

Society of Actuaries in Ireland

Application of Data Analytics in Insurance

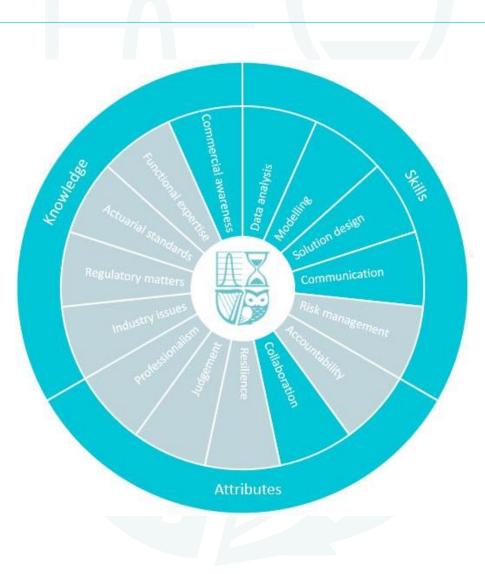
24 October 2019

© Society of Actuaries

Disclaimer

The views expressed in this presentation are those of the presenter(s) and not necessarily those of the Society of Actuaries in Ireland or their employers.

Competency Framework





About the speaker

Bence Zaupper, FSAI



- Senior manager, life actuary in the Actuarial Services Group in PwC Ireland, Data Analytics Proposition Lead.
- Provides audit and actuarial services to PwC's financial services clients and supports clients in advisory projects such as risk and capital management and data analytics.
- Member of the Data Analytics Subcommittee of the Society of Actuaries in Ireland providing resources for members looking to upskill in this area.





- Role of actuaries in the digital age
 - Actuaries of the future
 - Trends in the US
 - US Actuarial Modernisation Survey (PwC, 2018)
 - Top Actuarial Technologies (SOA, 2019)
 - Implications for actuaries in Ireland
- Analytics use cases in insurance
 - Behavioural analytics
 - Customer segmentation
 - Claims analytics and fraud detection
 - Other insurance use cases

Role of actuaries in the digital age

© Society of Actuaries



 Key messages from the leaders of the Actuarial Association of Europe (AAE) in a recent press release* (June 2019):

"Although traditional actuarial competence is essential, to remain a relevant partner, actuaries must extend their reach to new areas outside their comfort zone. These include sustainable finance, consumer protection, <u>big data and modern data science</u> and macro prudential issues." – Esko Kivisaari (former chairperson of the AAE)



 In the same press release, Falco Valkenburg, current chairperson (former vice-chairperson) of the AAE describes actuaries of the future (or the "fifth kind of actuaries"):

"...a data and model-driven, critical and socially responsible financial decision maker in an ever-changing world ruled by uncertainty".

Previous "kinds" of actuaries in chronological order:
 1. Life 2. Non-life 3. ALM 4. ERM Actuaries



Actuaries of the future

- Questions:
 - What does this mean in practice?
 - Where are we now?
 - What do we need to get there?



- Actuarial Modernisation Survey* run in the US in 2018 by PwC with 56 respondents
- Key themes:
 - The elusive goal of Full Automation
 - The challenge of Data Management
 - The Actuary today and tomorrow



The survey

Purpose:

Survey to understand current state of Actuarial Modernization for both P&C and Life companies

Scope:

48 questions covering

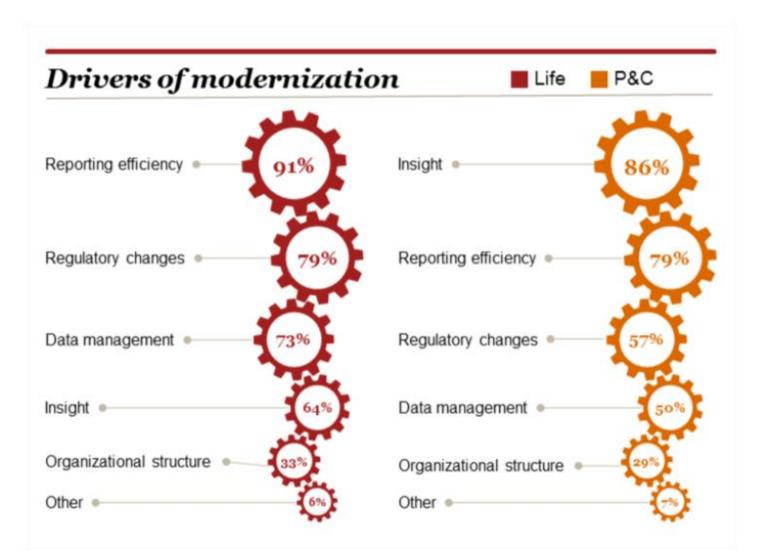
- Demographics
- Modernization
- People
- Process
- Technology

Responses:

37 Life and 19 P&C companies

- 40% are US national and regional insurers, 60% are international
- Actuarial team size: 18 have less than 50 FTE ("Small"), 18 between 50 and 100 FTE ("Medium") and 20 more than 100 FTE ("Large")







Focus area of modernization programs

Modernization focus areas:

- Main focus areas are implementation of foundational capabilities, e.g. data infrastructure, governance/controls and actuarial modeling platforms
- For future focus AI/Machine learning, Advanced analytics and Management reporting are the three top categories

Future area of focus Previously implemented / NA

80%

33)

100%

		-	
Data infrastructure			
Governance & control enhancements			
Actuarial modeling platforms			53
Process efficiency			51
Pricing and underwriting			50
Target operating model		4	8
Cloud computing		44	
Reporting metrics and KPIs		43	
Management reporting		42	
Experience studies & assumption setting		40	
Finance systems		39	2
Advanced analytics		34	
AI & machine learning	9		
	0%	20% 40%	60%

In progress

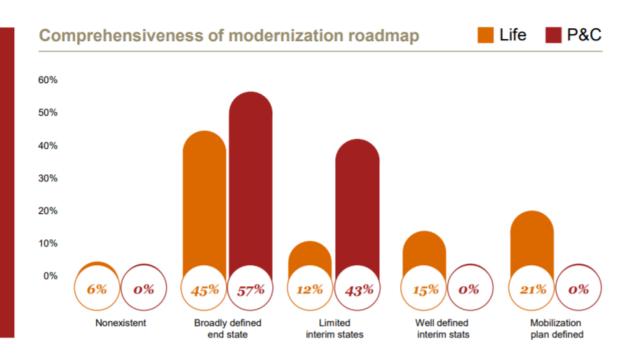
% of Total Responses



Maturity of modernization plans

- The majority of insurers do not have a well articulated modernization plan
- Only **25%**

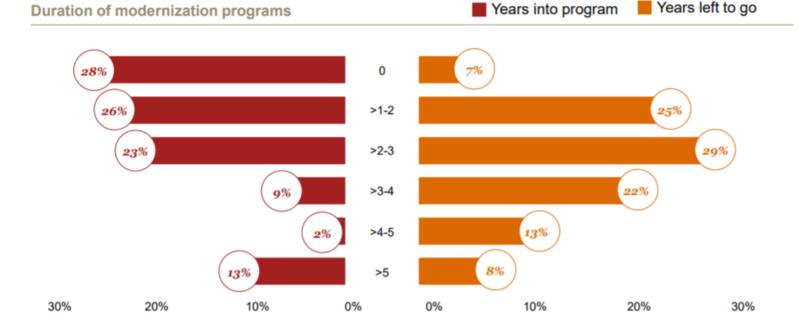
of insurance companies have a detailed end state with well-defined interim states (**o%** of P&C companies)





Duration of modernization programs

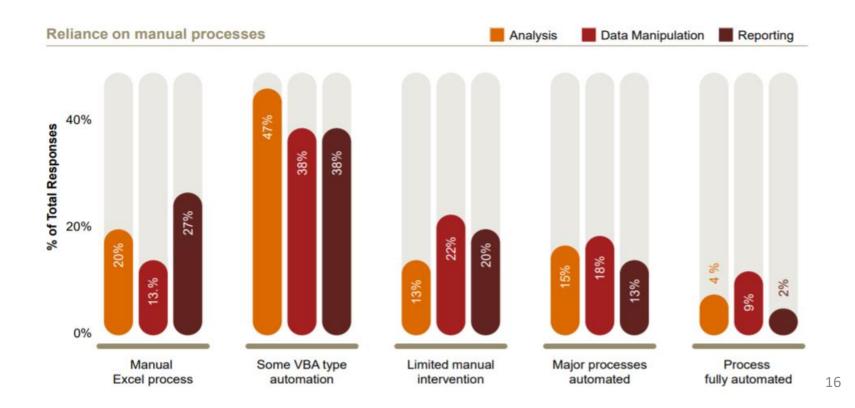
- · The majority of companies expect modernization will take in excess of 3 years
- In general, Life companies reported being somewhat further into their modernization program when compared to P&C companies





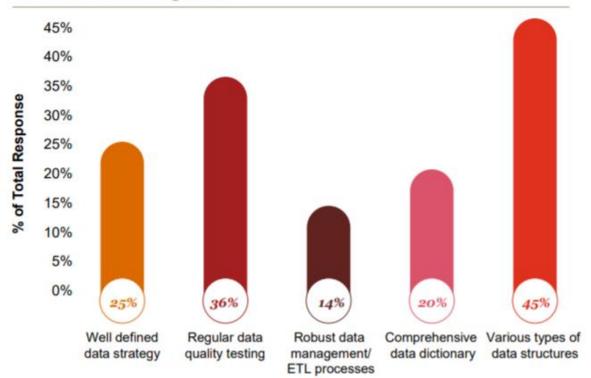
Complete process
automation is
very rare

- Surprisingly, the level of automation does not vary that much by the nature of activity Data manipulation is slightly more automated
- · Not surprisingly actuaries still rely on VBA type automation
- · P&C companies in general have a lower degree of automation





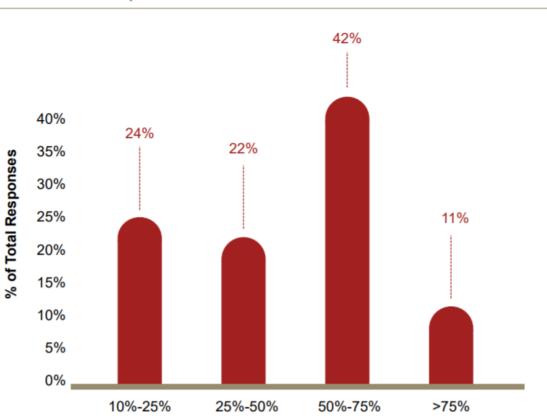
- Less than half of companies have a data strategy, data dictionary or robust data management
- Few insurers can support consistent ETL processes
- Inconsistently stored data causes inefficiencies



Actuarial data management



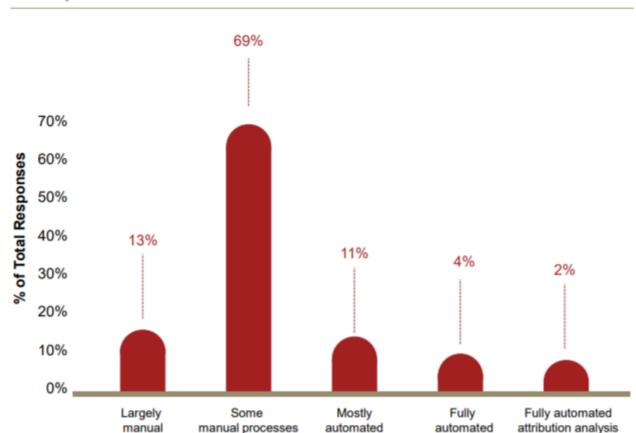
- The median actuary spends more than 50% of the time on data manipulation rather than analysis or reporting
- Actuaries spend less than 25% of their time on data in only 25% of insurers.
- No company polled achieves less than 10%



Time actuaries spend on data



- Over 90% of companies have not fully automated their modeling processes
- To achieve reduction in working day timetables this is an area that should be targeted for further automation



Model process automation

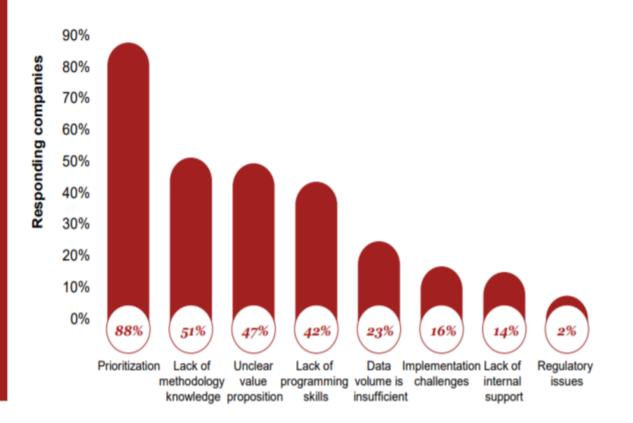


Training and development	 Only 20% of companies maintain a structured training program Further investment is needed to improve actuarial training and formalize current training programs 						
Staff training and development	 Ad-hoc training Some routine training Structured training program 	ne training Development program					
Assumption setting & experience analysis	45	34	11	11			
Reserving analysis	43	34	13	11			
Financial planning	41	33	15	11			
Pricing	34	38	13 2	13			
Modeling	30	41	15	13			
Valuation & financial reporting	28	47	11	15			
	0% 10% 20% 30% 40% % of Tot	50% 60% 70% 8 tal responses	30% 90%	100%			



- **Project Prioritization** is the most common impediment in adopting advanced analytics
- Insurers are smart to focus on data cleanup first
- Lack of methodology knowledge and programming skills are other key challenges

Greatest Impediments to Advanced Analytics Adoption





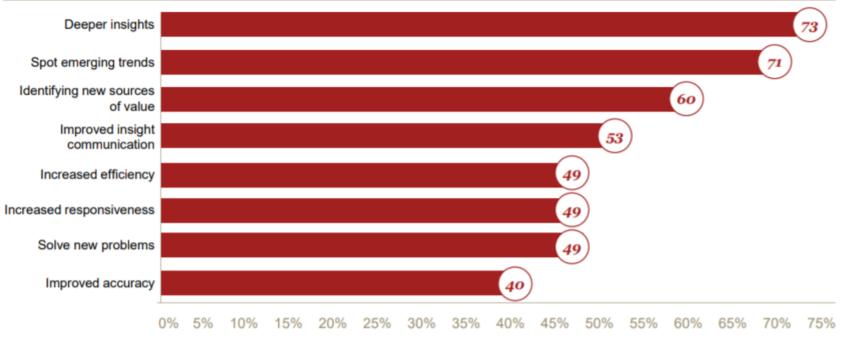
Emergent technologies	 Current technology investments are focused on speed, power, and insight Business Intelligence and cloud computing will be a common part of the actuarial toolkit within 3 years Expect advanced analytics & AI adoption within 5 years P&C and Reinsurers are eyeing blockchain 				
Adoption of		in 3-5 yrs	No plans for adop	ption	
emerging technologies	in 1-2 yrs	in >5yrs			
BI tools		44	24	10 4	18
Cloud computing		36		42 11	2 9
Big data and Hadoop	20	20	22	11	27
Robotic process automation	18	31	2	22 2	27
In-memory computing	13 7 4	4			72
Al/machine learning	4 20	20	16		40
Blockchain	4 11	13			72
	0% 10% 20%	30% 40% 50	% 60% 7	0% 80%	90% 100%
		% of Total responses			



Advanced analytics

- · Deeper insights and emerging trends are the two top drivers of advanced analytics
- P&C insurers cited 'identifying new sources of value' as their top driver
- Coupling advanced analytics with BI results in better clarity, faster results and greater responsiveness to management requests

Expected Value from Advanced Analytics



Responding Companies



Key Takeaways

Multiple catalysts are driving companies to modernize. Successful execution depends on having comprehensive plans.

 $(\mathbf{0})$

Significant opportunity exists to expand automation, increasing "productive time" and reducing process specialization. 03

Getting timely and accurate data is the top priority, and most companies have that today. The current state is effective, but suboptimal.



The changing paradigm will impact people, increasing the need for structured training and development programs, including new tools and techniques.

With necessary investments in data, technology, automation, training and development, and by articulating a comprehensive modernization strategy, actuarial teams can provide greater insights and value to their business partners.



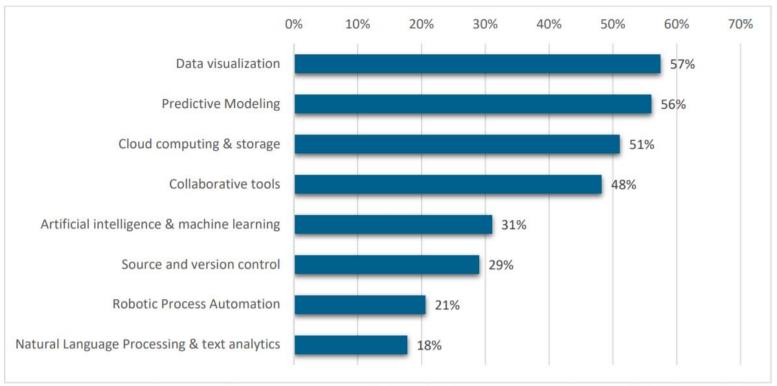
- Survey to be re-run in 2019 with a global coverage
- Global trends by region (incl. EMEA) analysed
- Interactive dashboards (Tableau) made available for participants enabling comparison to industry peers
- Public report summarising observations by 30 November
- Deadline for completion: 31 October 2019

Link:

https://pwc.qualtrics.com/jfe/form/SV_bQx42T4Ehm921o1



Top Actuarial Technologies of 2019** (SOA)



Technology Areas Expected to Grow Fastest in Use in 2019*

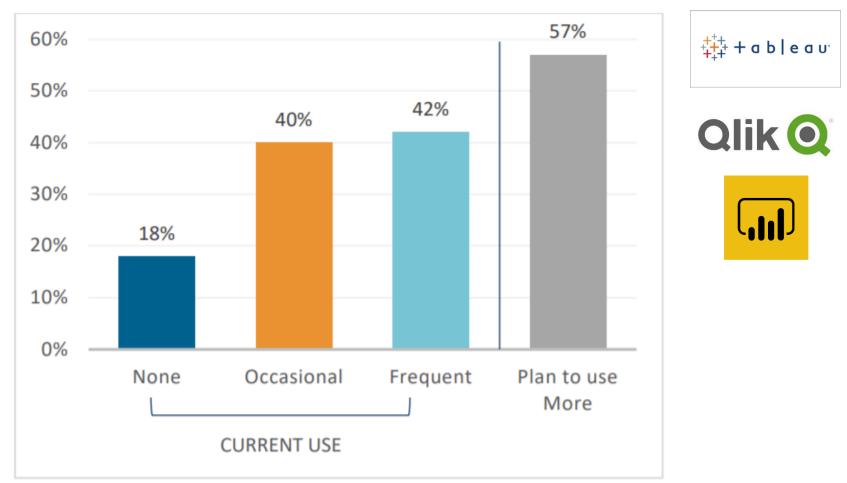
*Percentages represent the percent of actuaries surveyed who believe their usage will increase between March 2019 and March 2020.

**Source: Society of Actuaries (US), link included in the Appendix 26



Top Actuarial Technologies of 2019 (SOA)

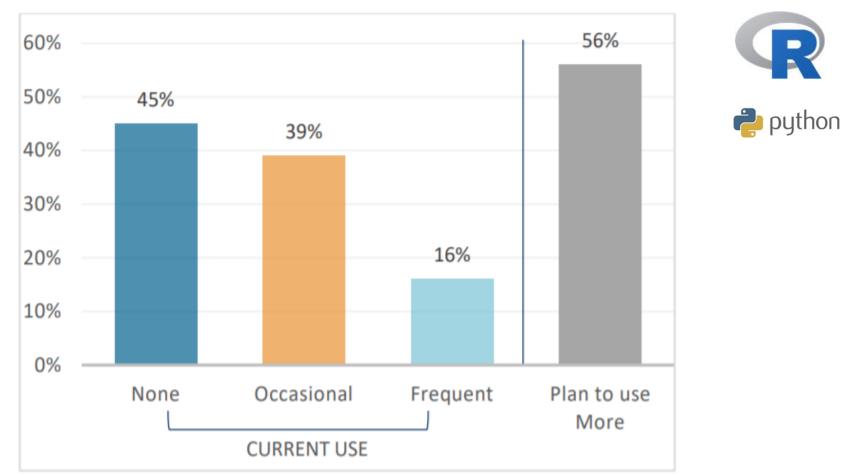
Use of Data Visualization Among Actuaries





Top Actuarial Technologies of 2019 (SOA)

Use of Predictive Analytics Among Actuaries





- Focus areas of digital initiatives
 - Short term: process automation and visualisation
 - Long term: predictive analytics and machine learning
- Training and upskilling
 - Actuarial skillset good basis
 - Still significant gap to be filled
 - Need to link training to solve practical problems
- Different mindset required
 - Collaboration
 - Business acumen



- Regulatory changes
 - IFRS 17 implementation and US GAAP changes (Long Term Contracts) over the next few years
 - Solvency II Shorter timelines for submissions and regulatory push to run ORSA quicker (e.g. ad-hoc ORSA), plus Boards looking for more insights / scenarios
- Data and modelling platforms
 - Data strategies and revamping of modelling platforms (modernisation plan) driven by regulatory changes and analytics
 - Actuaries should contribute in a proactive way aiming to maximise benefits for business (vs. minimising data requirements for valuation)

Examples of what we do – Firm wide

• Global technology training initiative

Financial Accounting News

- Digital Fitness App, Digital Academies, Digital Labs
- Innovation challenges and Hackathons
- Think beyond campaign just launched in national press, radio and Dublin airport



PwC Global Chairman Robert Moritz, shown during an economic forum in Russia in June, said the Big Four firm will spend \$3 billion on technology training. Photographer: Andrey Rudakov/Bloomberg via Getty Images

PwC Pledges \$3 Billion Technology, Training Investment Worldwide

*Source of article: Bloomberg, link included in the Appendix 31

Examples of what we do - Actuarial

- Online coding programme for all actuaries (team of 25 learning 2+ tools each)
- One week course on data transformation and automation tool (Alteryx) for 2 people solving real life problems (process inefficiencies)
- Working on around non-life audit and SCR process automation, interactive dashboards
- Collaborating with other teams (e.g. data analytics and technology)
- Linked in global insurance data analytics network promoting pricing automation and fraud detection using machine learning









Analytics use cases

© Society of Actuaries



- Behavioural analytics
- Costumer segmentation
- Claims analytics fraud detection
- Other insurance use cases



- Traditional actuarial techniques
 - Experience studies (lapse, option take up rates etc.)
 - Dynamic policyholder behaviour (as a function of economic indicators)

- Behaviour analytics
 - Churn analysis predictive modelling applied to identify segments of policyholders most likely to churn (=lapse)
 - Connect with policyholder lifetime value (CLV)
 - Retention programmes for high value customers



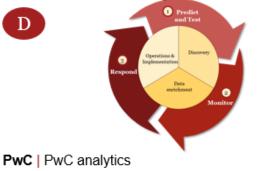
Behavioral intervention model for a Fortune-100 global insurance company

PwC used proprietary market research with agent-based modeling to understand consumer retention behaviors under varying economic and strategic scenarios

Created shortlist of specific retention interventions and developed suggested implementation roadmap

Esperiments			Relation	0.	Overall Appeal*			Ingented	
		Description	Orlean	See.	faces Profile	Auty to Auty t		Action	
F	Curroniasi Rea Dange Communication	Communicate nate change measure Economiae communication for Althematicate Innated	incactive Approciation		٠	٠			
2	Congettive denefits Congetion	Consumations and participants in summary participants -1.04 offer otherwise reading, while other insurancellas (2000), do not?	Defect Competition	0	e			Do New (Swith Hitt)	
8	Renned (over spa Renfere	Agentical to realize coverage 10 days before renewal package is sent; set	inceptive Appreciation	•	o	0	L		
4	Deautilite Drafts	replement deductible credits that grow with each renewal, and increase "weltching costs"	Create Self. Berliers	9	0	۹	L	Shert feel (theing Develo	
٩.	Partner Service Discourt Offer	for their with external service (e.g., the replacement, inside checkup, etc) that enhances of servicing and offer Securit	Create Salt Barriers	9	o	٠		Short for	
٩.	NARYOTH NAVER Galaxies	Target high-value an-fait customers by triggering a call with an offer of conversing them to better nates with GBAR	Roadie Approclation	٠	۰	0		Mid-Fact Climit Plane	
A.	Deduced Calm Rep	Declared Colms mp assigned to contament to help them tradition-contrologils the colms process	Prosider Appreciation	9	0	٥	I	Assess (Assess (3) Pr vs. Rots and Import, and Regulator	
ŕ	SONS Offer to Long- Tenund Guitomers	Offer-GBAB rate to selectiong renuml feorial' customers Pringipur share of an additional line	Sensegically Manager Price	9	O	0	L		
•	herlan@dver.0fer	Lyna partitionentan waker offer for high tenanti- customercetro experience anticome of as	Create Salt Barriers	9	0	٥			
	Net to see Up (15)	Capitale Increase at 5% for suprays of systemary who receive 4456-rate increases	Sensegically Manage Price	•	0	۰		ingle of in	
	David Appent Atlantic in Metadowickies and inte	- publishe assessed to Librity		(Note	_	Alex			

Helped the client stand up a 'Test and Learn' environment to test <u>pre</u>dictions before roll-out

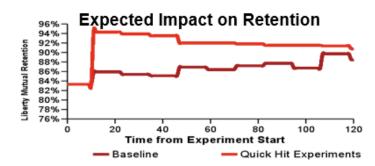




... Developed new customer segmentation based on churn indicators

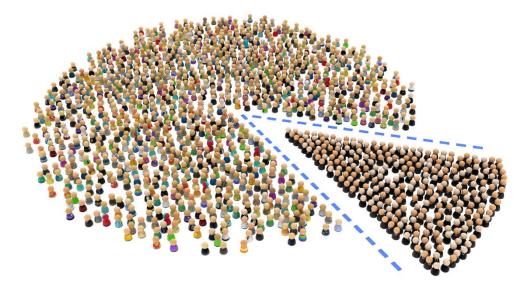


Simulated impact of select retention experiments on both shopping as well as switching behaviors





- Key element of business strategy
 - Which customer segments should the company target?
 - Determine characteristics of most attractive segments
 - Tailor products and distribution strategies to satisfy the needs of these segments
 - Further enhance strategy to create personalised products





Customer Segmentation

PwC performed quantitative surveys, gathered data, performed key driver analysis and developed customer segments to finally design the various distinct customer personas

PwC consumed and validated client survey data for selecting drivers for market segmentation...



...developed market segments and built personas based on constructed segments...



...constructed visuals to prioritize zip codes and areas to target



...developed a predictive model to compute opportunity size across US geographies and identified priority of zips...

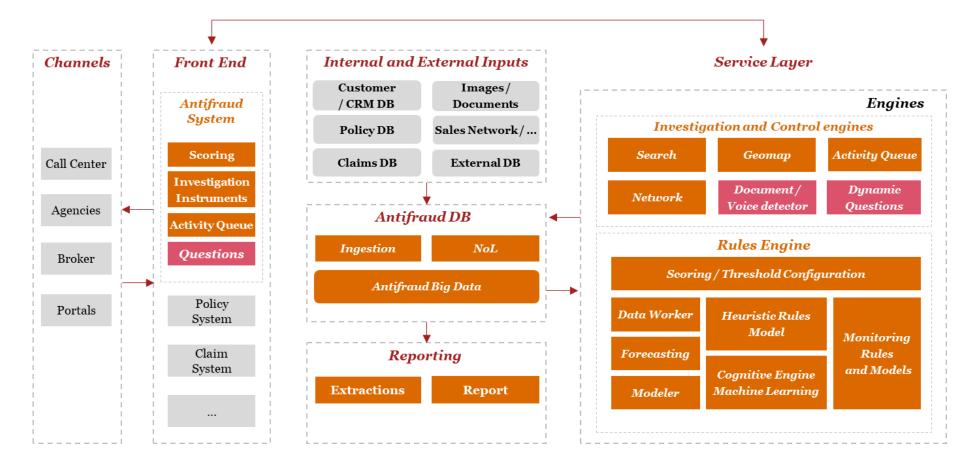




- Fraudulent claims represent upwards of 5-10% of non-life claims in Europe
- Innovative solution supported by approach developed by PwC in cooperation with technology firm GFT
- Focus on prevention, ability to learn, specialisation and transparency
- Aim is to detect all types of fraud real time using an anti-fraud database
- Scores produced by rule engine



Fraud detection





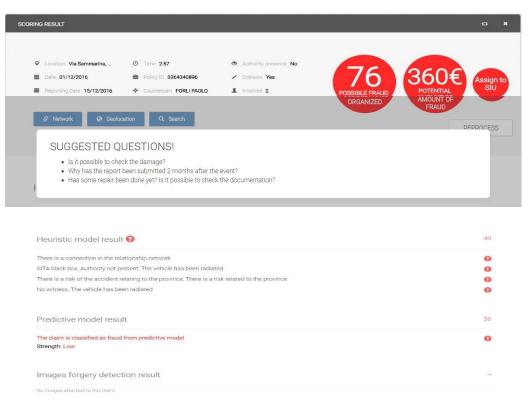
• We collect real time claims data from the customer. All these data and documents are analysed real time against all data in the antifraud database.

INSURED PERSON			Attached Images
ID: * JUFJQQ91F35/276T			 Ø foto1.jpg Ø foto10.jpg Scegli file foto10.jpg
Surname:	Name:	Address:	Calculate
GROCE	GIOVANNI	VIA GARIBALDI, 78, BUSCEMI, Siracusa, 96010	
Policy ID: *	Affected Guarantees:	Agency:	
3264340896	Casco 🔻	1131	
+ Claim Details			
Date: *	Registration Date: *		
01/12/2016	15/12/2016		
Time: *	Address:		
O 2:57	Via Sammarina, 54 Castel Maggiore BO 24100		
Number of Vehicles:	Damage Type:	Responsibility Percentage:	
no	To persons 🔻	90%	
Is there a CAI form with a joint signatures?	Is there any third party respons	bility?	

- Real time check of notified claims data
- Real time check of uploaded documents
- Usually the antifraud tool is integrated in the company's IT landscape (claims systems and underwriting systems) through our service layer



• We calculate the antifraud score real time and we give the users a first set of information to manage the claims properly: antifraud score, type of fraud, possible amount of fraud, next best action



- Real time antifraud score that sums heuristic rules, predictive models and investigation checks
- Real time alerting whenever the score is updated
- Dynamic questions to discourage potential fraudulent clients and collect more information
- Detailed information for the adjuster to manage the claim properly such as possible amount of fraud and type of fraud and next best action



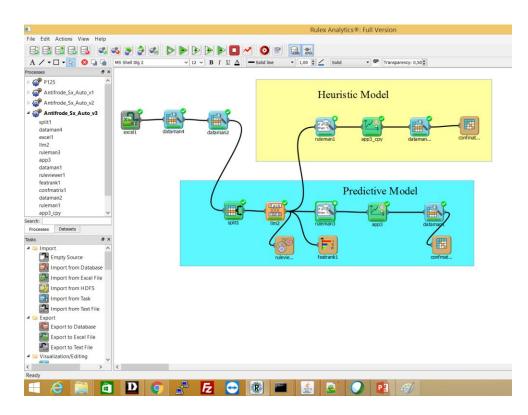
 Set of investigation tools in a unique solution. These are the best of the breed in the market and leverage on a unstructured database that is able to collect and search on structured and unstructured data

🗅 Meeting Launched 🗙 💘 Scoring 🛛 🗙 🕅 Ricerca	× 🔼 – 🖬 🛋
← → C O localhost:8080/GFT-Demo-FE/tools.jsp	Q 🖈 🕴 🗖
E Q. CURDENNI FABRIZIO	Englair• 🗮 0 (•
A Seath Y ci + X	Nationality Henrols C - X Gederator C - X
	A A A A A A A A A A A A A A A A A A A
Advanced Search	Bonised Bonised
Search options	i i i i i i i i i i i i i i i i i i i
Stoppe Despise on which is set up the search	b B Briton Brown Brown Brown
Orberton Alterna	Vilena (Perfect for Greet -
- Al terms •	Gongle Was stars 82014 Sections 65:016 (5020%), Google Inn Section Cell Collection Cell Collec
Failting on which to set the search	Information Wever - #
Search Delete	© CARDEN RARCO
	Tax:009 F0UU008P44(854)
	Summe OLADEWN
Search Results 2 - *	Name FABROO
Results 1-3 of 3 6 tall secret	Gender Mescric
CLAIDEINN FABRICIO 🕖 Soppe Angyafica ranno MABIOD sumare CLAIDENN	Reportycy: A Public Amrometer Ino
ANFERTINASTACTOR BLASS Store-Anaptics Integration - Anternet (AREDO Integration-Anternet (AREDON)	 Anomales ford (2)
	n Baolar
ESIA ARETINUETTA 55 Essa Aregonitati 55 Essa april, ser Masca History, ser Masca History, ser Masca	Build Toxic Downandte Switten Händle Downandte Switten Händle Biblio Ludovin Giblio Ludovin Giblio Ludovin Giblio Ludovin
	Argenuster (78644371) dated with Sackers Argenus

- Document search engine (Elasticsearch)
- Real time network analysis
- Geo mapping powered by Google
- Out of the box reporting and case manager
- Real time creation of documents with indication of anomalies found, connections and recurrences



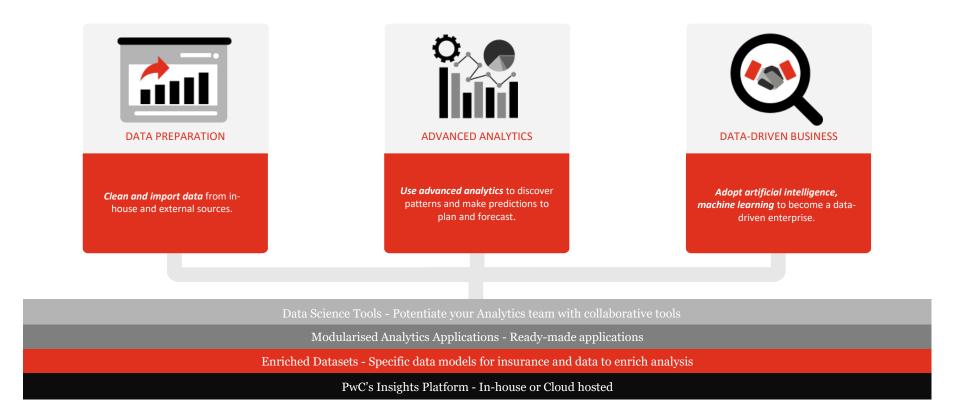
 Cognitive machine learning technology embedded. This technology enables running parallel heuristic models and different predictive models for each scenario.



- Cognitive machine learning to test heuristic models and to elaborate predictive models
- Different predictive models can be run in parallel
- White box with predictive models that can explain to customers how data are used and by whom
- Predictive models include both rules that explain why it is a potential fraud and why it isn't



Costumer Insight Platform





Other insurance use cases

	Pricing automation	Automation of the non-life pricing process using machine learning and challenger models
3	Telematics	Smart motor insurance products using telematics to achieve competitive pricing and to help people become better drivers
Ŕ	Distribution channel management	<i>Optimise agent and broker performance and incentives</i>
alt	Customer lifetime value (CLV)	Reliable indicator produced for CLV across the business and used in customer loyalty programs



Practical hints

- Encourage and reward innovation
- Help people upskill & link training to solving real life problems
- Start with small projects close to actuarial skillset – sandbox / pilot approach
- Measure success, clear KPIs
- Start with projects that pay off immediately and use them to upskill your team



Appendix

© Society of Actuaries



References

- AAE press release "Actuary 2020 A profession on the move" on actuaries of the future (June 2019):
 - https://actuary.eu/wp-content/uploads/2019/06/AAE-PR-ECA2019-FINAL.pdf
- PwC Actuarial Modernisation Survey report 2018 (US Only): <u>https://www.pwc.com/us/en/industries/insurance/assets/pwc-actuarial-modernization-</u> <u>survey-2018.pdf</u>
- Actuarial Modernisation Survey 2019 (Global) deadline for completion 31 October 2019: <u>https://pwc.qualtrics.com/jfe/form/SV_bQx42T4Ehm92101</u>
- Top Actuarial Technologies of 2019 (SOA): <u>https://www.soa.org/globalassets/assets/files/resources/research-report/2019/actuarial-innovation-technology.pdf</u>
- PwC Pledges \$3 Billion Technology, Training Investment Worldwide (Bloomberg Tax, October 2019):

https://news.bloombergtax.com/financial-accounting/pwc-pledges-3-billion-technologytraining-investment-worldwide

Links are clickable in Slide Show mode only, otherwise please right-click and select "Open Hyperlink". You can change mode on the Task Bar in the bottom-right corner of the PowerPoint window.







Bence Zaupper Senior Manager, Actuarial Services Group, PwC Ireland

Phone:	+353 (87)199-3201
E-mail:	bence.zaupper@pwc.com
Web:	www.pwc.ie/industries/insurance/actuarial-services.html
Address:	PwC Ireland
	One Spencer Dock, North Wall Quay
	Dublin 1, Ireland

Upcoming events

© Society of Actuaries



Upcoming Events



Professionalism Training

Venue: The Davenport Hotel, 8-10 Merrion Street Lower, Dublin Speakers: Sally Calder, Education Actuary at the IFoA



M&A from a Practitioners Perspective

Venue: The Richmond Education and Event Centre, 1 Brunswick Street North, Smithfield, Dublin 7 Speakers: Waheeda Narker, Director at Willis Towers & Fergal O'Shea, Senior Director at Willis Towers



SAI Inaugural Student & Recent Qualifiers' Ball

Venue: Radisson Blu Royal Hotel, 8 Golden Lane, Dublin 8



Upcoming Events

- Students & Recent Qualifiers Ball
 - Hosted on Friday, 1st November 2019. In the Radisson Blu, Golden Lane.
 - Ticket price of €65 includes:
 - Drinks Reception
 - 3 Course Meal
 - Live Band
 - Limited Tickets still available for sale on SAI website.

