 - Launch new products
 - Offer differentiated coverages
 - Expand geographic reach

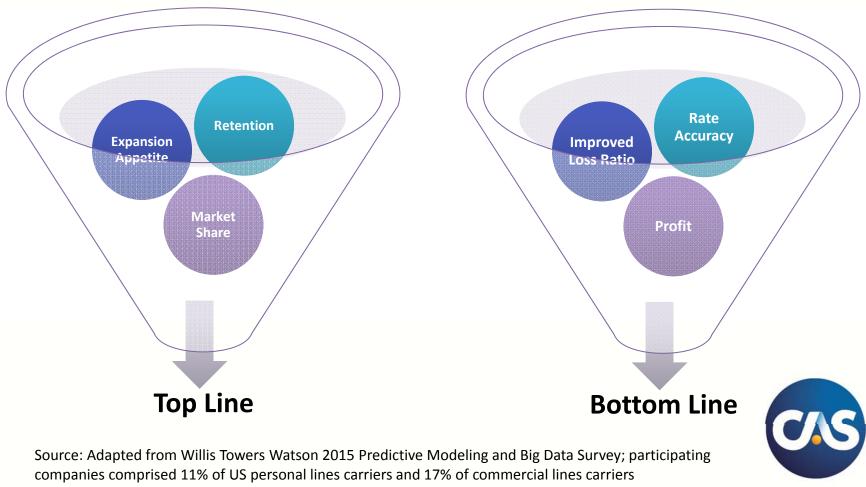


Predictive Power Comparison





Impact of Predictive Modeling on Top and Bottom Lines



(www.towerswatson.com).

Collaboration Beyond Individual Projects

- Identifying niches in market where an information edge can be built over competitors
- Working together to build that edge



Questions?