

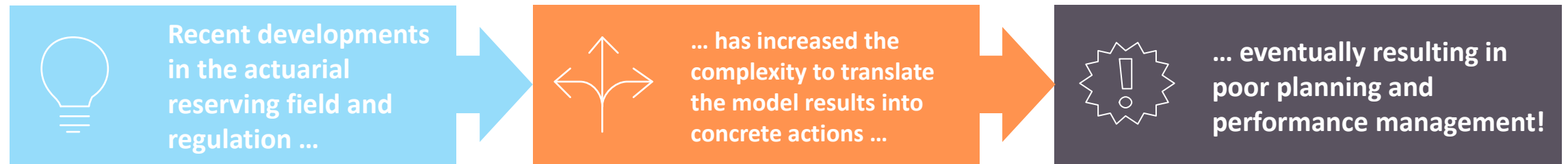
BRIDGING RESERVING AND BUSINESS STEERING USING AI ASSISTANCE


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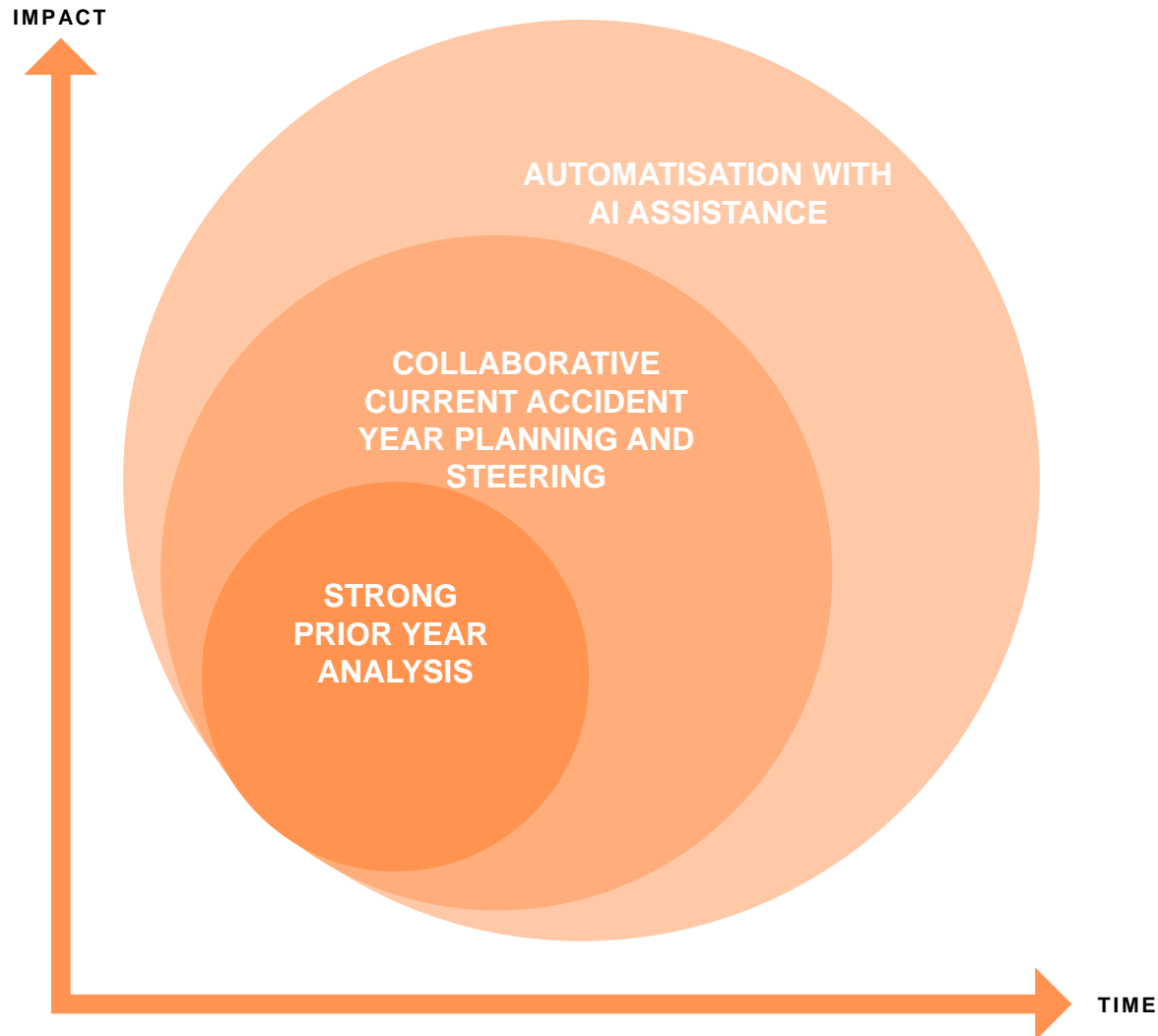
SAV Annual Meeting, 28th August 2020

INTRODUCTION



 The main purpose of this presentation is to present a pragmatic approach to implement a **simple but efficient reserving framework** which can also be easily automatised with AI / ML

THE JOURNEY: RESERVING WITH AI ASSISTANCE



Ensure that the basics actuarial concepts and KPIs are **well understood and defined univocally** (ie. one source of truth)

The next level leads to the day to day usage of the reserving insights, to **operationalize strategic and planning decisions**

Finally, bring AI into the reserving world, to allow actuaries to **relief resources on reporting efforts** and assist them to **improve their reserving insights even further**



Content Topics

01

PRIOR YEAR / RUNOFF

02

CURRENT ACCIDENT YEAR

03

AUTOMATISATION WITH AI ASSISTANCE

RUNOFF – KEY PRINCIPLES

➤ The **actuarial function (AF)** is the **owner** of the **reserves**

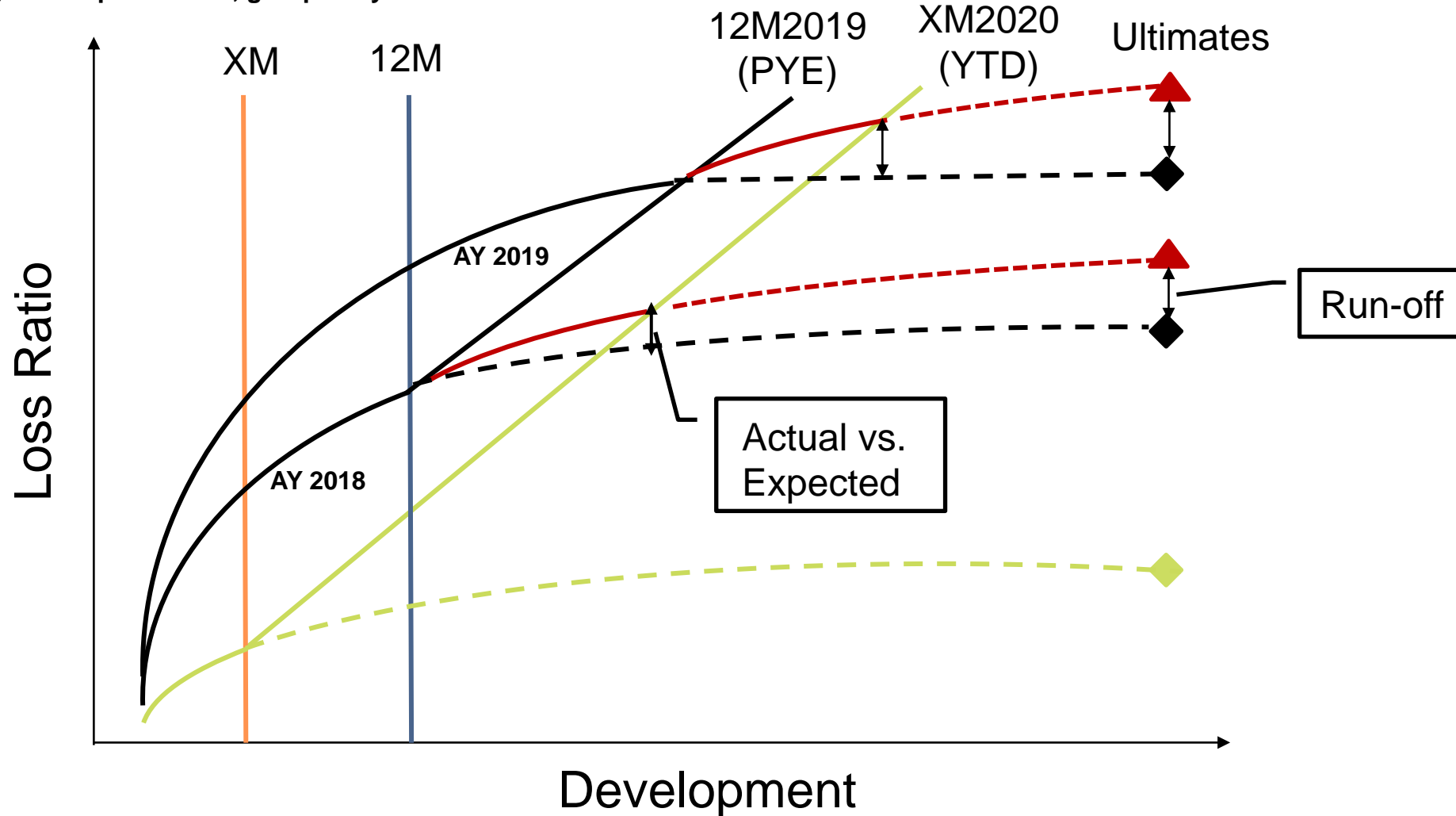
THE AF HOLDER SHOULD ...

- ... be responsible for the **runoff** (gross and net) booked in the P&L
- ... **be able to explain** how much of the runoff is driven by *update in data* and how much by *change in assumptions*
- ... have an understanding of the **uncertainty of the results**, where:
 - **LOW** is the minimum he/she would sign
 - **MID** is the recommendation
 - **HIGH** is the maximum he/she would sign



RUNOFF – CHANGE IN DATA vs ASSUMPTIONS

Loss ratio by Development Year, grouped by Accident Year





RUNOFF - MONITORING

AY	Loss Ratios (Raw data)														Loss Ratios (Booked)				Consistency Check
	Paid				Diagnostic (YTD - PYE)			Incurred				Diagnostic (YTD - PYE)			IFRS				
	06M	12M	PYE	YTD	Actual	Expected	A vs E	06M	12M	PYE	YTD	Actual	Expected	A vs E	PYE	YTD	Runoff	IFRS vs 12M Incurred	
(1)	(2)	(3)	(4)	(5)=(4)-(3)	(6)	(7)=(5)-(6)	(8)	(9)	(10)	(11)	(12)=(11)-(10)	(13)	(14)=(12)-(13)	(15)	(16)	(17)=(16)-(15)	(18)=(16)-(9)	(17)>=MIN[(7),(14)]	
...																			
2015	25.7%	47.0%	39.0%	39.5%	0.5%-p	0.2%-p	0.3%-p	52.0%	56.5%	62.2%	63.2%	1.0%-p	0.5%-p	0.5%-p	71.0%	71.6%	0.6%-p	15.1%-p	✓
2016	25.7%	50.6%	63.9%	64.0%	0.1%-p	0.2%-p	-0.1%-p	52.0%	61.0%	65.9%	66.0%	0.1%-p	0.1%-p	0.0%-p	67.3%	67.3%	0.0%-p	6.3%-p	✓
2017	25.4%	50.5%	63.6%	63.8%	0.2%-p	0.3%-p	-0.1%-p	52.0%	63.0%	65.7%	65.7%	0.0%-p	0.2%-p	-0.2%-p	67.5%	67.2%	-0.3%-p	4.2%-p	!
2018	24.9%	52.6%	63.6%	63.9%	0.3%-p	0.5%-p	-0.2%-p	47.8%	63.5%	66.1%	66.2%	0.1%-p	0.2%-p	-0.1%-p	68.5%	68.5%	0.0%-p	5.0%-p	✓
2019	25.3%	47.0%	46.9%	54.9%	8.0%-p	8.1%-p	-0.1%-p	72.7%	62.2%	62.2%	64.5%	2.3%-p	2.5%-p	-0.2%-p	68.4%	68.2%	-0.2%-p	6.0%-p	!
2020	27.5%							56.7%								70.6%			
					Total	● -0.4%						Total	● 0.2%		Total	● 0.1%			✓
					(value)	-4,500,000						(value)	2,000,000		MID	1,000,000			
															LOW	- 4,000,000			
															HIGH	6,000,000			

- + AvE can approximate **update in data**. Difference between *runoff and AvE* approximates **change in assumptions**
- + Quick (pragmatic) **back testing for uncertainty**. For example, if PYE booking was:
 - LOW (1in2 years negative runoff return period) ~ a red AvE every 2 years
 - MID (1in3 years negative runoff return period) ~ a red AvE every 3 years
 - HIGH (1in5 years negative runoff return period) ~ a red AvE every 5 years
- + Possibility to dig into details as much as needed

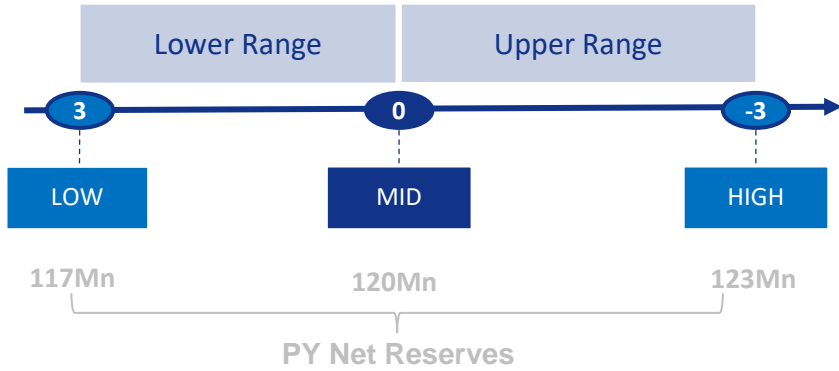
Legend:
 Positive values are loss, **negative** are profit

XM: X months development
12M: 12 months development
YTD: year-to-date development
PYE: previous year end development

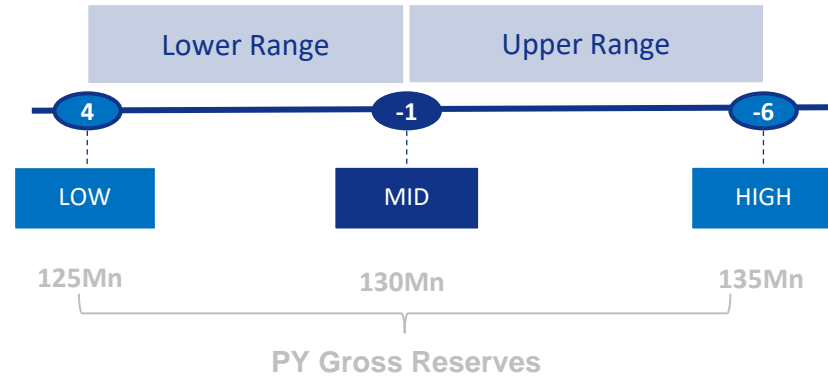


RUNOFF - RANGE

Range of Total Net PY Run-off as at 6M2019



Range of Total Gross PY Run-off as at 6M2019



Net Run-Off figures with ULAE in EUR mn, by LoB

LoB	LOW	MID	HIGH
LoB1	5	-0.2	-1
LoB2	1	-1	-3
LoB3	-3	1.2	1
...			
Total	3	0	-3

Gross Run-Off figures with ULAE in EUR mn, by LoB

LoB	LOW	MID	HIGH
LoB1	1	0	-1
LoB2	0.5	-0.5	-2
LoB3	2.5	-0.5	-3
...			
Total	4	-1	-6



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AUTOMATISATION WITH AI ASSISTANCE

CAY LOSS RATIO – KEY PRINCIPLES

➤ The **actuarial function (AF)** is the **owner** of the **ultimate loss ratio**

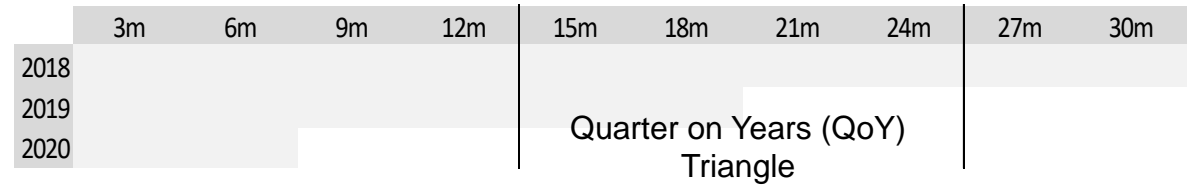
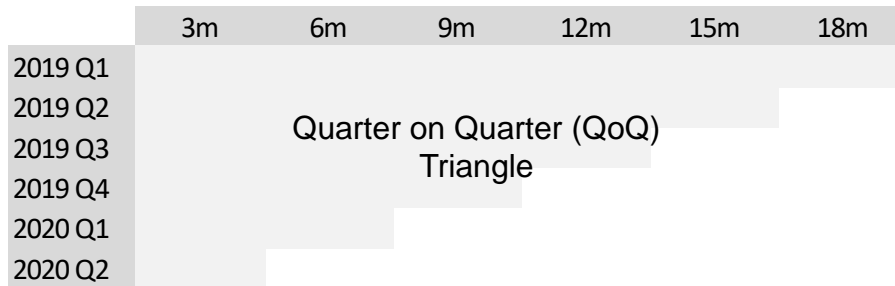
THE AF HOLDER SHOULD ...

- ... be responsible for the **loss ratio** (gross and net) booked in the P&L
- ... **be able to explain** how much of the deviation vs Plan is due to the *business areas* (over/under achieving their targets) and *actuarial* (changing their assumptions)
- ... have an understanding of the **uncertainty of the results**, where:
 - **LOW** is the minimum he/she would sign
 - **MID** is the recommendation
 - **HIGH** is the maximum he/she would sign

CAY LOSS RATIO – MAIN ISSUES

- There is a **lack of actuarial literature** (can we say there is basically nothing at all?) on the current accident year for quarterly closings
- **Different approaches and definitions** across the market: “year-to-date” or a “full-year” ultimate loss ratio?
- Roles&Responsibilities (between actuarial/pricing/claims/underwriting/etc) usually **not clearly defined**

CAY LOSS RATIO – TWO COMMON MARKET APPROACHES



“Year-to-date” approach

We assume the company in “runoff”, ie. what is the ultimate loss ratio if the unearned exposure won’t happen

- Premium reserves (S2 / IFRS17) should reflect the profitability of the unearned part
- Doesn’t naturally reflect annual business exposure (eg. pricing, BF, etc.)
- Erratic projections (as relies on quarterly data)

“Full year” approach

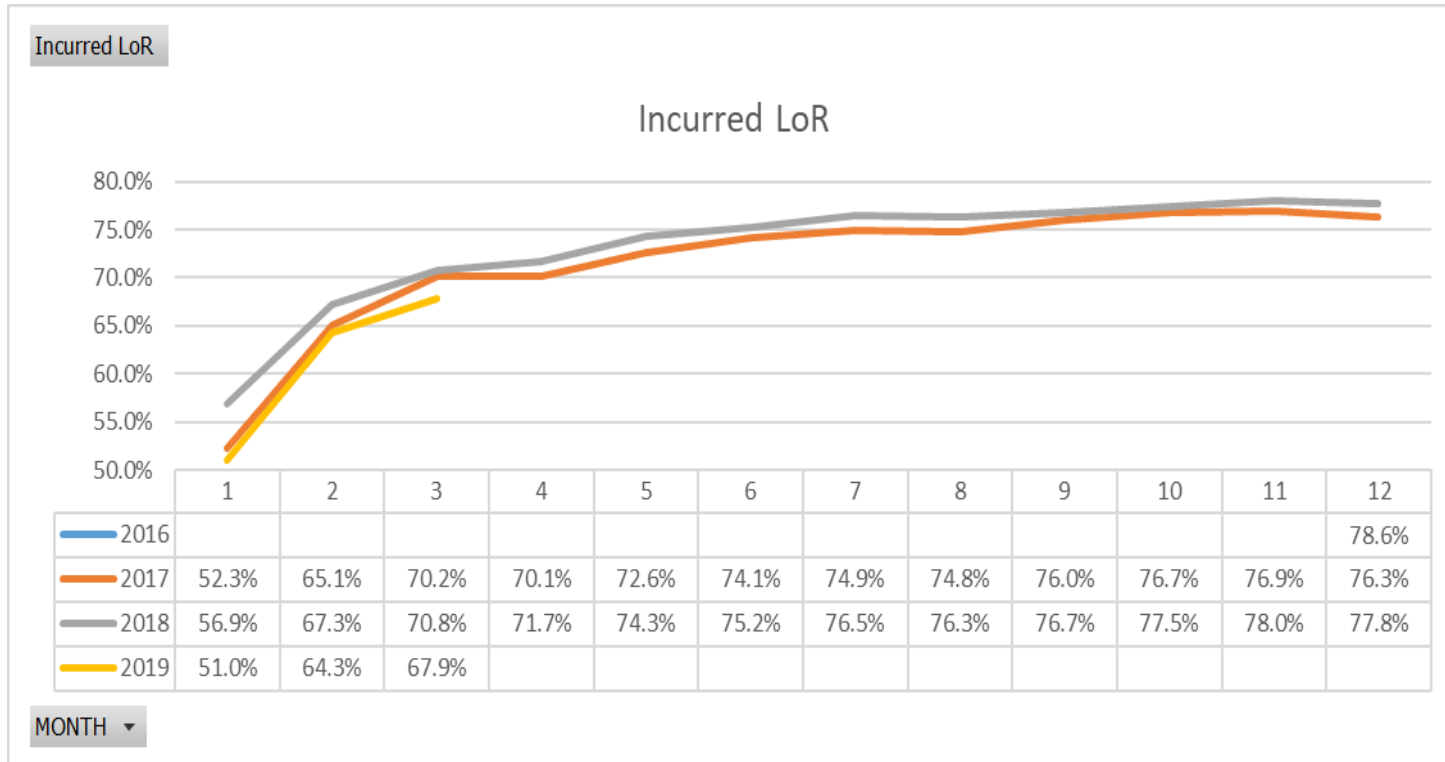
We consider also the future claims/exposure that will happen in the year

- + Premium reserves (S2 / IFRS17) can use the same loss ratio of the CAY
- + Easy to interpret, as gives a feeling of (yearly) normalised loss ratio (eg. pricing, BF, etc.)
- + Stable projections with possibility to spot change in trends (quarter or month development)
- + Immediate reconciliation with Technical KPIs



“FULL YEAR” APPROACH – (NO) SEASONALITY

➤ Another advantage is that in a “full year” approach, the **Ultimate** Loss Ratio (ULR) **does not have** a seasonality, whilst the **Incurred** Loss Ratio (ILR) does



Example from chart:

- (1) If in March we observe a **67.9% incurred**, and we know that the business is fully developed after 12 months (ie. No IBNER/IBNYR), how much IBNR would you book? *Answer: ~10%-p*
- (2) And if in June we still observe something in line with the past, ie. ~75%, how much IBNR should we book? *Answer: ~3%-p*
- (3) And towards the end of the year you will have an **IBNR more accurate** thanks to the emerging experience (*) ...

➤ In other words, the ULR in the example is always **around 78%** (“normalized” loss ratio), and the volatility around it depends on the **emerging** loss experience: it is **random**, not **seasonal**.

(*) NOTE: the above is true also if the incurred is higher than the ultimate – of course, in this case, booking a negative IBNR the analyst should pay even more attention ...



ULTIMATE LOSS RATIO – INCURRED AND IBNR

➤ For this reason, we need to ensure that observed data (**Technical KPIs**) are reported separately from actuarial adjustments (**IBNR and large/natcat(*)**), to ensure a clear *performance tracking*:

$$\text{Ultimate Loss Ratio (ULR)} = \text{Incurred Loss Ratio (ILR)} + \text{IBNR}$$

TECHNICAL KPIs

1 2

Incurred Loss Ratio (ILR): Represent the total cost of the claim w/o IBNR

✓ Basis for discussion with the **business areas** (claims/pricing/underwriting..) on a recurrent basis.

Technical KPIs must reconcile to the incurred loss ratio

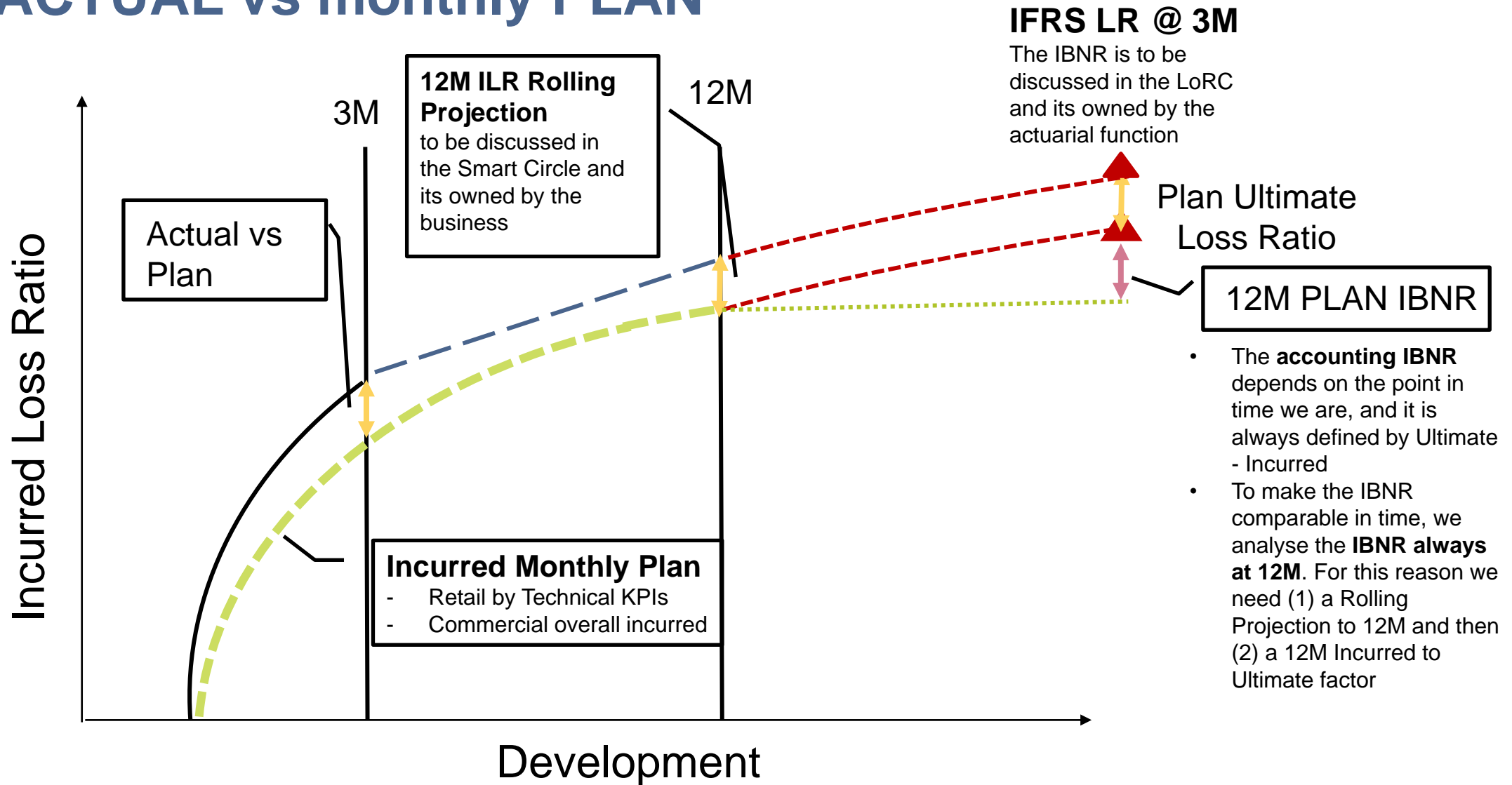
IBNR: it is the sum of IBNER (Incurred But Not Enough Reserved) + IBNYR (Incurred But Not Yet Reported)

✓ Main discussion with the **actuarial function**, to be validated against prior year analysis

! (*) **Note:** large/natcat losses are modeled via EVT (eg. Pareto/Poisson model or exposure based) and excluded from this presentation

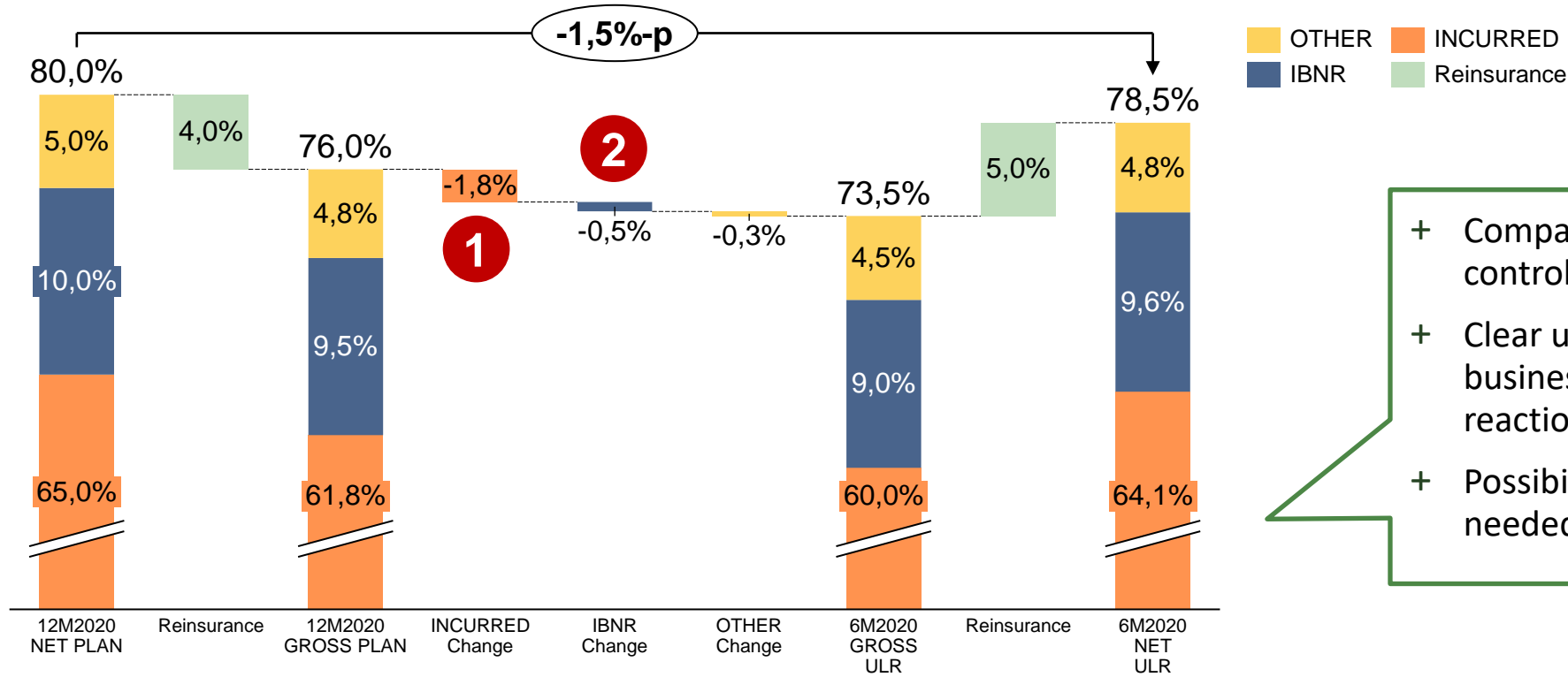


CAY – ACTUAL vs monthly PLAN





OE – CAY WALK



- + Company year-end target always under control
- + Clear understanding of the movements, business vs actuarial to enable quick reactions
- + Possibility to dig into details as much as needed

Business areas

Key comments to explain the differences with the business

1

Actuarial

Key comments on IBNR change

2

Other

Any other comments (large losses/ULAE/etc)



1 OE – ACTUAL VS PLAN

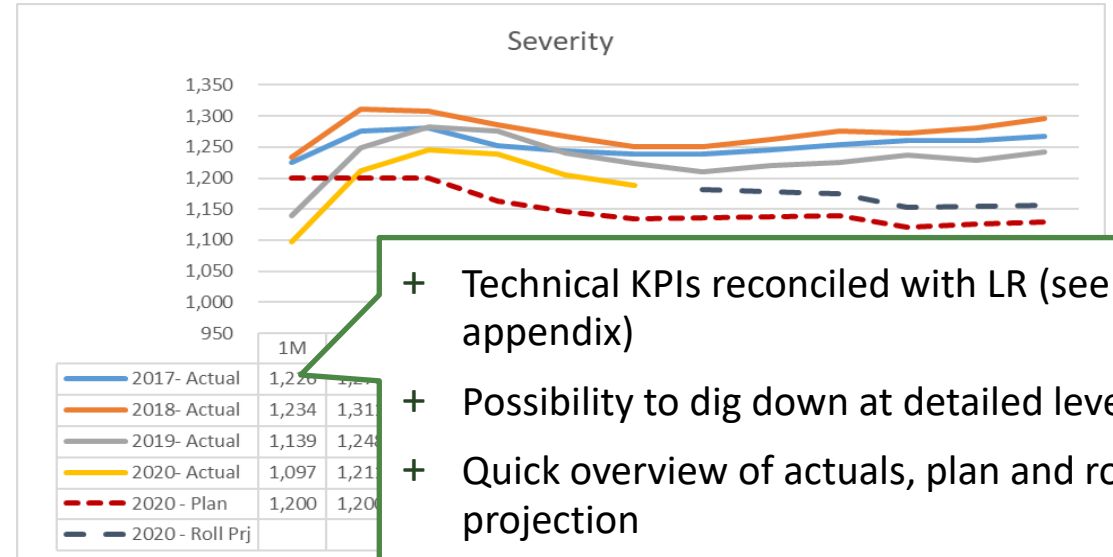
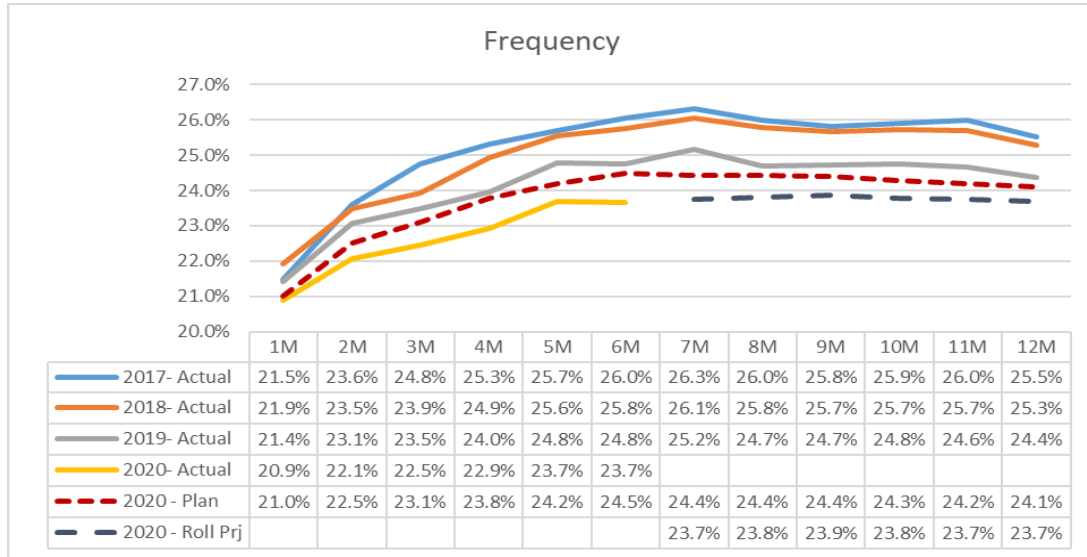
- + Comparison vs the plan (incurred only), vs past for reference
- + Automatic RP as of year-end (credibility approach)

LoB		ACTUAL				(INCURRED) PLAN					
	Monitoring (ATTR/TOTAL)	GEP/NEP 05M2020	ILR 05M2019	ILR 05M2020	Actual vs PY ILR	Plan ILR 05M2020	Actual vs 05M Plan	Incurred RP 12M2020	Plan ILR 12M2020	12M Incurred RP vs 12M Plan	Consistency Check
	(1)	(2)	(3)	(4)	(5)=(4)-(3)	(6)	(7)=(4)-(6)	(8)	(9)	(10)=(8)-(9)	(10)>=(7)
LoB1	Total	1,200	45.0%	47.0%	● 2.0%-p	48.0%	● -1.0%-p	49.5%	50.0%	● -0.5%-p	✓
LoB2					● 0.0%-p		● 0.0%-p			● 0.0%-p	✓
MOTOR					● 0.0%-p		● 0.0%-p		focus	● 0.0%-p	✓
LoB3					● 0.0%-p		● 0.0%-p			● 0.0%-p	✓
LoB4					● 0.0%-p		● 0.0%-p			● 0.0%-p	✓
PL					● 0.0%-p		● 0.0%-p		focus	● 0.0%-p	✓
LoB5					● 0.0%-p		● 0.0%-p			● 0.0%-p	✓
LoB6					● 0.0%-p		● 0.0%-p			● 0.0%-p	✓
...					● 0.0%-p		● 0.0%-p			● 0.0%-p	✓
CL					● 0.0%-p		● 0.0%-p			● 0.0%-p	✓
Total					● 0.0%-p		● 0.0%-p			● -1.8%-p	✓

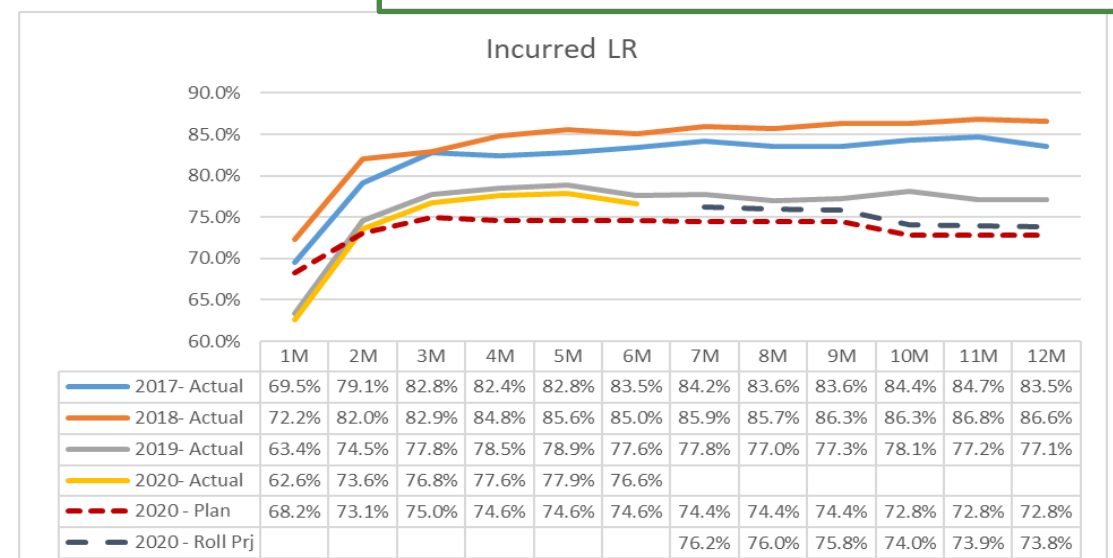
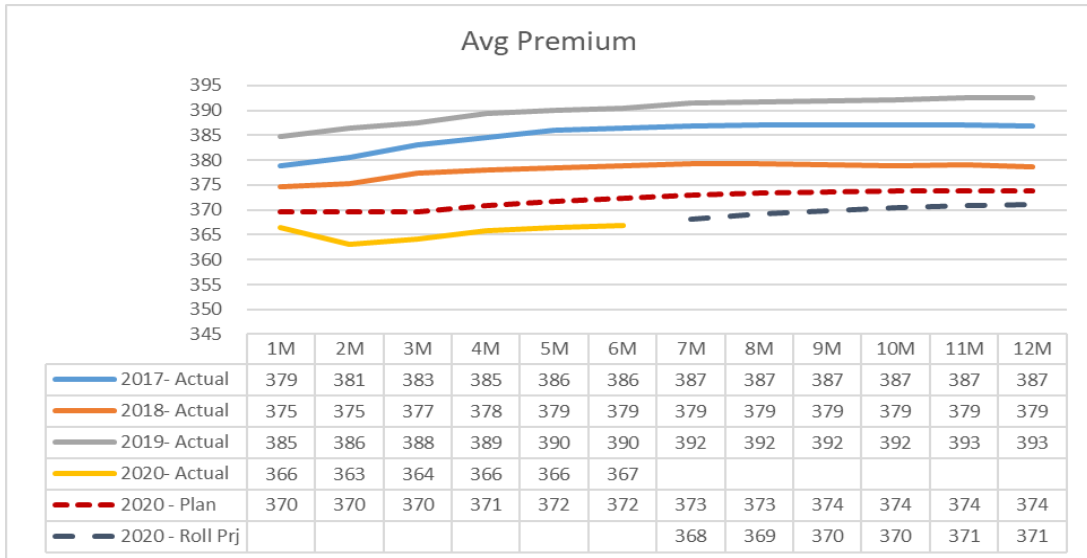
Reconciled with the walk



1 FOCUS LOB 1 – TECHNICAL KPIS

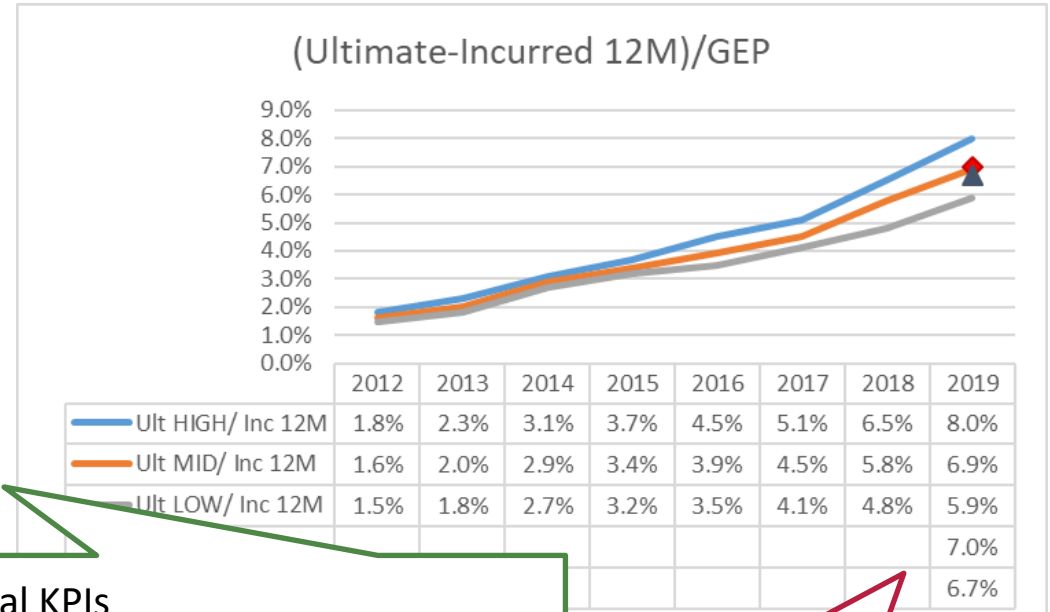
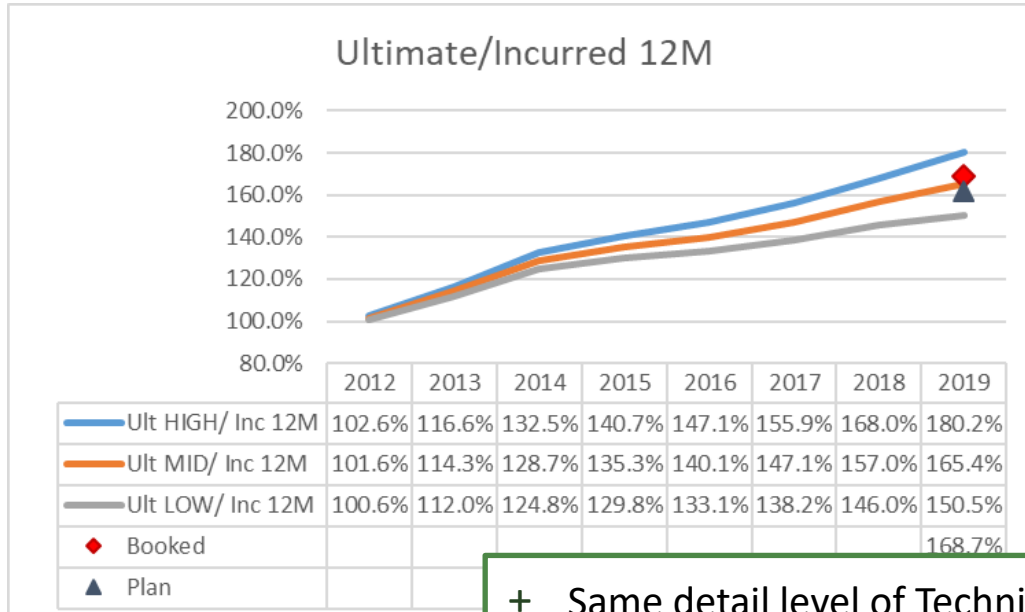


- + Technical KPIs reconciled with LR (see appendix)
- + Possibility to dig down at detailed level
- + Quick overview of actuals, plan and rolling projection





2 OE – 12M INCURRED TO ULTIMATE RATIO



Comments

- + Same detail level of Technical KPIs
- + They represent the ratio between ultimate and case reserves as year-end from PY analysis:
 - + **Flat trend** – no significant changes in case reserve policy
 - + **Increasing trend** – case reserves tend to have “less money” over time to pay for claims
 - + **Decreasing trend** – case reserves tend to have “more money” over time to pay for claims
- + Comparison of booking vs Plan and PY ranges

Reconciled with the walk



Content Topics

01

PRIOR YEAR / RUNOFF

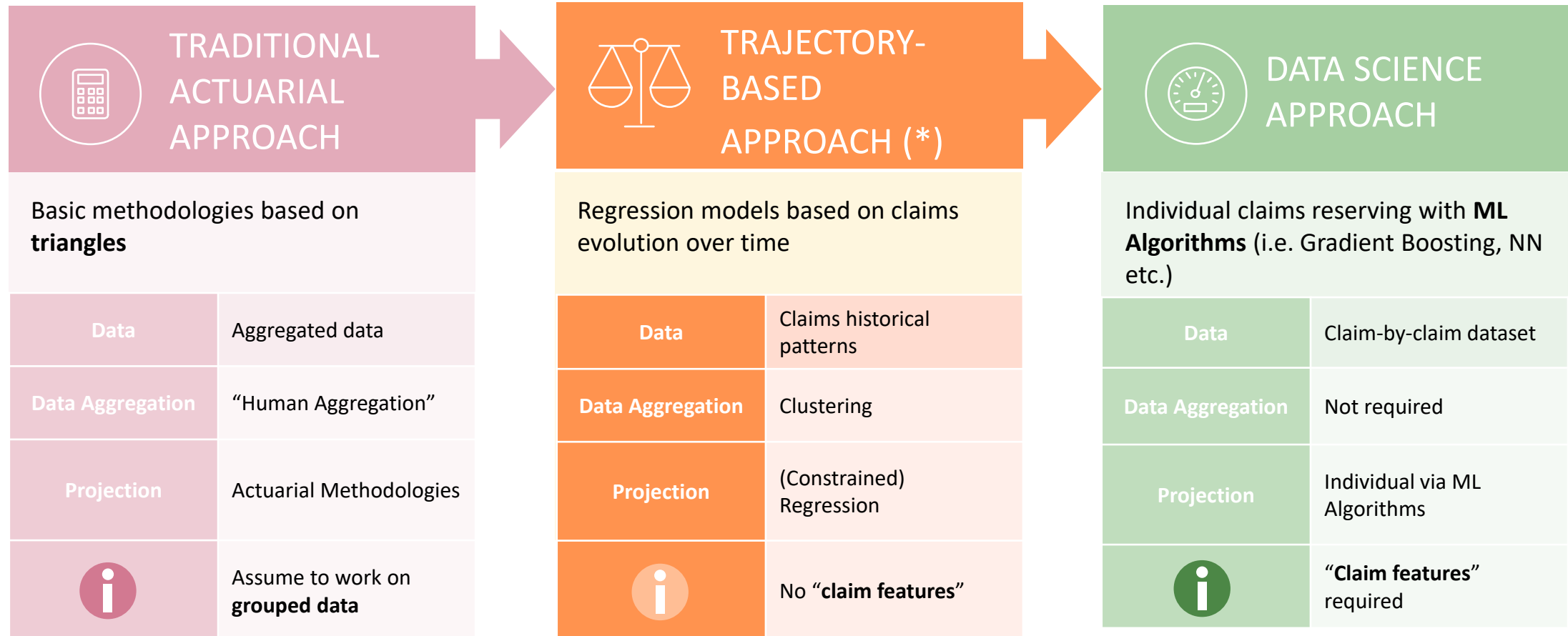
02

CURRENT ACCIDENT YEAR

03

AUTOMATISATION WITH AI ASSISTANCE

BRIDGING ACTUARIAL AND DATA SCIENCE WORLD

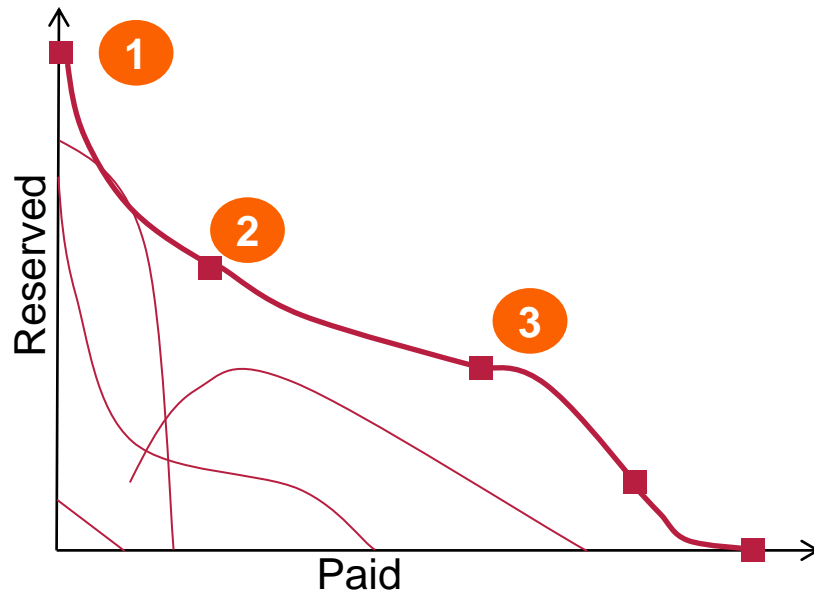


(*) Carrato, Visintin (2019) - „From Chain Ladder to Individual Claims Reserving with Machine Learning“ (ASTIN Colloquium 2019)

Video: https://www.actuview.com/from-the-chain-ladder-to-individual-claims-reserving-using-machine-learning-techniques_4a3da9262.html



THE PAID-RESERVED TRAJECTORY



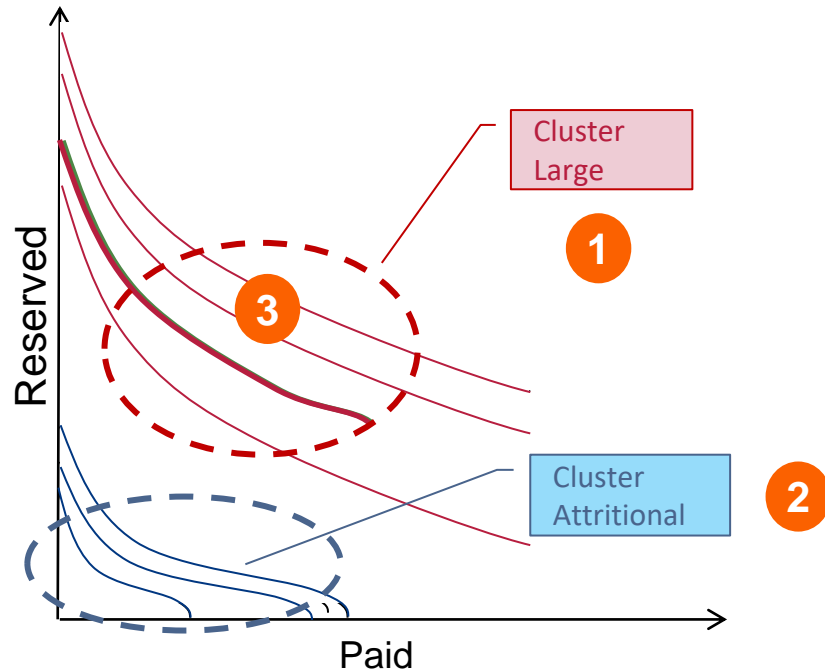
1. After its occurrence, a claim is reported and a case reserve is allocated

2. Subsequently, a certain amount is paid and the case reserve decreases accordingly

3. The claim continues its developing until is definitively closed (Ultimate Cost)

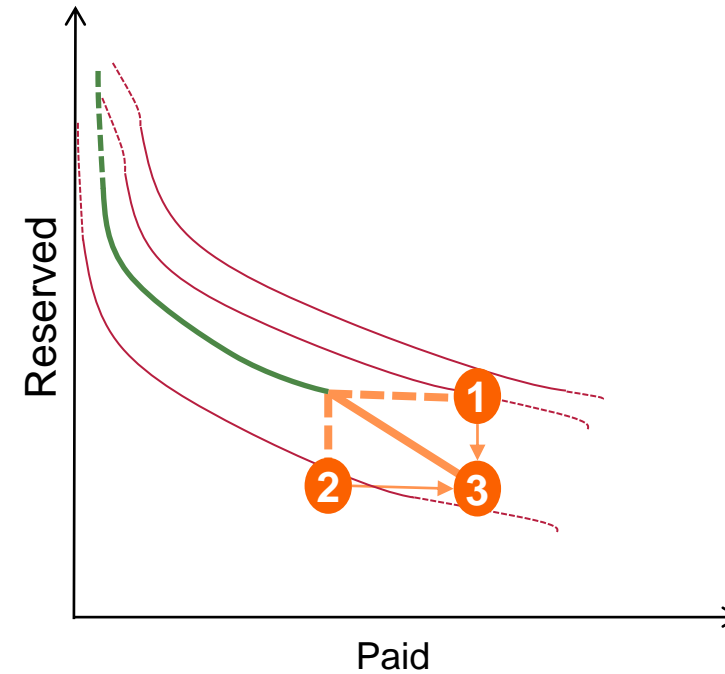
THE TWO-STEPS ALGORITHM

Step 1 – Clustering



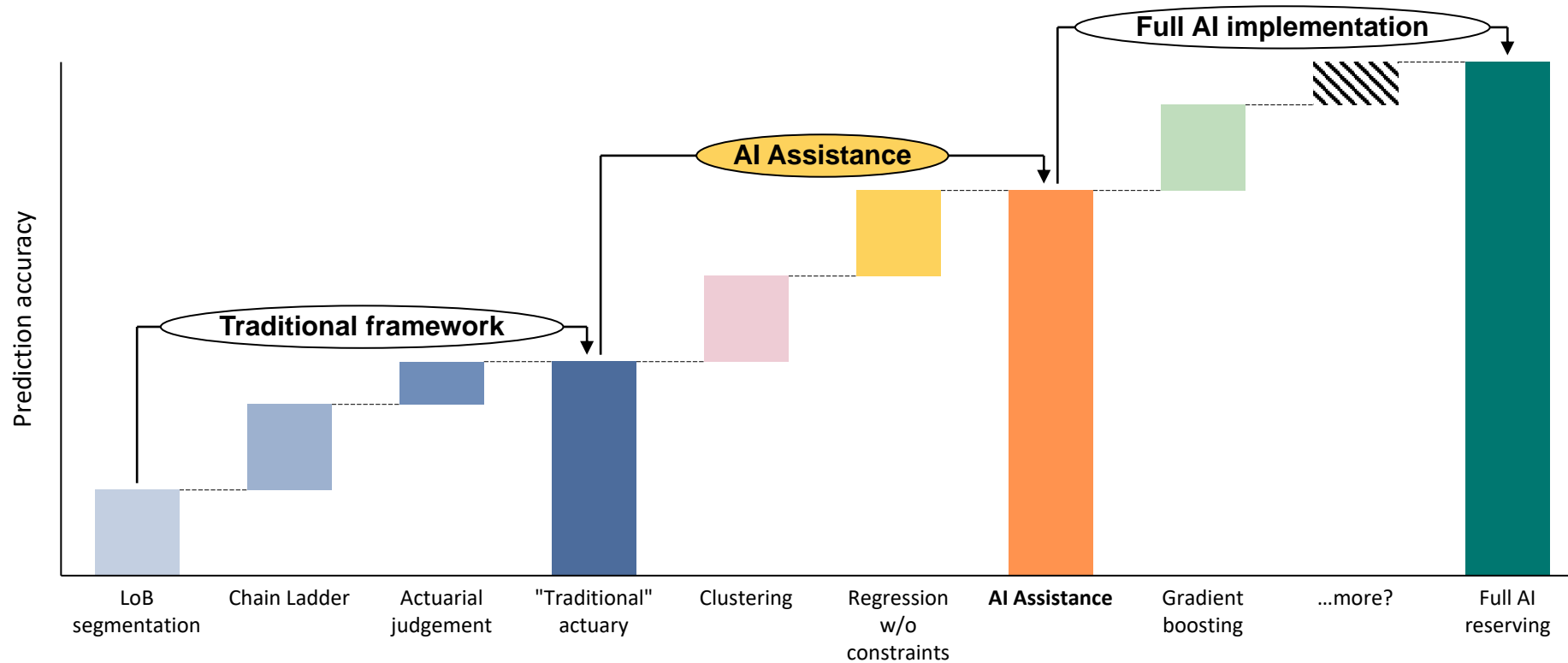
> With clustering techniques, we are able to identify and aggregate claims with similar trajectories up to a fixed development period

Step 2 – Projection



> Two linear regression model, are fit on historical claims data to develop the paid amount (1) and the reserved amounts (2). Therefore, the projected point has coordinates defined by (1) and (2)

THE LONG ROAD OF AI RESERVING ...



+ Before moving to full AI implementation, we need to ensure that (1) we are able to replicate most of the existing processes with an automatic process and (2) that we have “one single source of truth”

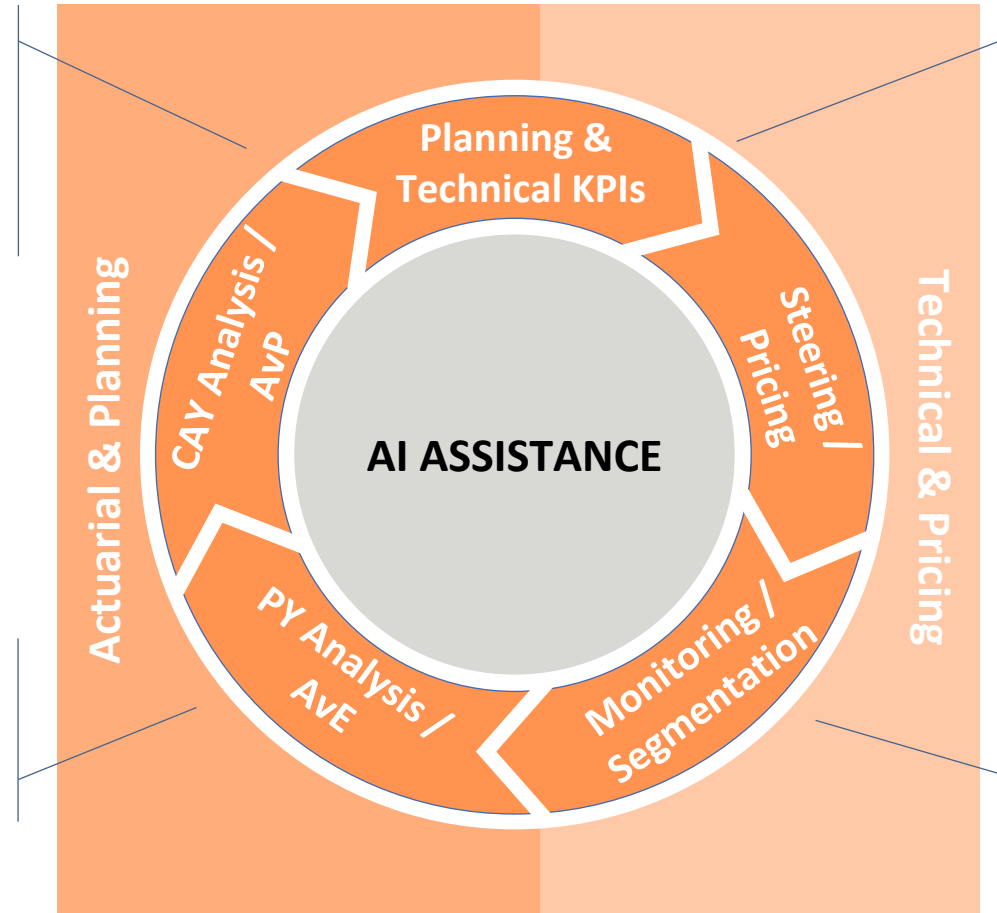
IN CONCLUSION – ONE PLATFORM FOR ALL

Current Year analysis:

- Actual vs Plan for Technical KPIs
- 12M Incurred to Ultimate for IBNR

Prior Year analysis:

Actual vs Expected analysis at any granularity



Planning cycle:

Clearly define business targets vs actuarial assumptions

Monitoring:

All monitoring should come from the same system / one source of truth and run on regular basis



**MANY THANKS FOR
YOUR ATTENTION**



APPENDIX - FORMULAE

TECHNICAL KPIs DEFINITION

$$\begin{aligned} \text{Incurred LR} &= \frac{\text{Incurred Claims}}{\text{Earned Premiums}} = \frac{\frac{\text{Incurred Claims}}{\text{Reported (non nil) Claims}} * \text{Reported (non nil) Claims}}{\text{Earned Premiums}} = \frac{\frac{\text{Incurred Claims}}{\text{Reported (non nil) Claims}} * \frac{\text{Reported (non nil) Claims}}{\text{Risk years}}}{\frac{\text{Earned Premiums}}{\text{Risk years}}} \\ &= \frac{\text{severity} * \text{frequency}}{\text{avg premium}} \end{aligned}$$

$$\text{Severity} = \frac{\text{Incurred Claims}}{\text{Reported (non nil) Claims}} \quad \text{Frequency} = \frac{\text{Reported (non nil) Claims}}{\text{Risk years}} \quad \text{Avg. Premium} = \frac{\text{Earned Premiums}}{\text{Risk years}}$$

ACTUAL VS EXPECTED DEFINITION

$$\text{Actual} = \text{Triangle Latest}_{t+x} - \text{Triangle Latest}_t$$

$$\text{Expected} = (\text{Ultimate}_t - \text{Triangle Latest}_t) * \frac{(\text{Pattern}_{t+x} - \text{Pattern}_t)}{(1 - \text{Pattern}_t)}$$

Where:

- Previous Year End = t
- Year To Date = t+x
- And Pattern_{t+x} and Pattern_t stand for the percentage developed YTD (ie. t+x) and for the percentage developed as at PYE Date (t), respectively.

AUTHOR



Alessandro Carrato has been working at Allianz SE as Regional Chief Actuary for Iberia&LatAm regions since 2019. Before that, he worked in various actuarial, risk management and product development roles across different countries. He is currently a certified actuary for both Italian (ISOA) and English (FIA) actuarial associations and holds a MSc in Statistics and Actuarial Science from the University of Trieste. During his career, he has been presenter and speaker at several conferences, focusing mainly on Non Life actuarial topics. Since 2012, he is also a co-author of the [R ChainLadder package](#) and recently his main interests are around bridging the actuarial world to the modern data science techniques.

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