

Finance, Management, & Operations



Applications for Business Intelligence, Predictive Analytics and Big Data

Patrick Bogan, Chief Information Officer, Fuzion Analytics

Kyle Korzenowski, Chief Information Officer, Univita Health

ILTCI

14th Annual Intercompany Long Term Care Insurance Conference

Big Data: Just Another Buzzword?



Source: Dilbert.com (<http://dilbert.com/strips/comic/2013-01-09/>)

What Is Big Data?



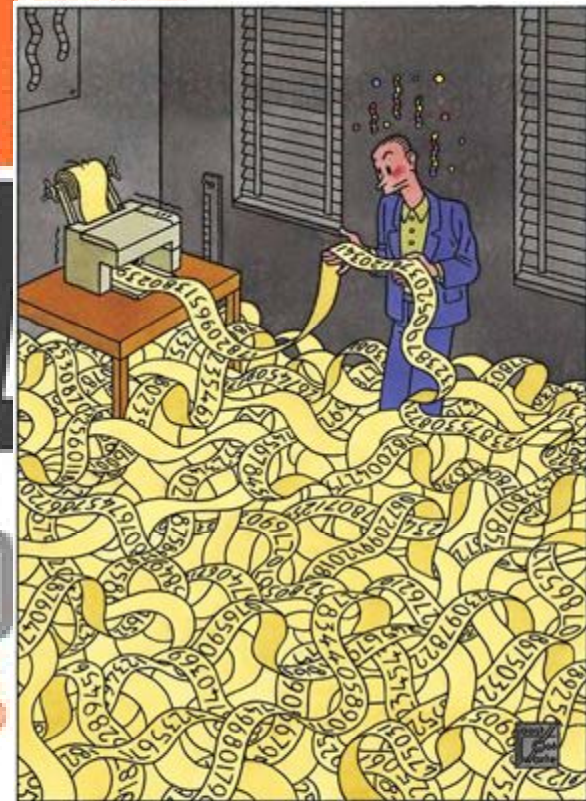
Just a whole lotta data?



Source: Spiral16



Source: Intrapromote



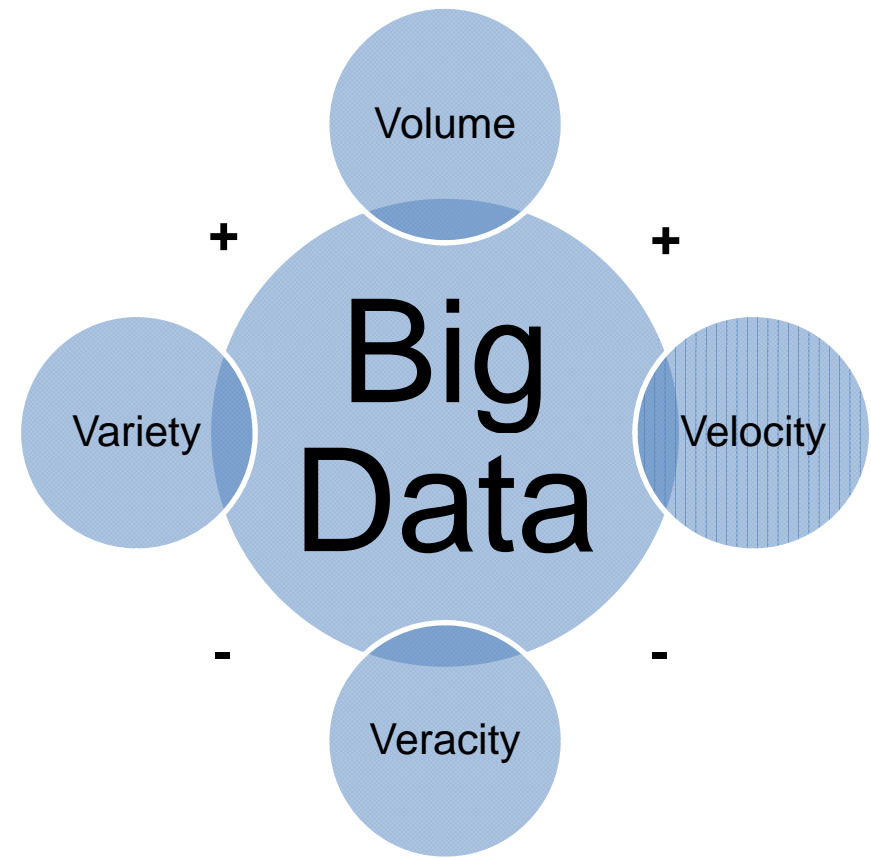
Source: Joost Swarte, The New Yorker

Definition of Big Data



IDC defines "big data" as follows:

"Big-data technologies describe a new generation of technologies and architectures, designed to economically extract value from very large volumes of a wide variety of data, by enabling high-velocity capture, discovery, and / or analysis."



How Big Is Big?	Byte	Examples
Byte	1	
Kilobyte (KB)	10³	1,000 bytes OR 10 ³ bytes 2 Kilobytes: A Typewritten page.
Megabyte (MB)	10⁶	1 Megabyte: A small novel OR a 3.5 inch floppy disk. 5 Megabytes: The complete works of Shakespeare. 10 Megabytes: A minute of high-fidelity sound. 100 Megabytes: 1 meter of shelved books. 500 Megabytes: A CD-ROM.
Gigabyte (GB)	10⁹	1 Gigabyte: a pickup truck filled with books. 4.7 Gigabytes: DVD 20 Gigabytes: A good collection of the works of Beethoven. 100 Gigabytes: A library floor of academic journals.
Terabyte (TB)	10¹²	1 Terabyte: 50000 trees made into paper and printed. 2 Terabytes: An academic research library. 10 Terabytes: The print collections of the U.S. Library of Congress. 400 Terabytes: National Climactic Data Center (NOAA) database.
Petabyte (PB)	10¹⁵	1 Petabyte: 3 years of EOS data (2001). 2 Petabytes: All U.S. academic research libraries. 20 Petabytes: Production of hard-disk drives in 1995. 200 Petabytes: All printed material.
Exabyte (EB)	10¹⁸	2 Exabytes: Total volume of information generated in 1999. 5 Exabytes: All words ever spoken by human beings.
Zettabyte (ZB)	10²¹	

Source: Adapted from Roy Williams "Data Powers of Ten" web page at Caltech.

According to a 2010 IDC study, 3.4 exabytes are produced and replicated daily...that is 1.2 zettabytes annually.

Equates to...

255 billion DVDs

or

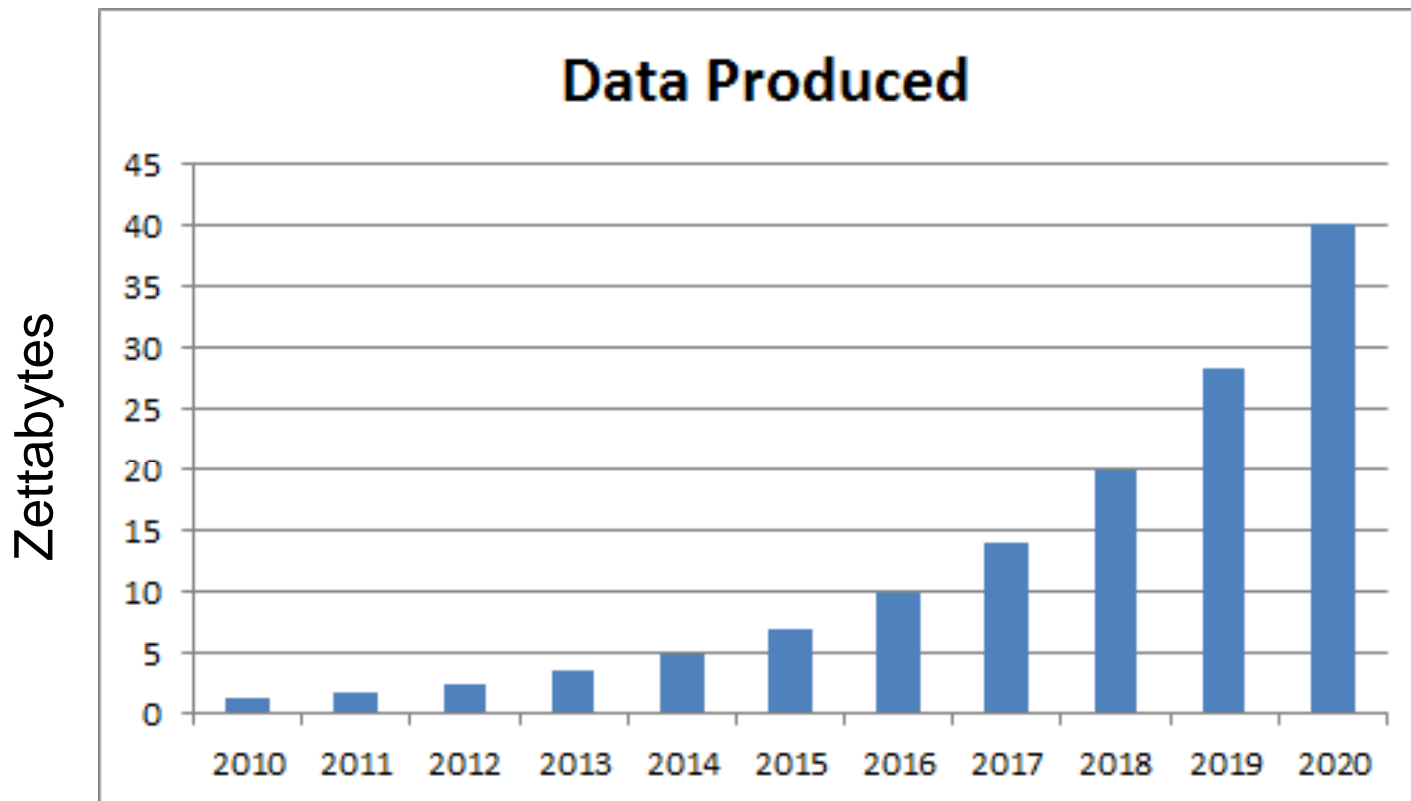
600 quadrillion typewritten pages

...Daily!

Volume Growth



IDC estimates the volume of digital data will grow 40-50% per year through 2020.



Data about data, or metadata, is growing twice as fast as the digital universe as a whole.

“Every two days now we create as much information as we did from the dawn of civilization up until 2003... The real issue is user-generated content.”

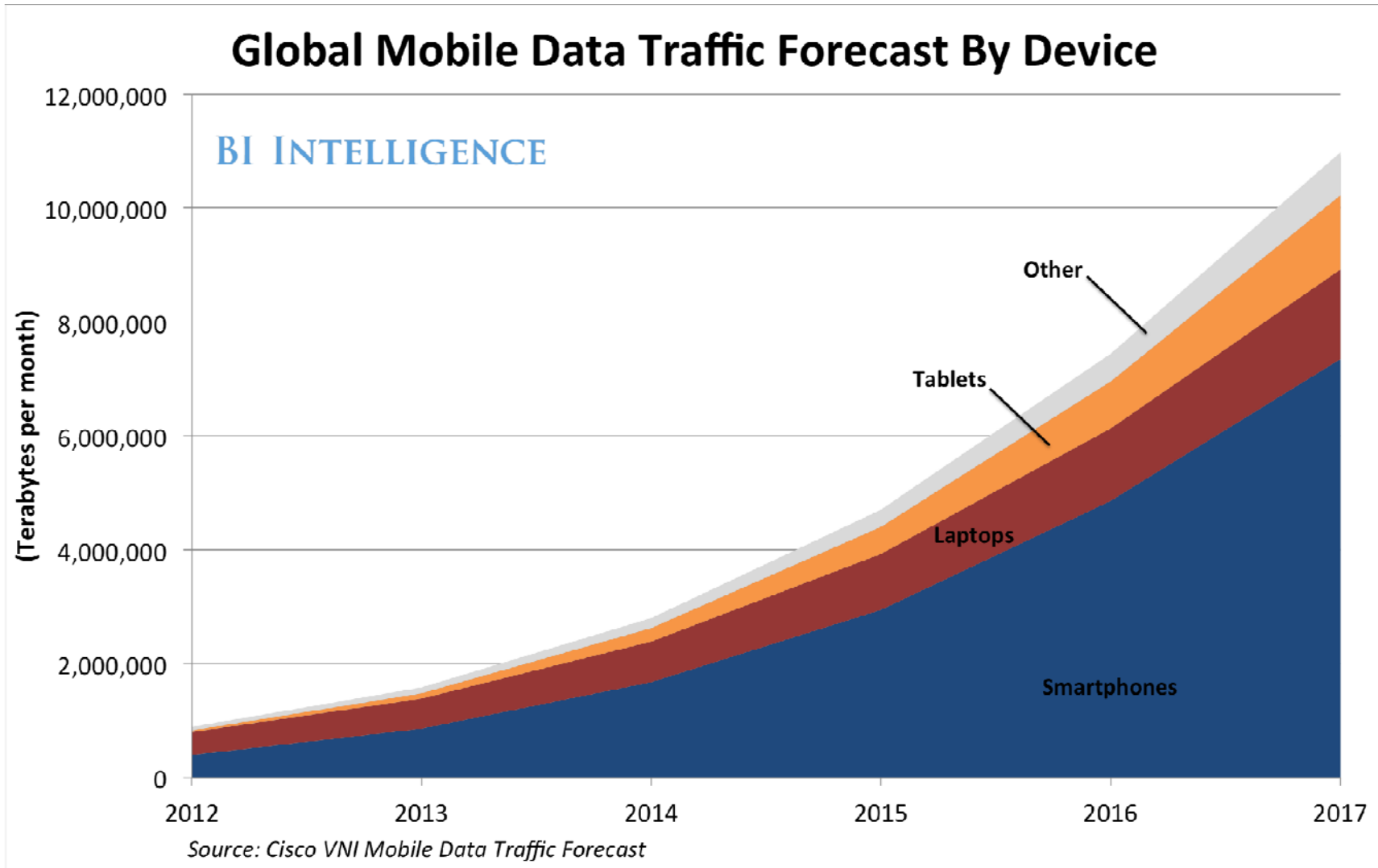
- Eric Schmidt, then-CEO, Google

A better estimate:

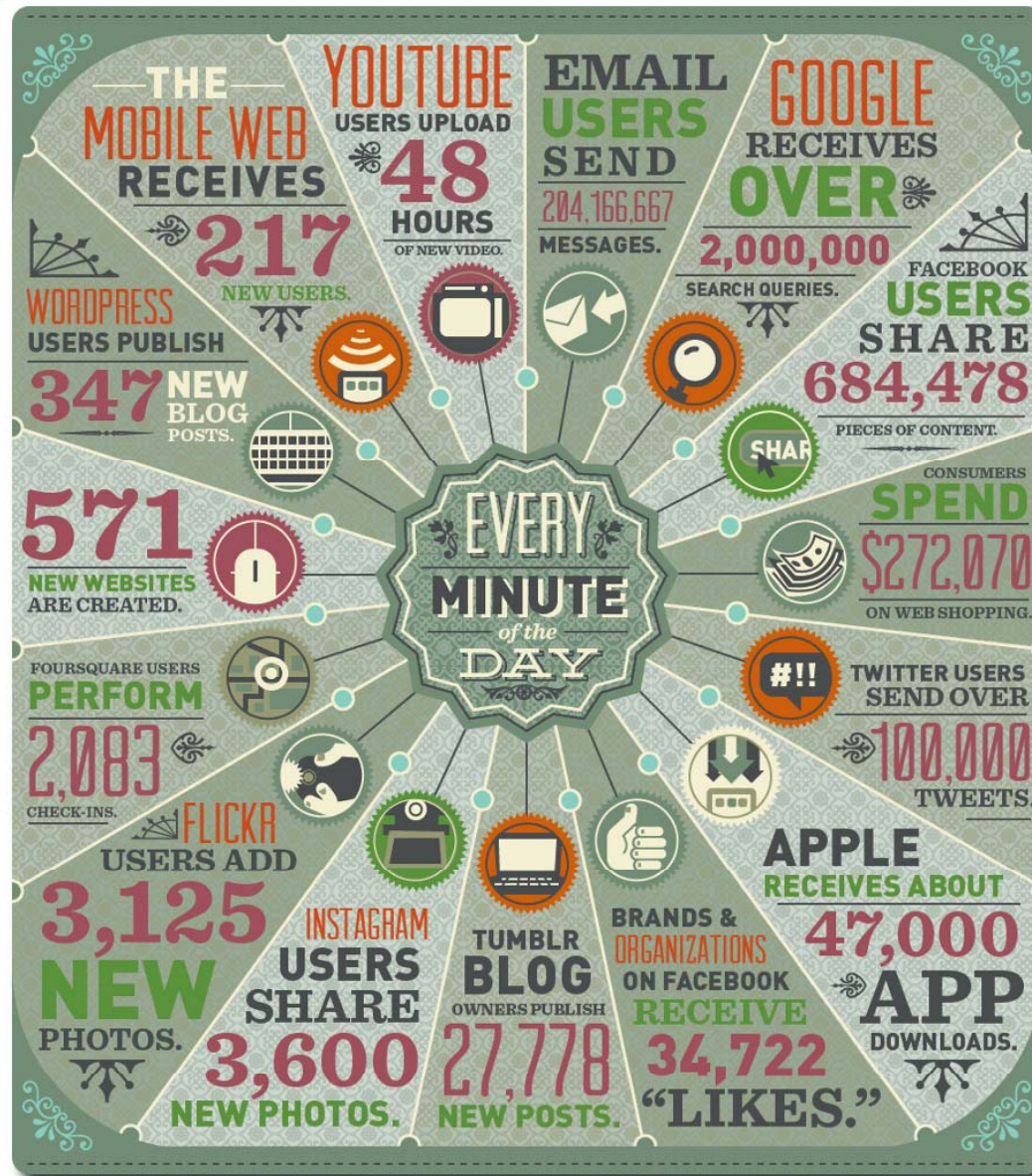
"23 Exabytes of information was recorded and replicated in 2002. We now record and transfer that much information every 7 days."

- Robert J Moore (RJMetrics)

User-Generated Content



Data Variety



Source: DOMO
(<http://www.domo.com/blog/2012/06/how-much-data-is-created-every-minute/?dkw=socf3>)

Some General Implications



Investment

- Spending on data infrastructure will grow (but at a slower rate)

Sources and Liability

- 68% of data is created and consumed by consumers — watching digital TV, interacting with social media, sending camera phone images and videos between devices and around the Internet, and so on
- But enterprises have liability or responsibility for nearly 80% of the information in the digital universe

Security

- The proportion of data in the digital universe that requires protection is growing faster than the digital universe itself, from less than a third in 2010 to more than 40% in 2020.

Analytic Value

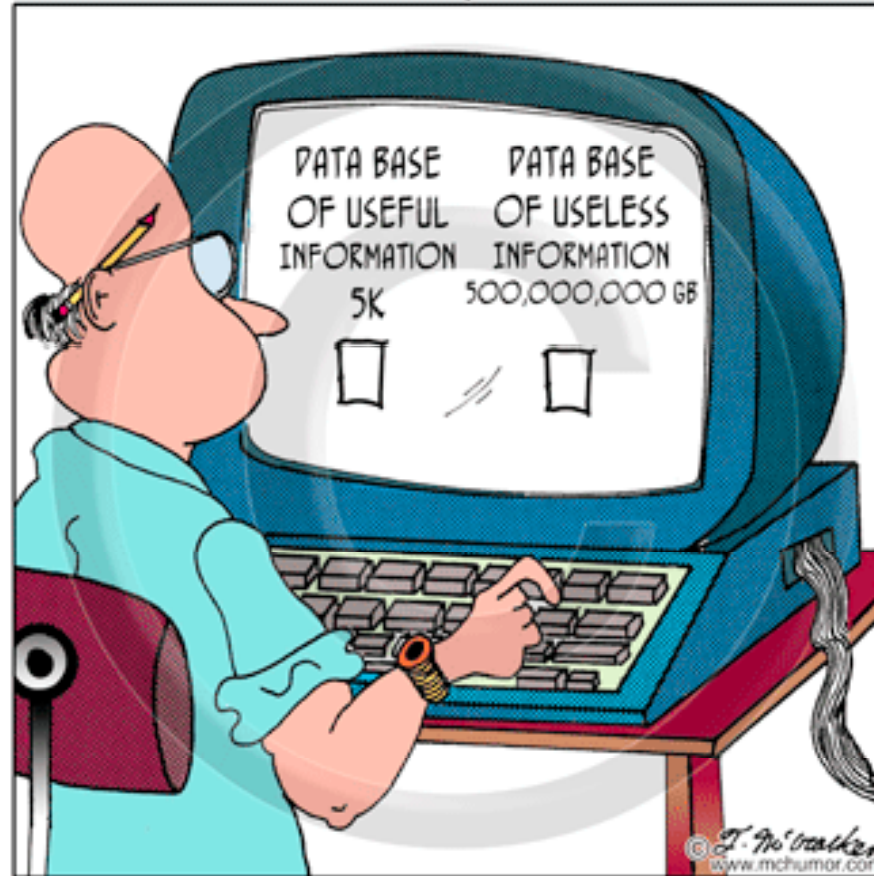
- Small fraction of digital universe has been explored for analytic value (especially in LTCl)

Source: IDC Analyst Perspectives: John Gantz and David Reinsel
The Digital Universe in 2020: Big Data, Bigger Digital Shadows, and Biggest Growth in the Far East

- **Volume** – Infrastructure to process and store high volumes
- **Variety** – Designs to incorporate disparate sources, especially unstructured data
- **Velocity** – Collection mechanisms for high-velocity data
- **Veracity** – Expertise, creativity to design analytics and vet results

Is Big Data Useful for LTCI?

MCHUMOR.com by T. McCracken



©T. McCracken mchumor.com

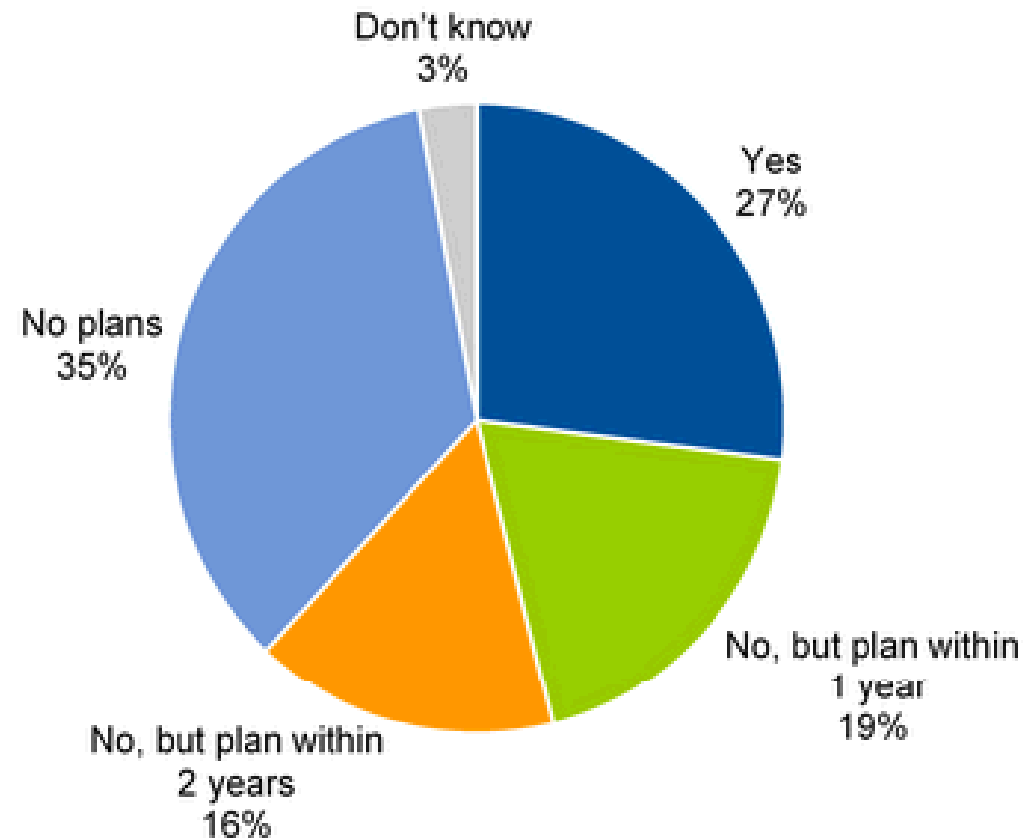
Value of Big Data



- **Low penetration so far** – 30% of organizations have invested in big data; only a quarter (8% of the total) have made it into production.
- **Big data investments in 2013 continue to rise** -- 64% of organizations investing or planning to invest in big-data technology (58% last year). Planned investments the next two years are highest for transportation, healthcare and **insurance**.
- **Enhanced customer experience** is the top big-data priority, with process efficiency close behind. Organizations struggle most with knowing how to get value from big data.
- **Big Data is touted as being about unconventional data sources** and the use of new and innovative technologies; this is not yet reflected in the chosen sources for first projects – transaction and log data still dominate the big data being analyzed.
- **Big-data technologies supplement** — but do not replace — existing information management and analytics. As a result, cloud adoption, with its supplementary nature, is the overriding technology that companies are using to derive value from big data.

Source: Gartner Survey Analysis: Big Data Adoption in 2013 Shows Substance Behind the Hype; September 2013.

Has your organization already invested in technology specifically designed to address the big data challenge?



Source: Gartner (December 2013)

What Is Big Data in LTCl Context?

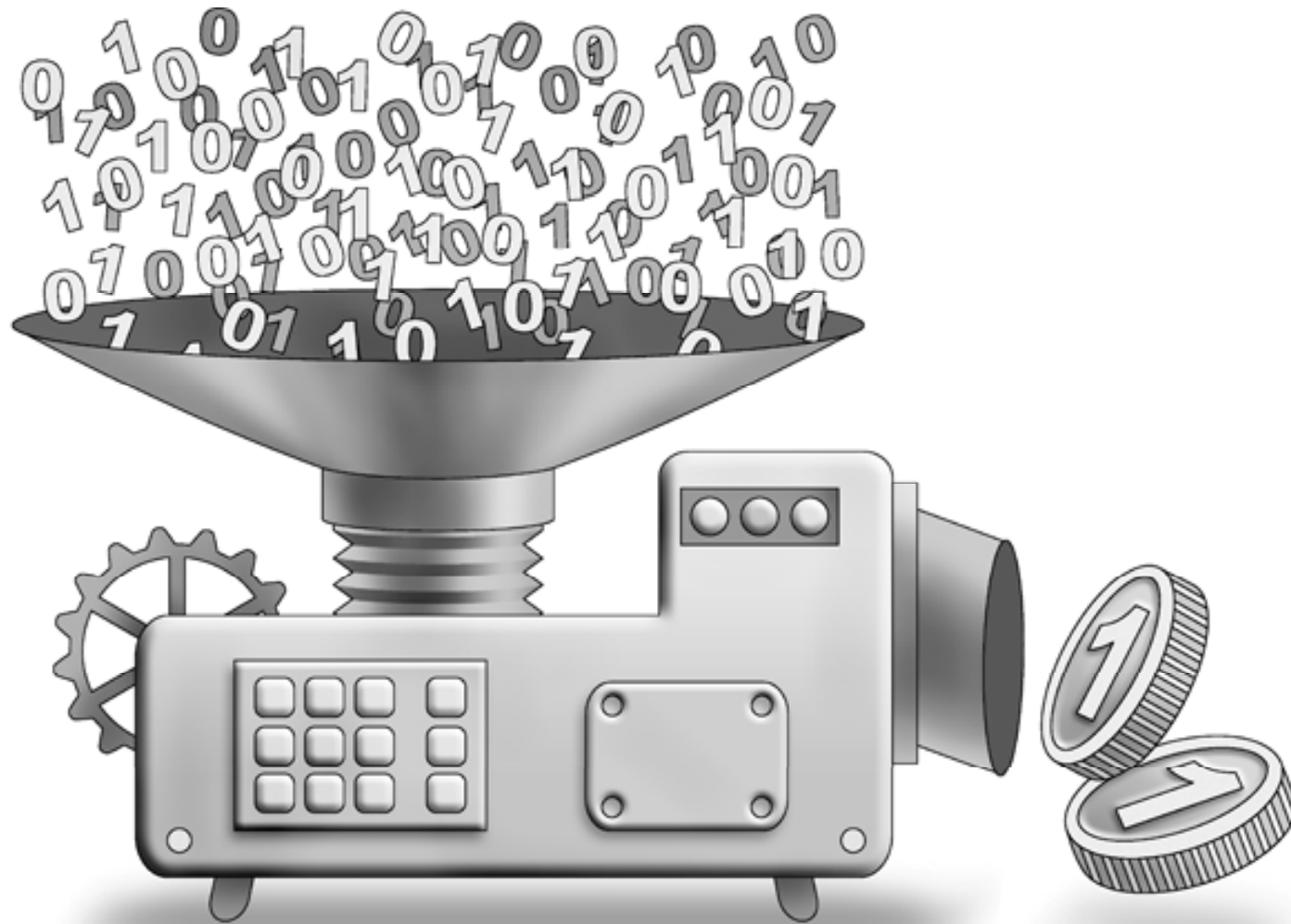


Taking clinical and unstructured observational information and connecting that with administrative/process information and social media

- Policyholders
 - Claim validation
 - Fraud detection
 - Marketing & sales
 - Underwriting
 - Predictive modeling
- Business Processes
- Providers
 - Provision of services
 - Observation
 - Electronic claims submission
- Market
 - Industry benchmarks
 - Trends and forecasts
- Healthcare convergence (integrated care delivery)

- How to merge LTCl and healthcare data?
- How to combine unstructured, observational data with structured LTCl and medical data?
- A study of medical costs at end of life relative to LTCl coverage (CalPERS) – Dr. Stephen Holland presented on this yesterday – This is but one example of merging these two seemingly disparate data sources to improve our understanding of LTCl impact (to be published in *Population Health Management*)

Is There Value to be Gained?



Source: Seventhman Blog

- Two-pronged approach
 - Define problem/need and value (top-down)
 - Study data to guide thinking (bottom-up)
- Start small and iterate!
- Ensure solid information-management platform and analytics
- Build upon traditional business-intelligence and analytic capabilities
- Explore ideas from outside the LTCl industry for interesting scenarios and applications

- Dashboards - Easy to read graphical representation of current status and historical trends of key performance indicators
- Actionable insight
- Static Dashboards
 - No analytic capability to explain results
 - Follow up is time consuming
- Interactive Dashboards



- Show only relevant, focused content
- Highlight interesting relationships in data
- Provide concise, relevant answers

What is the reason for the visualization and who will be using it?

What will they need to learn and what actions will they take?

How will the visualization be consumed?

Executive Dashboards

Most relevant, actionable data at a glance for the executive team

Financial and Actuarial	Legal and Regulatory	Ongoing Claims Operations	Ongoing Policyholder Operations	New Business
<ul style="list-style-type: none">- Comparison to plan- Reforecasts- Loss analysis- Reserve metrics- Claim trends- Premium trends	<ul style="list-style-type: none">- Litigation status- Complaints- Appeals	<ul style="list-style-type: none">- Submission, approval and decision metrics- Cycle times- Service level metrics	<ul style="list-style-type: none">- Member demographics- Billing metrics- Policy change metrics	<ul style="list-style-type: none">- Underwriting metrics- Sales Analysis- Agent Analysis

Comparison to industry trends

Executive Dashboard Sample



Legal

DOI/Attorney Complaints

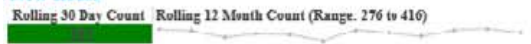


Open Lawsuits

Company	State	Received Date	Reserve
BIC	FL	2/1/2012	\$400,000
BIC	RI	3/5/2013	\$600,000
CLI	AK	4/4/2012	\$350,000
CLI	RI	5/25/2010	\$600,000

New Business

New Issues



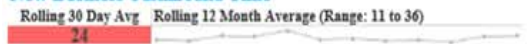
Issue Rate



Applications Received



New Business Turnaround Time



Top 5 New Issue States

State	Rolling 30 Day Count	Rolling 12 Month Count
IL	75	[Line]
CA	45	[Line]
RI	36	[Line]
FL	29	[Line]
AZ	16	[Line]

Ongoing Operations

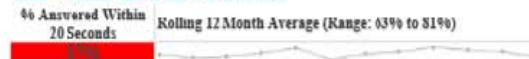
Claim Approval Rate/Denial Count



Claims Paid Turn Around Time



Call Volume and Answer Success



Payment Trend



Notices

Upcoming Events

Event	Date
Mid-Month Status Call	3/18/2014
Board Meeting	3/20/2014
Quarterly Business Review Meeting	3/22/2014
Strategy Meeting	3/26/2014

Financial

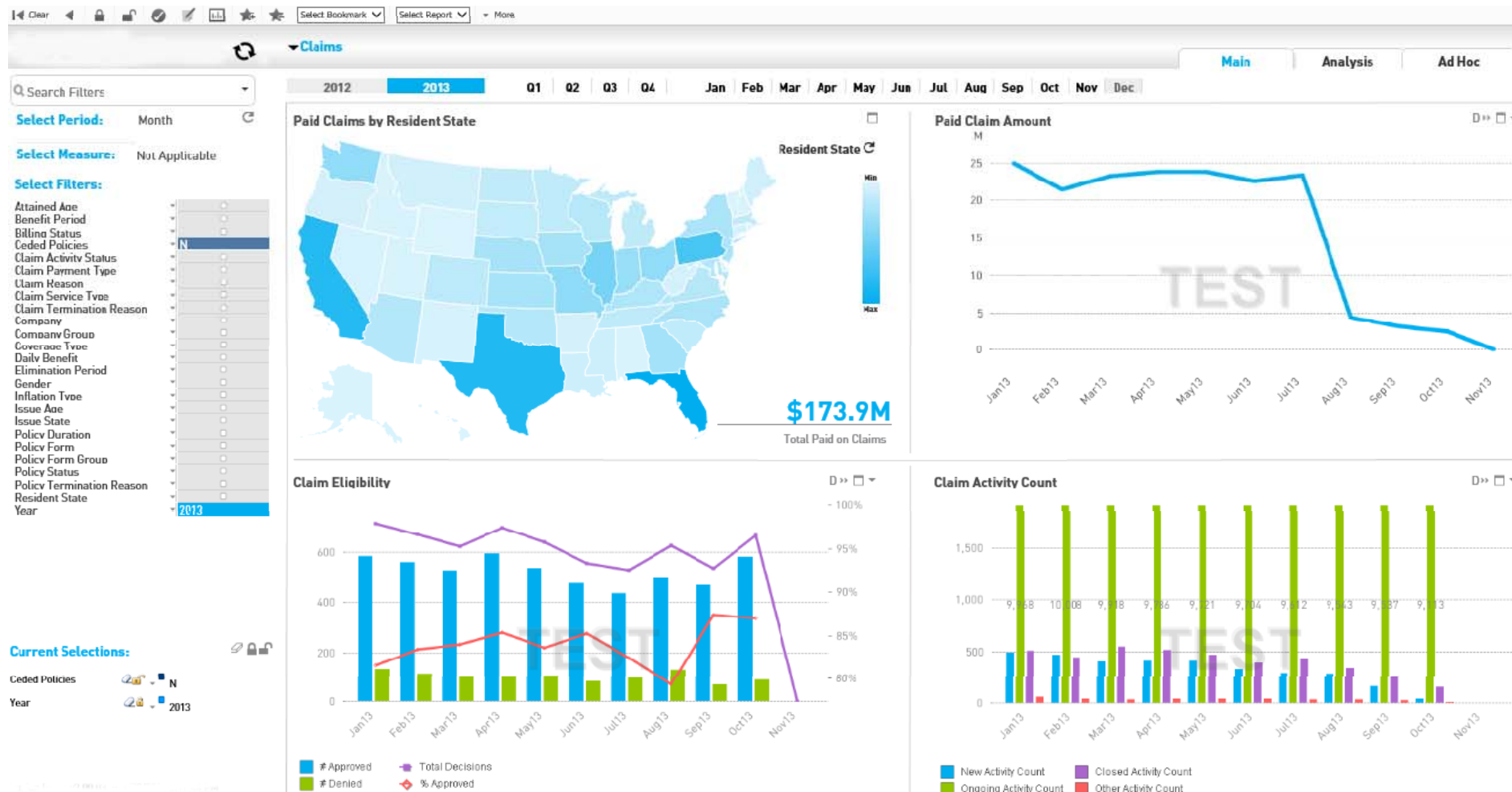
(Through 03/14/14)

	YTD Estimate	Plan	Estimate to Plan Var %
Active Life Reserve	2,000,000,000	2,100,000,000	-4.76%
Annualized Premium	5,600	5,400	3.70%
Claim Count	4,500	4,200	7.14%
Claim Reserve	75,000,000	75,000,000	0.00%
Inforce Count	3,000	2,500	20.00%
Paid Claims	34,000,000	38,000,000	-10.53%

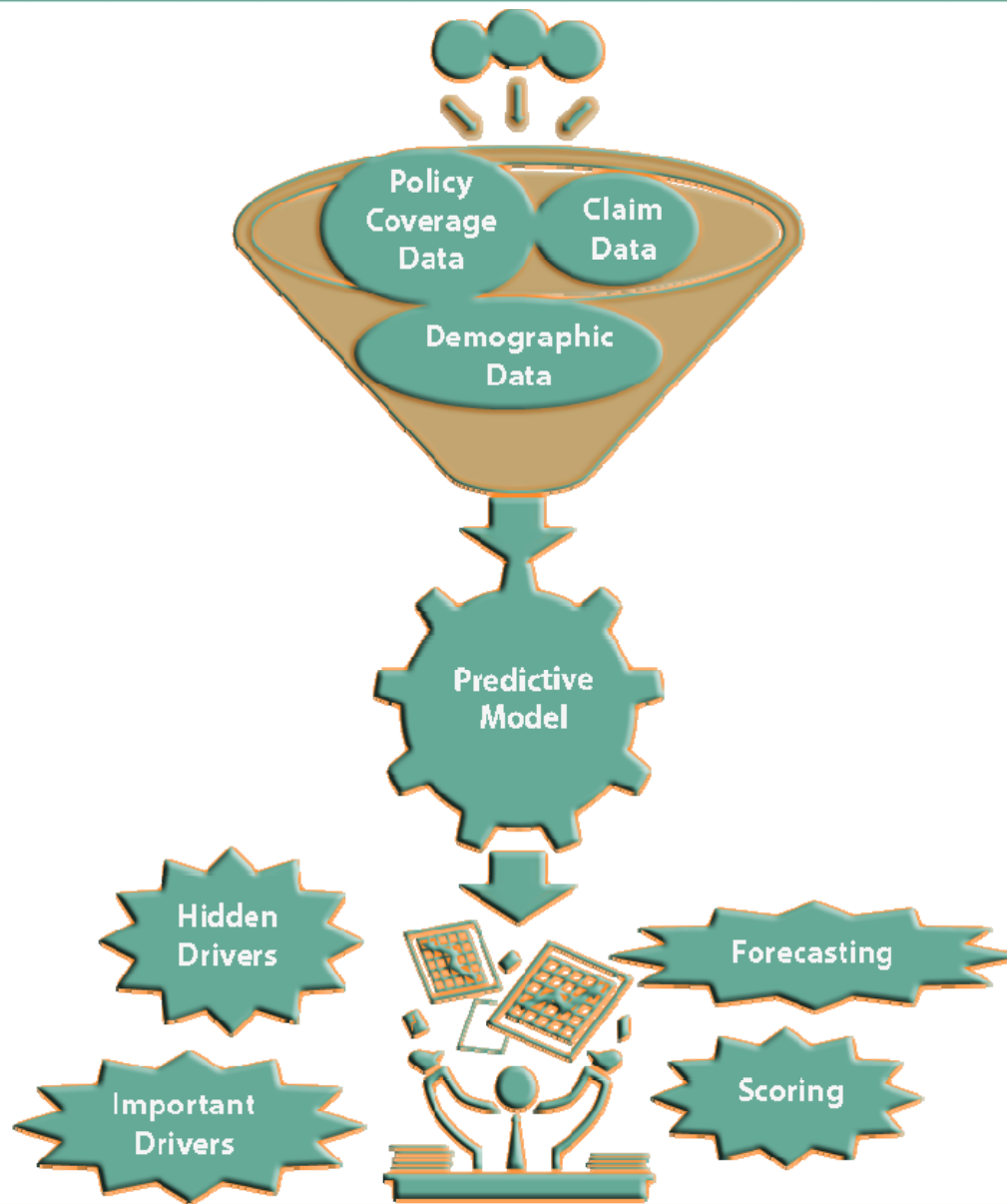
	Actual	Plan	Act. to Plan Var %
Active Life Reserve	500,000,000	475,000,000	5.05%
Annualized Premium	500	450	11.11%
Claim Count	280	260	7.69%
Claim Reserve	45,000,000	40,000,000	12.50%
Inforce Count	375	425	-11.76%
Paid Claims	26,000,000	35,000,000	-25.71%

Measure	YTD Estimate	Prior 5 Years YTD Estimates
Active Life Reserve	2,000,000,000	[Line]
Annualized Premium	5,600	[Line]
Claim Count	4,500	[Line]
Claim Reserve	75,000,000	[Line]
Inforce Count	3,000	[Line]
Paid Claims	34,000,000	[Line]

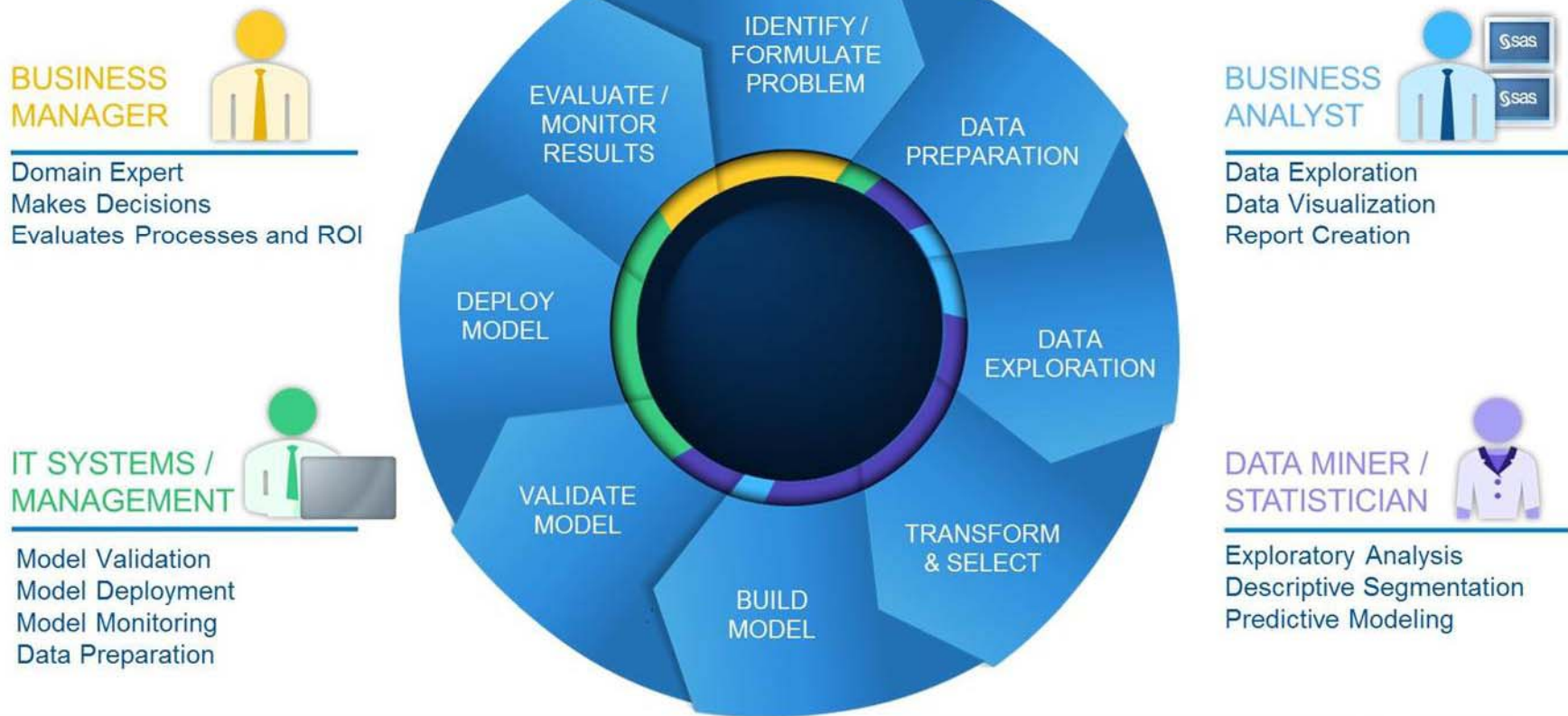
Claim Dashboard Example



Predictive Analytics – How it works



Predictive Analytics – How it works

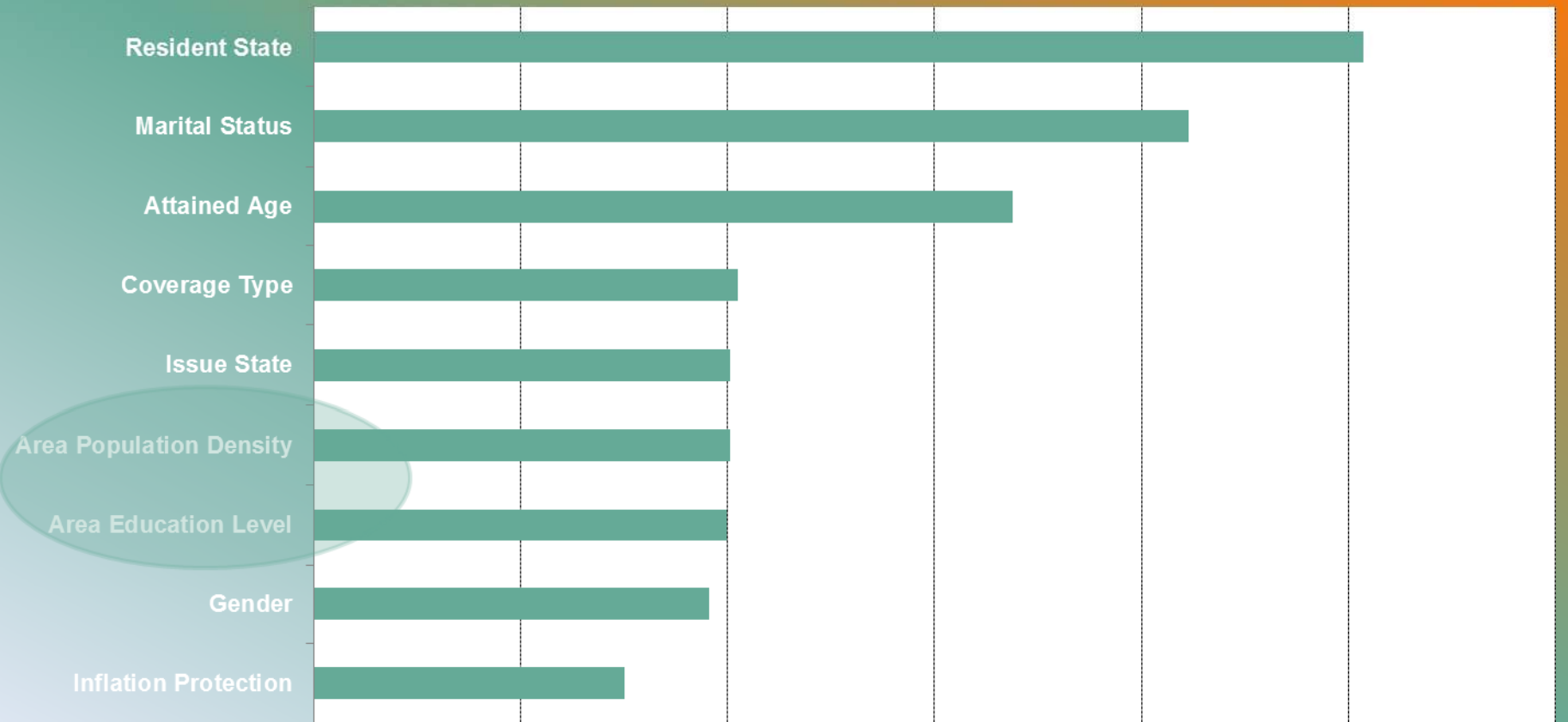


Source: <http://blogs.sas.com/content/subconsciousmusings/2013/01/11/why-people-and-process-matter-in-addition-to-great-technology-in-predictive-analytics/>

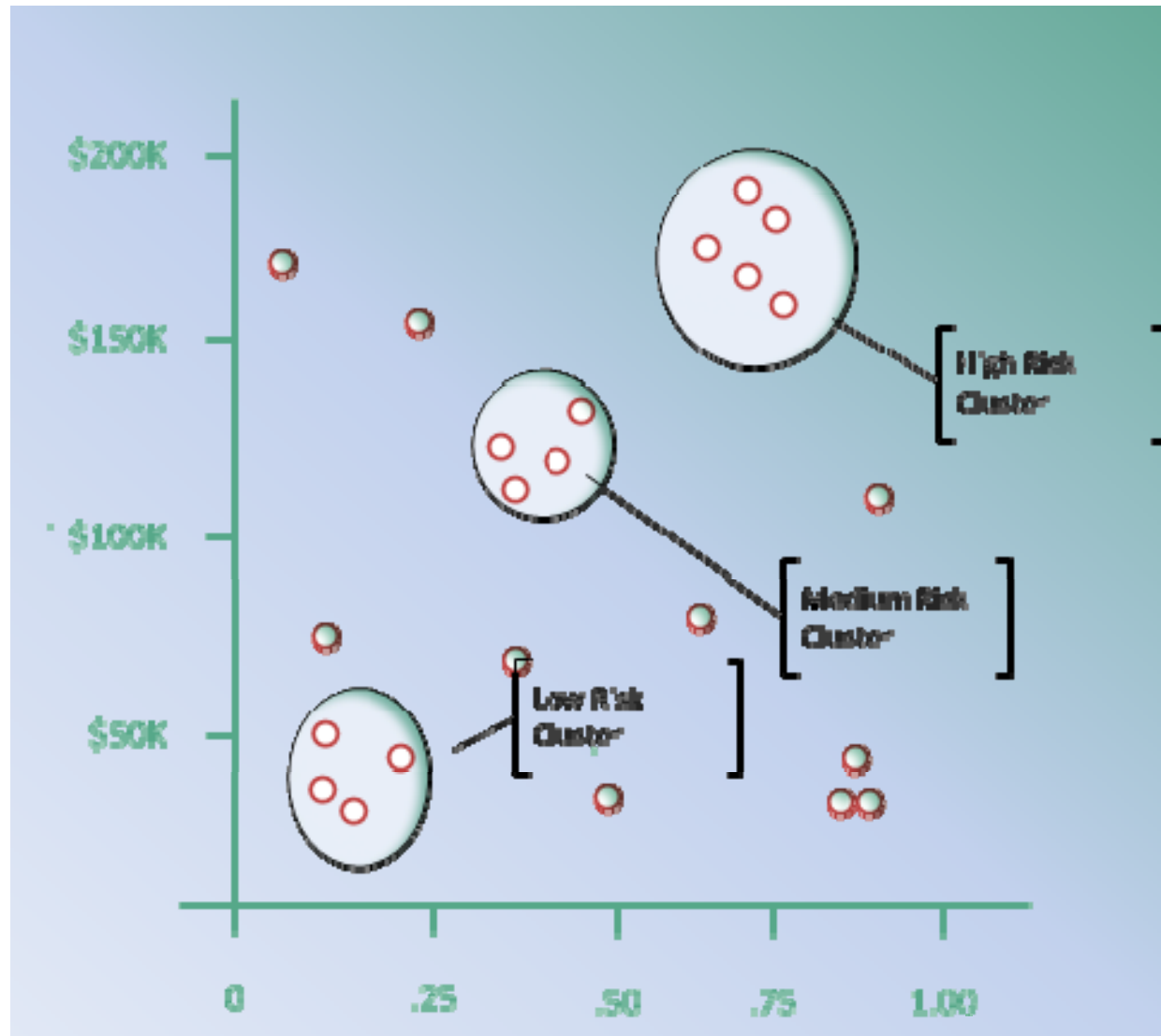
Predictive Analytics – Driver Identification



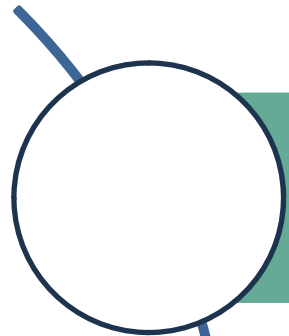
Top 9 Variable Contributions For Going On Claim



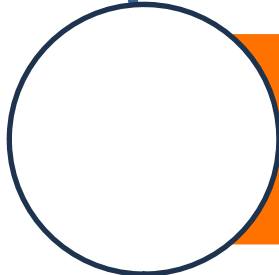
Predictive Analytics – Risk Management



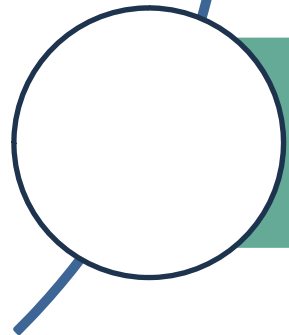
Predictive Analytics - Model Types



Target Marketing
Underwriting and Sales



Rate Increase Impact Analysis
Claim Trend Analysis



Fraud Identification
Wellness Programs

Predictive Analytics – Fall Prevention Model



Select Model: Propensity to Fall

Select Filters:

- Billing Mode
- Billing Status
- Billing Type
- Ceded Policies
- Coverage Type
- InflationType
- Issue Age
- Issue State
- Model Decision Reason 1
- Model Decision Reason 2
- Model Decision Reason 3
- Policy Form
- Policy Form Group
- Policy Status
- Policy Termination Reason

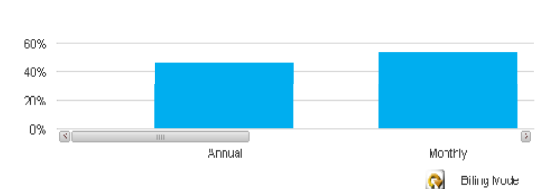
Top 30 At-Risk Policies

Policy	Issue State	Issue Age	Model Score	Coverage Type
27 TN		60 - 64	98% NH	
49 TX		70 - 74	93% NH	
42 MO		65 - 69	92% Shell	
6 MI		60 - 64	91% Shell	
25 TX		60 - 64	90% Comp-100	
3 FL		60 - 64	89% Comp-50	
4 FL		55 - 59	89% Shell	
7 TX		0 - 54	88% HHC	
22 NC		65 - 69	87% Comp-100	
23 IN		0 - 54	87% Comp-50	
8 MI		60 - 64	82% Comp-100	
29 FL		75+	78% HHC	
41 VA		65 - 69	77% NH	

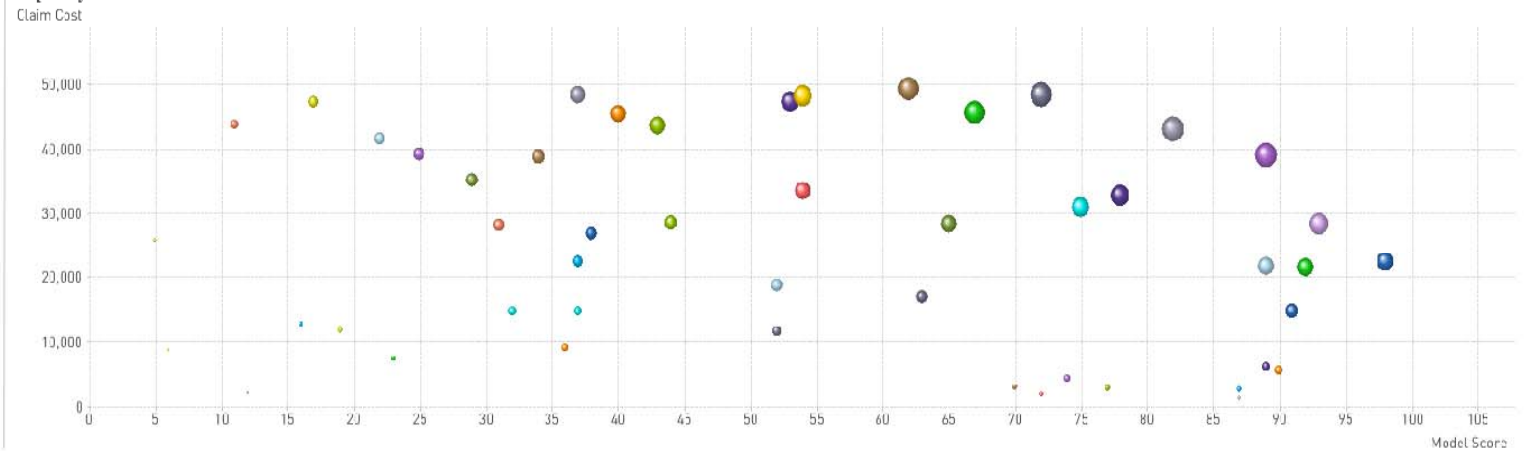
Propensity to Fall Details

Billing Mode	Billing Status	Billing Status Value	PolicyNumber	Percentage Score	Billing Type	Ceded Policies	Claim Cost	Coverage Type	InflationType
Semi-Annual	PPP	APP	27	98%	DRB	N	22,303	NH	Compound
Monthly	Term	TMV	49	93%	EFT	N	28,270	NH	Simple
Not Applicable	Term	TMD	42	92%	Not Applicable	N	21,367	Shell	Compound
Monthly	PPP	APP	6	91%	FFT	N	14,643	Shell	Compound
Monthly	PPP	APP	25	90%	EFT	N	5,553	Comp-100	None
Monthly	PPP	APP	3	89%	EFT	N	21,693	Comp-50	Compound
Monthly	CLW	CLW	4	89%	DRB	N	38,873	Shell	Compound
Not Applicable	Term	NTO	17	89%	DRB	N	6,113	HHC	None
Monthly	PPP	APP	22	87%	EFT	N	2,735	Comp-100	Compound
Not Applicable	Term	NTO	23	87%	DRB	N	1,405	Comp-50	None
Monthly	PPP	APP	8	82%	EFT	N	43,006	Comp-100	Compound
Monthly	Term	TMV	29	78%	DRB	N	32,704	HHC	None
Monthly	PPP	APP	41	77%	EFT	N	2,762	NH	Compound
Monthly	CLW	CLW	40	75%	DRB	N	30,877	Shell	Compound
Semi-Annual	PPP	APP	34	74%	EFT	N	4,250	Comp-50	Compound
Monthly	PPP	APP	19	72%	EFT	N	1,886	Comp-50	Compound
Monthly	Term	TMV	28	72%	DRB	N	48,222	NH	None
Monthly	PPP	APP	47	70%	EFT	N	3,017	Comp-50	None
Not Applicable	Term	NTO	16	67%	DRB	N	45,464	Comp-100	None
Monthly	PPP	APP	36	65%	EFT	N	28,330	NH	Compound
Annual	PPP	PPP	32	63%	DRB	N	16,807	Shell	Compound
Monthly	PPP	APP	11	62%	DRB	N	49,085	HHC	None
Monthly	NFO	NFO	33	54%	DRB	N	33,533	Comp-100	None
Annual	PPP	PPP	15	54%	DRB	N	48,143	Shell	None
Monthly	PPP	APP	5	53%	EFT	N	47,193	Comp-100	None
Not Applicable	Term	NTO	39	52%	DRB	N	11,552	Comp-100	None
Annual	Term	TNP	30	52%	DRB	N	18,783	HHC	None

Avg. Propensity to Fall Score by Billing Mode



Propensity to Fall



- Historically, a manual process
- Supervised models using rules based approach can improve results
- Iterative approach reduces false positives
- Prioritization of cases based upon fraud potential, risk, and recovery
- Identifies need for additional data
- Supplemental data
- Consortium models
 - Supervised
 - Unsupervised



Fraud Detection – Rules Engine



Queue Case Info Search **Rules + Scoring** Admin

My Rules **Add Rules** Scheduling Scoring Results

Add New Rule : Behavior → Spouse

Rule Name

Spouse Claim Timing

Rule Eligibility Filters

Policy Type: Primary and Linked/Joint
 Policy Status: Active
 Claim Status: On Claim

Look Back Period: Within 365 Days
 Count Threshold: At Least 1

Care Type: All

Rule Condition

Condition Category: Claims Operation: Compare Claim Dates

Spouses Filed a Claim: Within 10 Days of each other

And Or

Rule Condition

Condition Category: Service Operation: Compare Service Providers

Spouses Using: Same Service Providers

[+ Add New Rule Condition](#)

Rule Preview

```

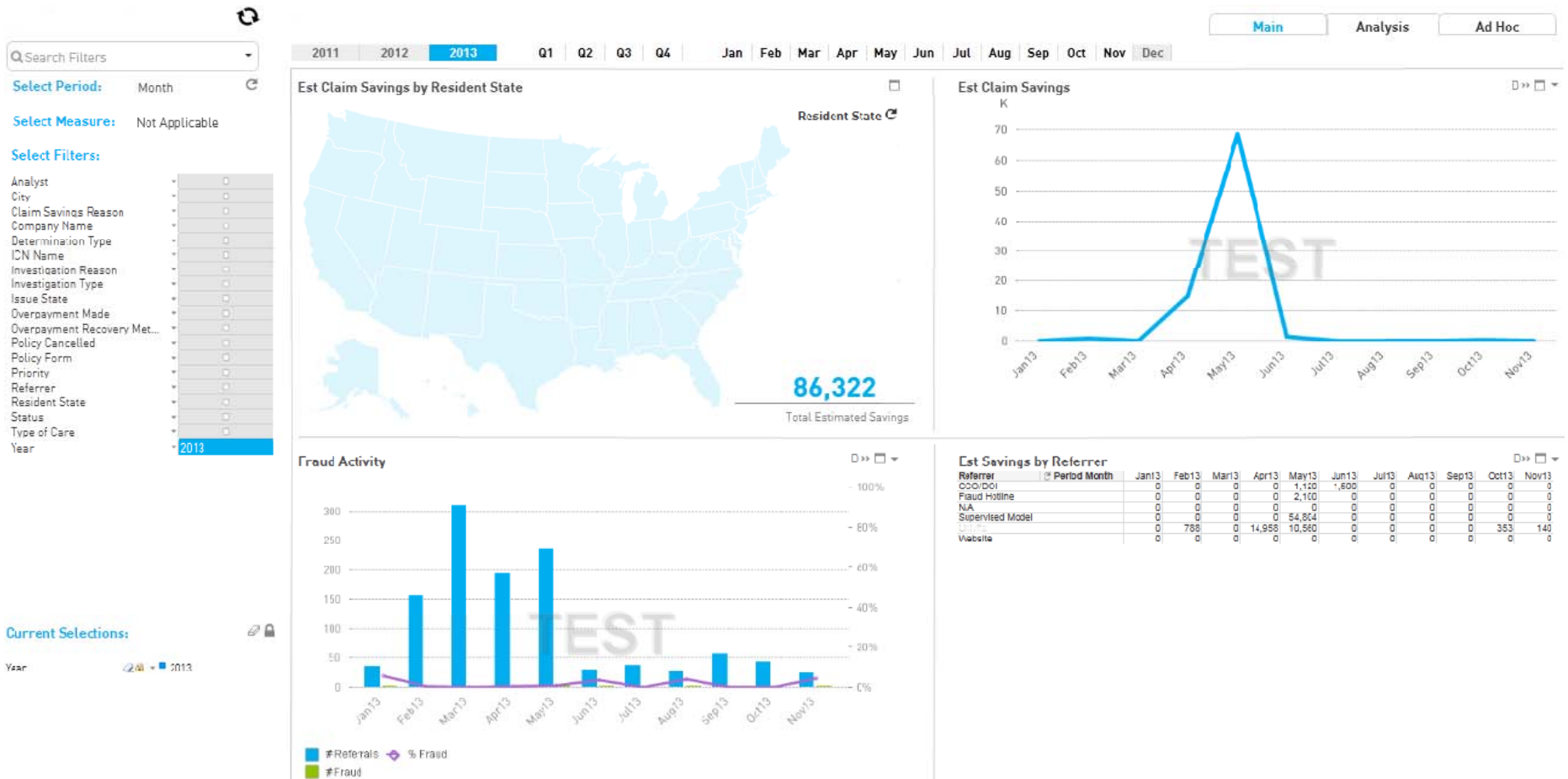
graph TD
    A[Policies & Claims] --> B[Policy Type: Linked/Joint]
    A --> C[Policy Status: Active]
    A --> D[Claim Status: On Claim]
    B --> E[Care Type: AD, ALF, HHC]
    C --> E
    D --> F[Period: 365 Days]
    E --> G[Rule Condition: Spouses who filed claims within 10 days of each other]
    F --> G
    G -- and --> H[Rule Condition: Spouse are using same care provider]
    H --> I[Results]
    
```

Rule Settings

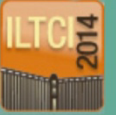
Weight: 7
 Rule Type: Universal

[Preview](#) [Save](#) [Cancel](#)

Fraud Detection - Reporting



Question and Answer from Audience



Any questions?