Survey of External Data Possibilities for Commercial Insurance

2015 CAS Ratemaking and Product Management Seminar

Commitment Beyond Numbers



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Discussion Topics

- Data Considerations
- Data Sources
 - Public Rate Filings
 - Commercial Credit
 - Geodemographic Data
 - Commercial Auto Segmentation
 - Telematics and Usage-Based Insurance
- Emerging Data Trends



Data Considerations

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Applications using external data

Predictive Analytics

- Requires granular data that can be linked to internal data generally at the policyholder or zip code level
- Time match is important
- Consider whether external data is intuitively related to loss costs
- Capital Modeling/Forecasting
 - The variability of future estimates should be understood
 - Government sources are readily available and generally best for most applications
- Underwriting
 - Similar to predictive analytics but less structure required
 - Data should be available on demand for U/W use



Evaluating external data sources

- Applicability Is the data applicable to your analysis?
- Availability Will the data be available if used as part of a production environment?
- Maintenance Will the data need to be maintained and housed internally?
- Matching How will the data be linked to internal data?
- Value Is the cost in terms of \$ and/or resources worth the benefit achieved?

Data Sources

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Public Rate Filings Data

- Multiple sources including DOI websites and vendors
- Particularly useful for predictive analytics applications
- Rate Filing data includes:
 - Scorecard elements
 - Tier factors
- Caution! Look for variables and magnitude, specific factors may not be applicable to your book of business



Commercial Auto Scorecard Example

Based on the following risk characteristics:

- MVR Information
- 2. Average Driver Age
- 3. Youthful Composition
- 4. Length of Credit History,
- 5. Total Number of Trades
- Percentage of Balance Overdue of All Trades
- 7. Total Balance of Regular Trades
- 8. Number of Public Records / Collections
- 9. Amount of Judgment
- 10. Average Number of Days Balance Overdue in the Past 3 Months
- 11. Number of Inquiries in the Past 9 Months
- 12. Years in Business (when financial information is not available)
- 13. Industry Classification
- Percentage of TTT Power Units
- 15. Prior 3-Year Loss Frequency by Size of Risks
- 16. Other risk-specific characteristics that are not contemplated above

use the applicable tier factor as a final step prior to rounding to determine the final rates.



Commercial Auto Tier Factors – Example 1

Tier	Factor	Tier	Factor		Tier	Factor
1	0.40	18	0.81		35	1.66
2	0.42	19	0.85		36	1.73
3	0.43	20	0.89		37	1.81
4	0.45	21	0.92		38	1.88
5	0.47	22	0.96		39	1.96
6	0.49	23	1.00		40	2.05
7	0.51	24	1.05	-	41	2.13
8	0.54	25	1.09		42	2.23
9	0.56	26	1,14		43	2.32
10	0.58	27	1.19		44	2.42
11	0.61	28	1.24		45	2.52
12	0.63	29	1.29		46	2.63
13	0.66	30	1.35		47	2.74
14	0.69	31	1.40		48	2.86
15	0.72	32	1.46		49	2.98
16	0.75	33	1.53		50	3.11
17	0.78	 34	1.59			

UNINSURED/UNDERINSURED MOTORISTS Factor is 1.00.



Commercial Auto Tier Factors – Example 2

C. TIERED RATING

 Tier is determined at policy inception, renewal or anniversary based on the following characteristics. Number of "power units", length of time insured with company, accident history, age of driver(s), Motor Vehicle Record of driver(s), management safety ranking, and driver retention.

Tiered Rating Multipliers

TIERED RATING MULTIPLIERS									
Tier	Multiplier	Tier	Multiplier	Tier	Multiplier	Tier	Multiplier	Tier	Multiplier
1	0.401	10	0.557	19	0.774	28	1.076	37	1.495
2	0.416	11	0.578	20	0.803	29	1.116	38	1.551
3	0.431	12	0.599	21	0.833	30	1.158	39	1.609
4	0.447	13	0.622	22	0.864	31	1.201	40	1.669
5	0.464	14	0.645	23	0.896	32	1.245	41	1.731
6	0.481	15	0.669	24	0.929	33	1.292	42	1.795
7	0.499	16	0.694	25	0.964	34	1.340	43	1.862
8	0.518	17	0.719	26	1.000	35	1.390	44	1.932
9	0.537	18	0.746	27	1.037	36	1.442	45	2.004



BOP Tier Factors Example

Master Pac Tier Rating Factors

Pricing	Pricing	Pricing	Pricing
Track	Factor	Track	Factor
1	.52	21	1.14
2	.55	22	1.16
3	.58	23	1.20
3 4	.61	24	1.25
5	.64	25	1.30
6	.67	26	1.35
7	.70	27	1.40
8	.73	28	1.45
9	.76	29	1.50
10	.79	30	1.60
11	.82	31	1.70
12	.85	32	1.80
13	.88	33	1.90
14	.91	34	2.00
15	.94	35	2.10
16	.97	36	2.25
17	1.00	37	2.40
18	1.03	38	2.55
19	1.06	39	2.70
20	1.10	40	2.85

Tier elements include

- Claims history
- Years in business
- Insured value
- Credit data
- Pay Plan/History
- Many others....



BOP Scorecard Example – Part 1

Risk Characteristic Pricing Element	Response	Point Value
Years in Business at this Location	New in Business	5
	Less than 1 Year	4
	1-2 Years	3
	2-3 Years	1
	3-4 Years	0
	4-5 Years	-1
	5-6 Years	-2
	6 Years or More	-3
Description for Destrict 1 -1	Yes	2
Responsible for Parking Lot	No	0
	25 Years or More	4
Wiring Year	20-24 Years	0
	11-19 Years	-2
	10 Years or Less	-4



BOP Scorecard Example – Part 2

		1 707
Location of Business	Attached to Habitational Structure	10
	Stand-alone Building	3
	Strip Shopping Center	0
	Enclosed Mall	-3
Hours of Operation Open to Public	21-24 Hours	10
	16-20 Hours	5
	12-15 Hours	0
	Less than 12 Hours	-5
Percentage of Sales from Catering Services	Over 10%	10
	1-10%	5
	None	0
Total Percent of Sales from Liquor Sales	More than 20%	5
	1-20%	2
	None	0
Orive Thru	Yes	0
Dilag Lind	No	0



Public Rate Filings Considerations

- Applicability Rate filings can provide perspective on variables used and magnitude of score factors
- Availability When viewed as a tool for guidance, competitor rate filings can be reliable.
- Maintenance Regular maintenance and monitoring of competitor filings is required to keep up with revisions
- Matching Look for scorecards and competitors that align with your book of business
- Value Dollar cost is relatively low but filing research can be labor intensive.

Commercial Credit Data Overview

- Two main vendors:
 - Experian
 - Dun and Bradstreet
- Data Elements include:
 - Business summary (year started, number of employees, industry)
 - Financial information (sales, assets)
 - Payment history and trends (aging, late payments)
 - Public record filings (liens, judgments, UCC filings, bankruptcies)
 - Proprietary scores (Intelliscore, Paydex)
- Commercial credit assumes that financial strength and credit risk is related to insurance risk

Commercial Credit Data Challenges

- A large number of highly correlated variables
 - Number of trades 30–60 DBT and Number of trades 60–90 DBT
- Individual variables may not have an intuitive relationship to loss
 - Number of UCC filings
 - Number of trades 30+ DBT
- Data may not be available for small risks
- Use commercial credit score or develop specific insurance risk score?
- Lift is less significant relative to internal variables
- Commercial credit terminology and relationship between variables may be unfamiliar



Commercial Credit Data Considerations

- Applicability Financial strength and credit risk are linked to insurance risk
- Availability Credit vendors provide on-demand reports and have established track records
- Maintenance Credit data obtained via individual reports will need to stored and any insurer models updated regularly
- Matching Generally a match to policyholder and time period can be made under certain assumptions. Small risks may not have a credit report on file
- Value Commercial credit shows less lift than internal variables but still significant. Also is typically already used as part of the underwriting process therefore justifying the costs of the report

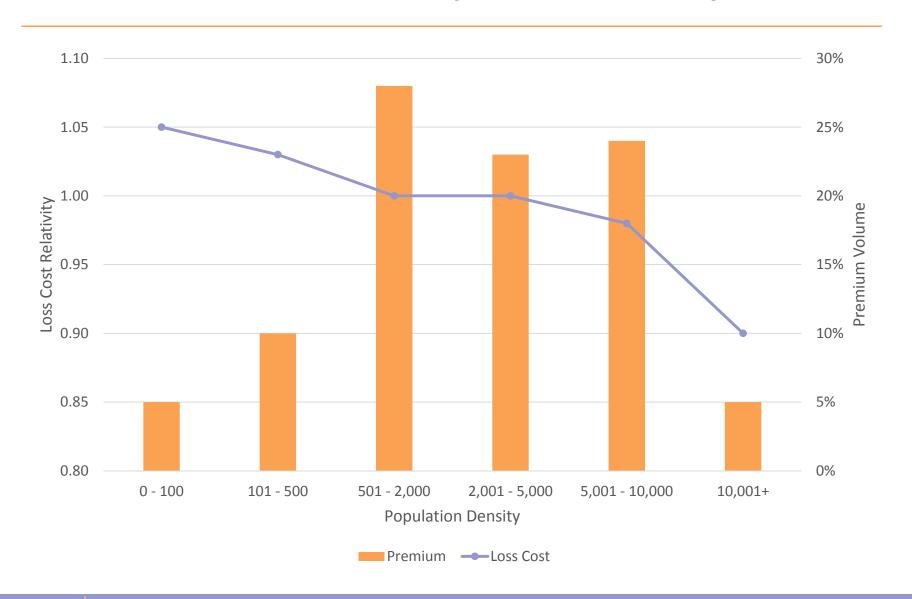
Geodemographic Data Overview

- Public Sources:
 - US Census Bureau
 - Bureau of Labor Statistics (detail at both national and state level)
- Data elements include:
 - Population summaries by age, sex, household size, education
 - Housing information regarding size, value, owner/renter and vacancies
 - Income summaries and distributions
 - Consumer expenditures
 - Workplace injury statistics
 - Economic indicators such as unemployment and productivity
- Can be viewed as an enhancement to territories

Geodemographic Data Challenges

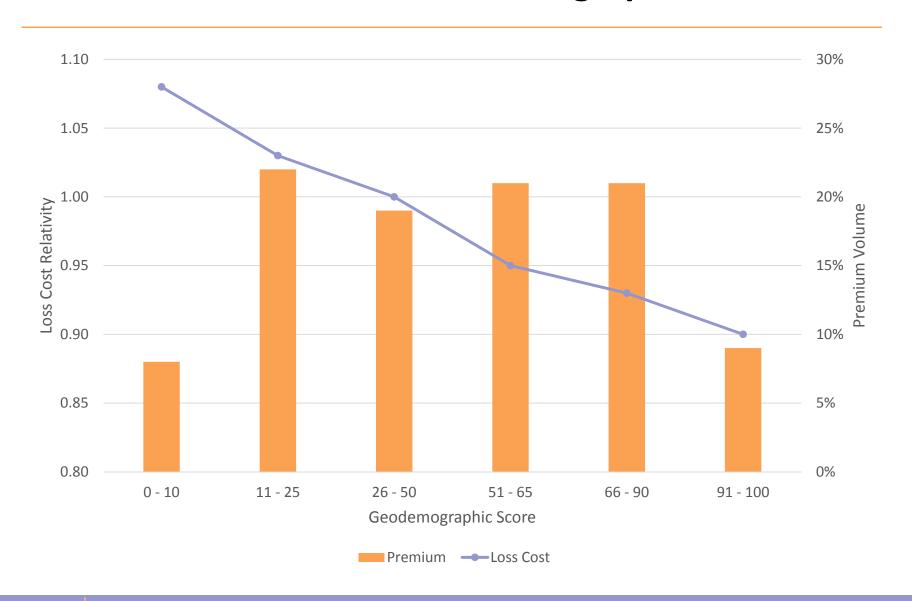
- A large number of highly correlated variables
 - Median Age and Median Income
- Individual variables may not have an intuitive relationship to loss
 - Proportion of public transportation users
 - Proportion of vacant housing units
 - Proportion of households with no cars
- Publically available data can be difficult to work with
 - Data structure needs to be understood
 - Many vendors sell compiled data
- Lift is tepid relative to other variables

Illustrative Lift Chart of Population Density





Illustrative Lift Chart of Geodemographic Score





Geodemographic Data Considerations

- Applicability Can be thought of as an enhancement (or introduction) to territory factors
- Availability Data will need to stored within internal systems
- Maintenance Changing demographics means that the data will need to be updated regularly
- Matching Generally a match to zip code and time period can be made
- Value While lift is generally tepid, cost is relatively low making geodemographic variables attractive as an external data source



Commercial Auto Segmentation Data

- VIN Decoding
 - Well established process
 - New products related to trailers, equipment modifications, etc.
- MVRs
 - Several vendors
 - Key question Ordering Protocols Who? How often?
- Prior Claims
 - Commercial C.L.U.E. gaining traction

Highway Loss Data Institute (HLDI) Data

- Affiliated with Insurance Institute for Highway Safety
- Focus on reducing the losses from crashes
 - Type of Vehicle
 - Coverage-level
 - Safety Features
- Public Information & ratings
- Potential uses:
 - Vehicle Segmentation & Symboling
 - Policy Discounting
 - Vehicle Safety Outlook Risk Management
 - Impact of Legislative Changes



HLDI Composite – Losses by Class

FOUR-DOOR CARS ▼ Results for model year 2011-13 ▼ MIDSIZE ▼ Personal Bodily Medical Property Compreinjury Collision hensive injury Vehicle damage payment (3) Acura TSX Buick Verano Chevrolet Malibu Chrysler 200 Dodge Avenger Ford Fusion 2WD Ford Fusion 4WD Ford Fusion hybrid Honda Accord Hyundai Sonata Hyundai Sonata hybrid Kia Optima Kia Optima hybrid Mazda 6 Nissan Altima Nissan Maxima Subaru Legacy 4WD Subaru Legacy with Eyesight 4WD



HLDI Composite – Best & Worst

Lowest overall losses: Collision

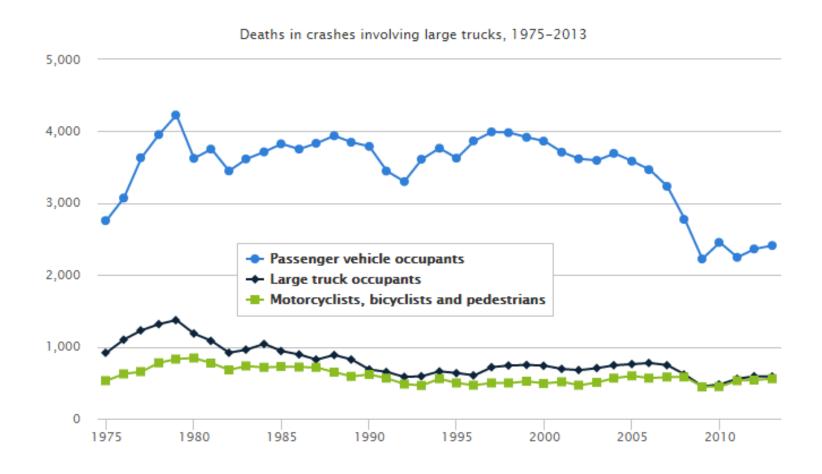
Vehicle	Vehicle size and class	Overall losses
Jeep Wrangler 2dr SWB 4WD	Small SUV	51
Jeep Wrangler 4dr 4WD	Midsize SUV	57
Ford F-250 super cab 2WD	Very large pickup	58
Smart ForTwo convertible	Micro two-door car	59
Ford F-150 4WD	Large pickup	60
Chevrolet Suburban 2500 4dr 4WD	Very large SUV	61
Dodge Ram 1500 LWB 2WD	Large pickup	61
Dodge Ram 1500 LWB 4WD	Large pickup	61
Ford F-150 2WD	Large pickup	61
Ford F-250 4WD	Very large pickup	61

Highest overall losses: Collision

Vehicle	Vehicle size and class	Overall losses
Ferrari 458 Italia 2dr	Midsize sports car	546
Bentley Continental GT 2dr	Very large luxury car	517
Ferrari California convertible	Midsize sports car	427
Maserati Granturismo convertible	Large sports car	405
Maserati Quattroporte 4dr	Very large luxury car	404
Bentley Continental GTC convertible	Very large luxury car	394
BMW X6 M 4dr 4WD	Midsize luxury SUV	380
Porsche Panamera turbo 4dr 4WD	Large sports car	353
Maserati Granturismo 2dr	Large sports car	322
Nissan GT-R 2dr 4WD	Midsize sports car	318



HLDI – Fatality Information





Calendar year features reach 95% of registered vehicle fleet with and without mandate

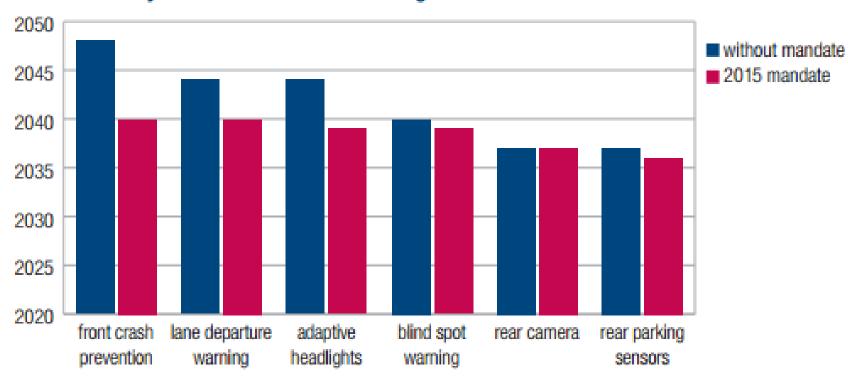
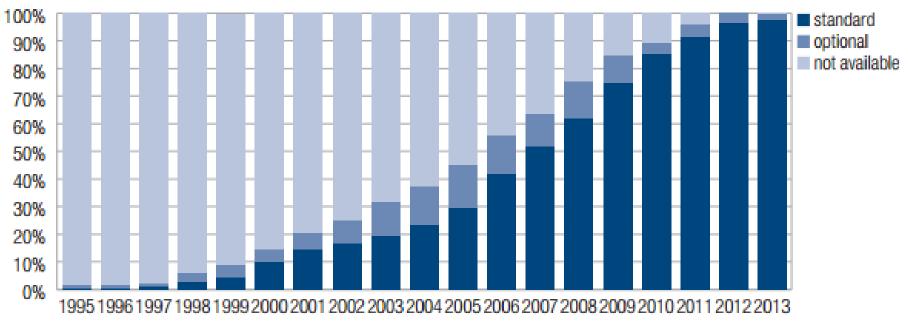




Figure 1: Percentage of new vehicle series with ESC



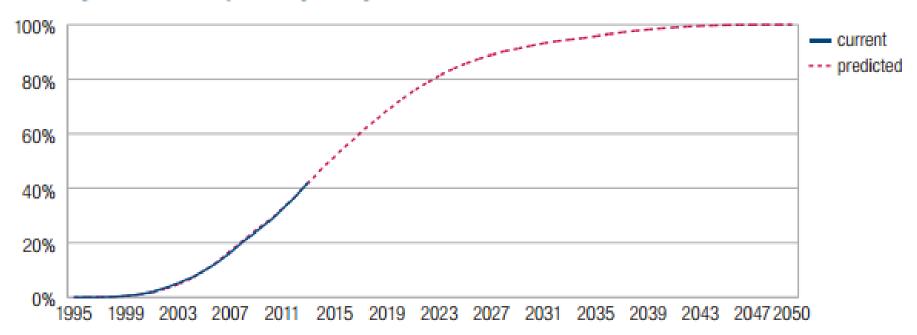


100% 90% 80% 70% 60% 50% 40% 1995199619971998199920002001200220032004200520062007200820092010201120122013

Figure 2: Percentage of registered vehicles with ESC



Figure 3: Predicted percentage of registered vehicles with ESC



100% standard 90% optional 80% not available 70% 60% 50% 40% 30% 20% 10% 0% 2000 2001 2002 2003 2004 2005 2006 2007 2008 2009 2010 2011 2012 2013

Figure 7: Percentage of new vehicle series with front crash prevention

Figure 8: Percentage of registered vehicles with front crash prevention

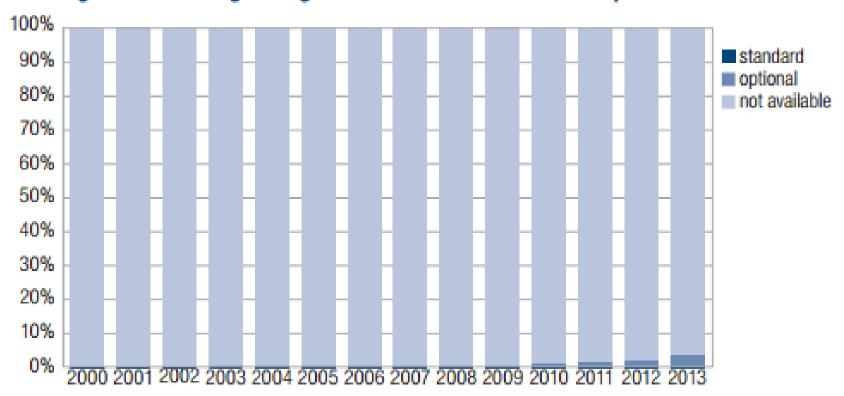
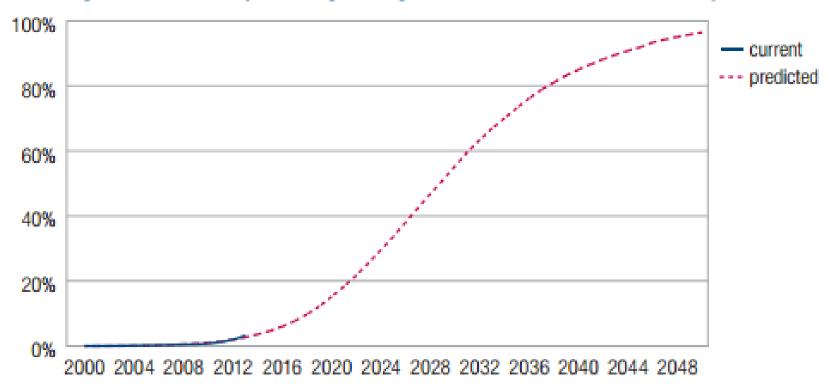




Figure 9: Predicted percentage of registered vehicles with front crash prevention



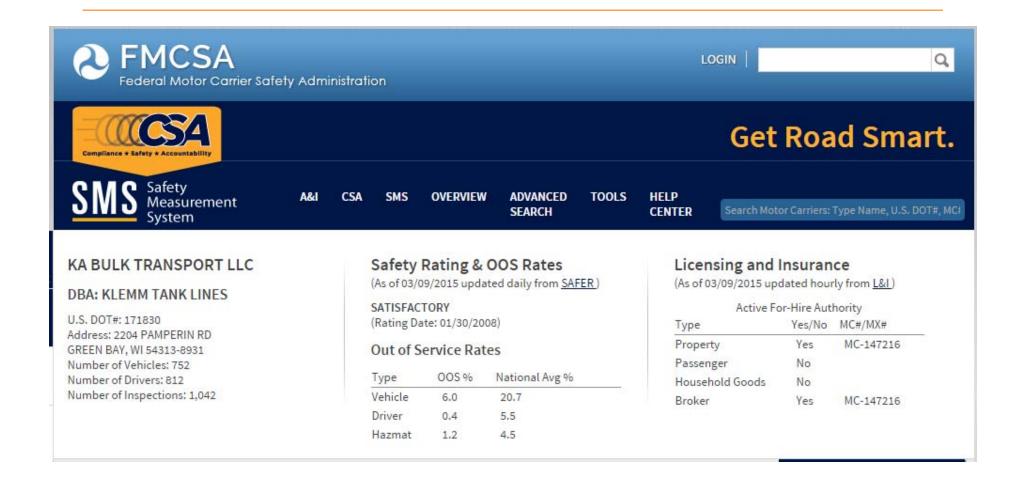


Safety Measurement System (SMS)

- Sponsored by Federal Motor Carrier Safety Administration
- Replaced prior SAFER program
- Scores companies in several categories
 - Unsafe Driving (Speeding, reckless, lane changes)
 - Fatigued Driving/Hours of Service
 - Driver Fitness/Training
 - Controlled Substances/Alcohol
 - Vehicle Maintenance
 - Cargo-Related (Spills, HazMat)
 - Crash Experience
- Publicly Available



SMS Overview





SMS Carrier Registration Detail

Comica Desistantica Informatica on of Morela 02, 2040

Carrier Registration Information as of March 23, 2012						
Legal Name: DBA Name:	Ka Bulk Transport Llc Klemm Tank Lines	Vehicle Miles Traveled: VMT Year:	43,900,000 2010			
DOT#:	171830	Power Units:	592			
MC or MX#:	MC-147216	DUNS Number:	2-320-3300			
Address:	2204 Pamperin Rd Green Bay, WI 54313-8931	Drivers: Carrier Operation:	665 Interstate			
Telephone:	(920) 434-6343	Passenger:	No			

Fax: (800) 553-6329 Subject to Placardable HM Threshold: Yes
Email: teresas@klemmtanklines.com HHG: No
New Entrant No

Operation Classification:

X AUTHORIZED FOR HIRE EXEMPT FOR HIRE PRIVATE PROPERTY

PRIVATE PASSENGER, BUSINESS PRIVATE PASSENGER, NON-BUSINESS MIGRANT

U. S. MAIL FEDERAL GOVERNMENT STATE GOVERNMENT STATE GOVERNMENT

LOCAL GOVERNMENT INDIAN TRIBE OTHER

Cargo Carried:

HOUSEHOLD GOODS GENERAL FREIGHT METAL; SHEETS, COILS, ROLLS MOTOR VEHICLES DRIVE AWAY/TOWAWAY LOGS, POLES, BEAMS, LUMBER BUILDING MATERIALS MOBILE HOMES MACHINERY, LARGE OBJECTS FRESH PRODUCE X LIQUIDS/GASES INTERMODAL CONTAINERS PASSENGERS OIL FIELD EQUIPMENT LIVESTOCK GRAIN, FEED, HAY COAL, COKE MEAT GARBAGE, REFUSE, TRASH U.S. MAIL X CHEMICALS COMMODITIES DRY BULK X REFRIGERATED FOOD BEVERAGES PAPER PRODUCTS UTILITY FARM SUPPLIES CONSTRUCTION WATER WELL OTHER



SMS BASIC Information

Behavioral Analysis & Safety Improvement Categories (BASIC)



BASIC Status (Public View)









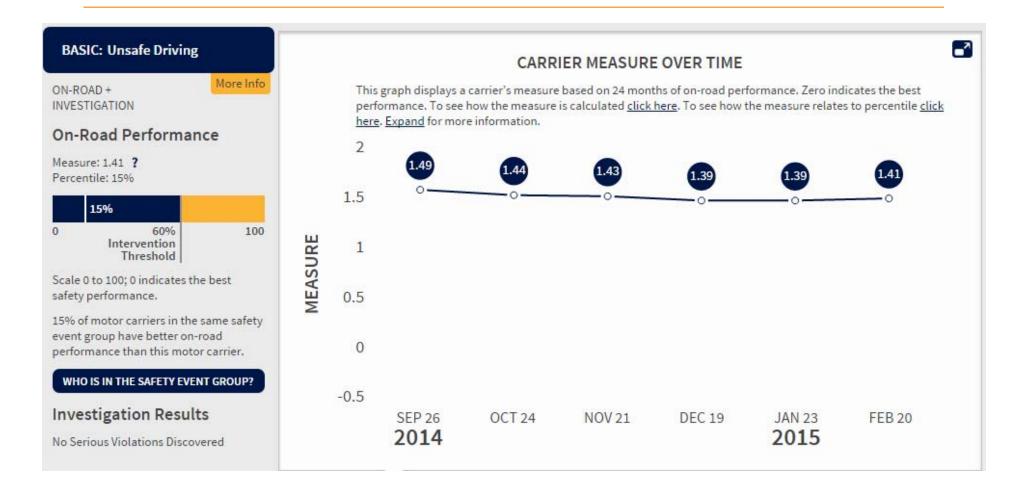
Based on a 24-month record ending February 20, 2015



On-Road Performance											
1.41 Measure		0.06 Measure	1.61 Measure	O Measure		0 Measure					
15% Percentile	NOT PUBLIC	15% Percentile	22% 0% Percentile Percentile		NOT PUBLIC	3% Percentile					
Investigation Results											
No Serious Violations Discovered	N/A	No Serious Violations Discovered	No Serious Violations Discovered	No Serious Violations Discovered	NOT PUBLIC	No Serious Violations Discovered					



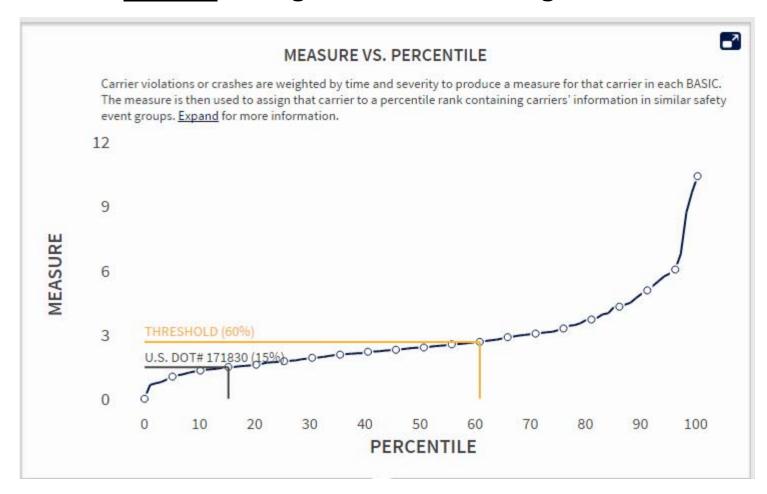
SMS Scoring





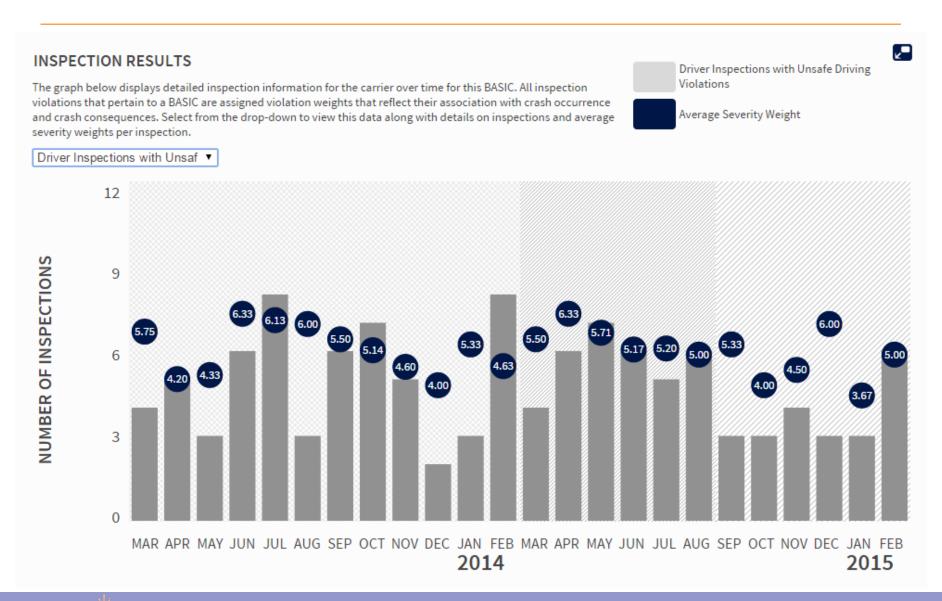
SMS Driving Information

Focus on <u>unsafe</u> driving incidents including Accidents





SMS Unsafe Driving Detail





SMS Unsafe Driving Detail

UNSAFE DRIVING VIOLATIONS

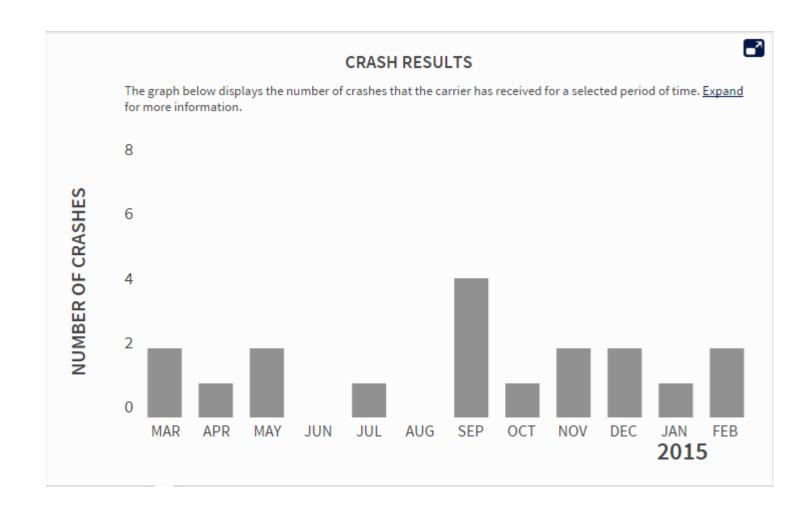
Violatio	Description	# Total Violations	# OOS Violations	Violation Weight
392.16	Failing to use seat belt while operating CMV	25	0	7
392.2C	Failure to obey traffic control device	10	0	5
392.2FC	Following too close	9	0	5
392.2LC	Improper lane change	6	0	5
392.2LV	Lane Restriction violation	3	0	3
392.2P	Improper passing	1	0	5
392.2R	Reckless driving	1	0	10
392.2S	Speeding	39	0	5
392.2-SLLS1	State/Local Laws - Speeding 1-5 miles per hour over the speed limit	18	0	1
392.2-SLLS2	State/Local Laws - Speeding 6-10 miles per hour over the speed limit	17	0	4
392.2-SLLS3	State/Local Laws - Speeding 11-14 miles per hour over the speed limit	1	0	7
392.2-SLLSWZ	State/Local Laws - Speeding work/construction zone	1	0	10
392.2Y	Failure to yield right of way	2	0	5
392.71(a)	Using or equipping a CMV with radar detector	1	0	5
397.13	Smoking within 25 feet of HM vehicle	1	0	1

INSPECTION HISTORY

Report				Vehicle			Measure			
	Inspection Date	#	ST	Plate #	Lic ST	Туре	Severity Weight (A)	Time Weight (B)	Time Severit Weight (AxB)	
1	2/27/2012	WI2224001581	WI	54914W	WI	Truck Tractor	7	3	21	
	Violation: 392.16 Failing to use seat belt while operating CMV (Non-OOS) 7									
2	2/25/2012	MO00SD016139	MO	20301W	WI	Truck Tractor	4	3	12	
Г	Violation: 392.2-SLLS2 State/Local Laws - Speeding 6-10 miles per hour over the speed limit (Non-OOS) 4									



SMS Crash Detail





Usage-Based Insurance

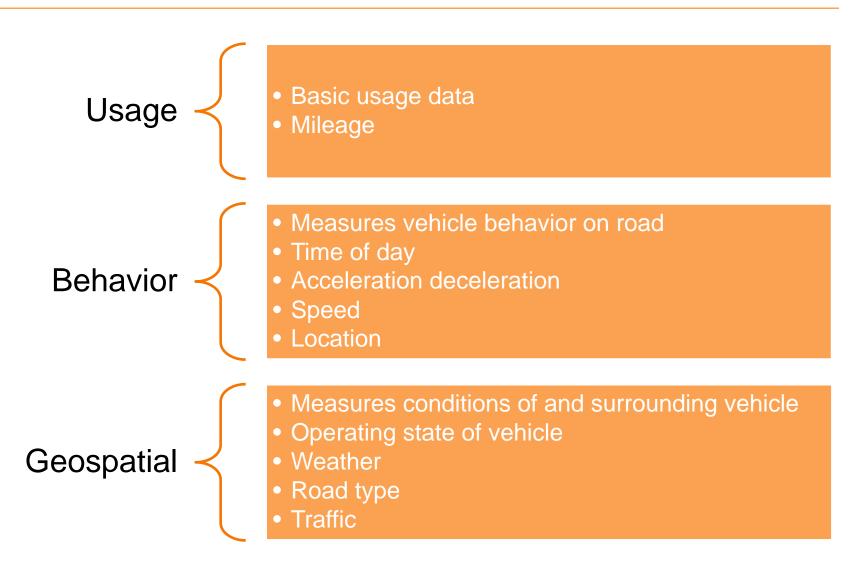
Telematics

 The blending of computers and wireless telecommunications technologies, ostensibly with the goal of efficiently conveying information over vast networks to improve a host of business functions or government-related public services.

Usage-Based Insurance

- Application of telematics to more closely align driving behavior with premium rates for automobile insurance
- Affordability
- Recognize individual vehicle or fleet performance
- Promote safe driving practices

Types of telematics data



Telematics Data Collected

					Heading (Degrees						
Time	Latitude	Longitude	Elevation	Speed (MPH)	from true North)	Event Code	Odometer	Gas			
2011-02-16T02:26:23	42.68	-112.20	367.02	0	•	NITION OFF TIME	69553	14.9			
2011-02-16T01:26:24	42.68	-112.20	353.10	1		IITION OFF	69553	14.9			
2011-02-16T01:25:55	42.68	-112.20	356.51	1	270 IGN	- NITION_ON_TIME	69552	14.9			
2011-02-16T01:24:54	42.68	-112.19	354.49	30	302 IGN	NITION_ON_TIME	69552	14.9			
2011-02-16T01:23:53	42.68	-112.19	359.44	0	283 IGN	NITION_ON_TIME	69552	14.9			
2011-02-16T01:22:52	42.68	-112.19	346.44	51	0IGN	NITION_ON_TIME	69552	15.0			
1440 records for the 24 minute trip											
					•						
2011-02-16T01:07:15	42.66	-111.92	466.54	73	284 SPE	EDING	69535	15.4			
2011-02-16T01:06:20	42.65	-111.90	453.66	63	289 IGN	NITION_ON_TIME	69534	15.4			
2011-02-16T01:05:19	42.65	-111.89	465.18	54	237 IGN	NITION_ON_TIME	69533	15.5			
2011-02-16T01:04:18	42.66	-111.89	489.80	47	160 IGN	NITION_ON_TIME	69532	15.5			
2011-02-16T01:03:18	42.67	-111.89	515.10	22	208 IGN	NITION_ON_TIME	69532	15.5			
2011-02-16T01:03:18	42.67	-111.89	515.10	22	208 DIR	RECTION_CHANGE	69532	15.5			
2011-02-16T01:02:15	42.67	-111.89	554.38	0	0 IGN	NOITION_ON	69532	15.6			
2011-02-16T00:40:12	42.67	-111.89	554.38	0	01GN	NITION_OFF_TIME	69532	15.6			

...1440 X 10k bytes = 14.4MB for the 24 minute trip (1 vehicle)...



Common Data Elements

Core Info

- Driver Age/Gender
- Permissive Use
- Passengers
- Vehicle characteristics
 - Safety features
 - Maintenance

Elements

- Miles driven
- Time of day
- Trip Duration
- Speed
- # Stops
- Acceleration
- Braking
- Location*

Habits of interest

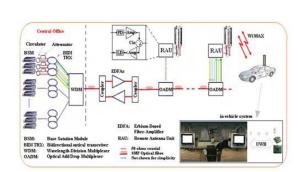
- Excessive speeding
- Hard braking
- Nighttime driving
- Cornering
- Type of road driven
- Regular route
- Fuel efficiency
- Weather/Traffic/Road Conditions
- Speed Limit



Other considerations

- Device
 - Choice of device and supplier
 - Management of the customer experience with device
 - Mailing of device
 - Installation assistance
 - Troubleshooting
- Customer interactions
 - Communications
 - Portals (online and mobile)
- IT infrastructure
 - Data transmission, capture and analysis







Mobile app solutions

Since 2011, there has been a proliferation of vendors offering the mobile app option as an alternative to the OBD solutions

- The overarching issues with the mobile app solution
 - Amount of time the app is off
 - Phone off
 - Phone not present in vehicle
 - The inability to guarantee data captured relate to the driver and vehicle
 - Passenger in car pooling situations
 - Public transit



Mobile app solutions – considerations

- Price of the solution
 - Upfront cost, in time and money
 - Per driver/vehicle/policy cost
- Completeness of the solution
 - Comparison against the OBD alternative
 - Accuracy against actual results
 - Correlation to claims potential



Building Risk Scores

Data Volume

Over a thirty day period, a single vehicle may produce

- An average of 80 trips
- Over 50,000 distinct records

When comparing behavior between vehicles, there is variability

- Number of trips taken
- Time on the road
- Miles driven
- . . .

Types of Scoring

Cumulative

- 31.6 hours
- 924.5 miles driven
- 172 trips

Summary Statistics

- 29.3 miles per hour
- 11.0 minutes per trip
- 5.4 miles per trip

Flags/
Percentages

- 20.88% time over 45 mph
- No incidents over 80 mph

Clustering & Sequencing

UBI – a strategy for success

Internal

 Understanding various options and approaches for launching a UBI program

External

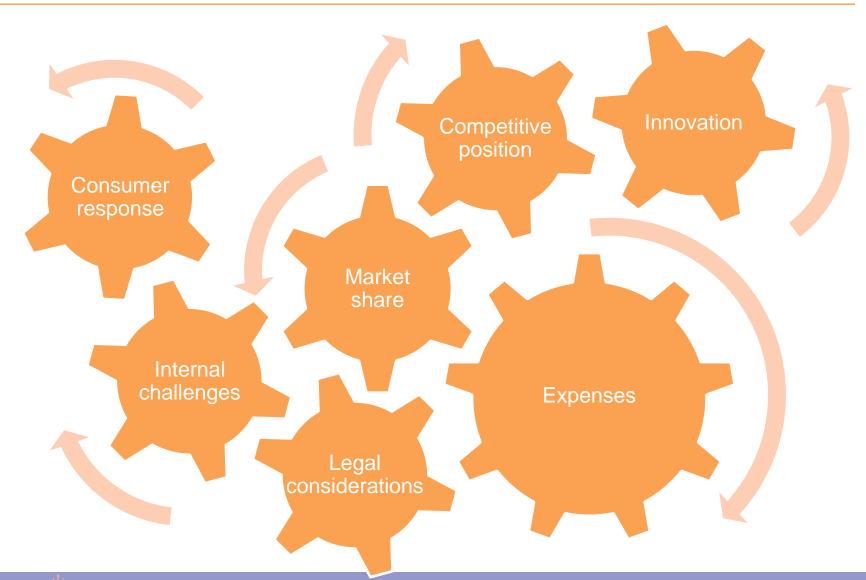
- Understanding UBI landscape
- Research customer demand and industry trends and evaluate potential investment given the company distribution model and value proposition

Strategy

- Articulate a UBI strategy consistent with company strategy and goals
- Develop the data and analytics plan required for a successful program
- Identify market triggers that would signal key timing for market entry

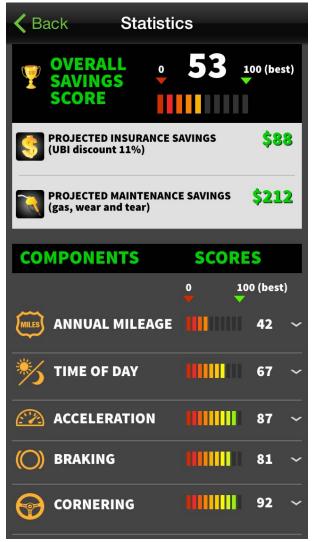


Market entry considerations

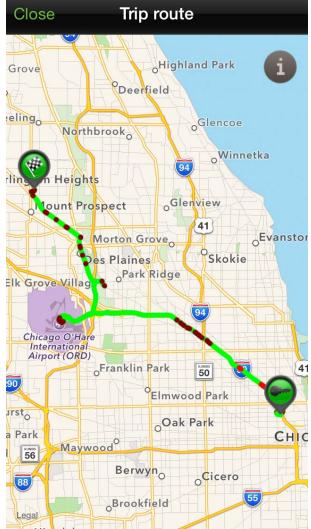




UBI Information Interface









Emerging Data Trends

Commitment Beyond Numbers



Claims Predictive Analytics Opportunities

Occurrence

- Characteristics
- Claim fraud

Report

- Claim value
- Assignment
- Early warning indicator

Adjustment / Development

- Claim development
- Service providers
- Adjustment process
- Fraud
- Attorneys

Settlement

- Reopen?
- Salvage / subrogation
- Customer satisfaction



Applications of Analytics for Claims

- Claim settlement value estimation
- Early warning system
- Estimating the impact of process lags
- Developing a fraud detection system
- Analyzing text data to uncover claim insights



Data for Claims Analytics

- Geography (state, region, legal jurisdiction)
- Time (inflation, settlement lags)
- Claimant characteristics (age, date of hire, full time/part time)
- Insured characteristics (industry, class code)
- Attorney involvement
- Preferred claim network
- Other claims features (arbitration/ADR, settlement lag)
- Claim adjuster notes
- Medical bill review data
- External data



Estimating Claim Settlement Values

Business Problem

- Accurate estimate of ultimate claim liability
- Increasing accuracy of estimate as information develops

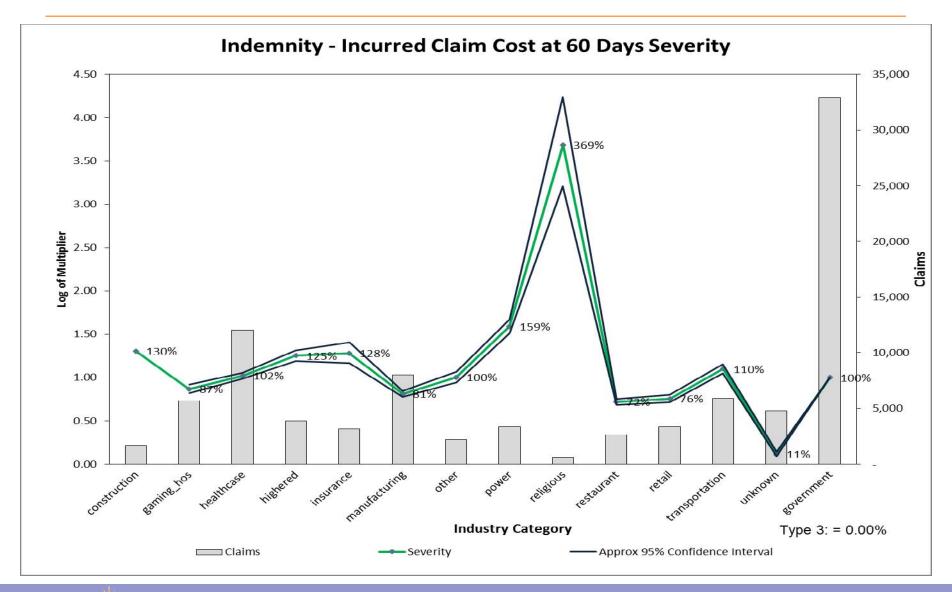
Information Used

- Claim information
- External data
- FNOL and claim adjuster notes

Applications

- Establishing reserves
- Claim assignment
- Early warning

Claim Settlement Value by Industry





Emerging Data Trends

- Claims Analytics and text mining
- Commercial CLUE
- Tenant information
- Observations from Personal Lines
 - Building inspection protocols
 - Roofing
 - Weather data
 - Property telematics
- Internet
 - Web crawling
 - Linked in & social media

In Conclusion....

- Commercial Lines rating and underwriting continues to evolve
- Companies are being challenged to find new insights and methods of segmentation
- Data sources are readily available
- And new data sources continue to emerge



Thank You for Your Attention

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