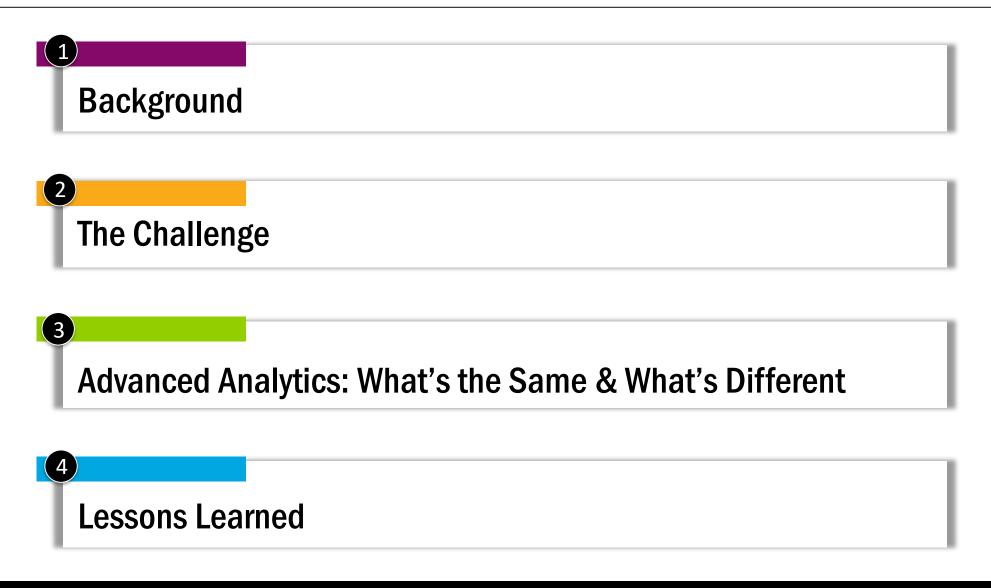
Model Governance for Advanced Analytics:

What's Different & What Have We Learned?

Andy Wunsch, FSA, CERA, MAAA ERM Symposium – May 2-3, 2019



Agenda





Background

Data and Analytics at Allstate



History and Background

Allstate has a long history of creating value through data & analytics.

In 1939, we became the first insurer to tailor auto rates by age, mileage and car usage – key data elements used in pricing today and the first use of analytic capabilities at Allstate.

Today, it's being used broadly across the company.

External trends such as big data, artificial intelligence and proactive personalization present new opportunities to accelerate Allstate's transformation.

D³: Data, Discovery & Decision Science was formed in 2016.

In 2016, Allstate's data strategy and analytics departments merged to form D³ – a vibrant, collaborative organization that's leading Allstate's data & analytics transformation.





D³: Data, Discovery & Decision Science

Who We Are



330+ data and analytics experts



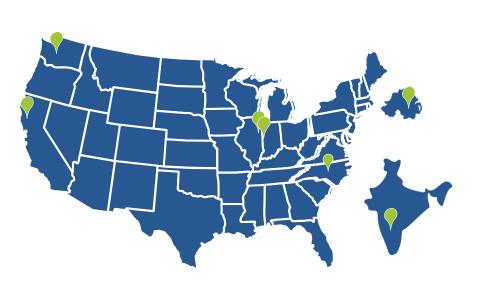
Managing and governing data



Developing analytics solutions



Delivering solutions through technology

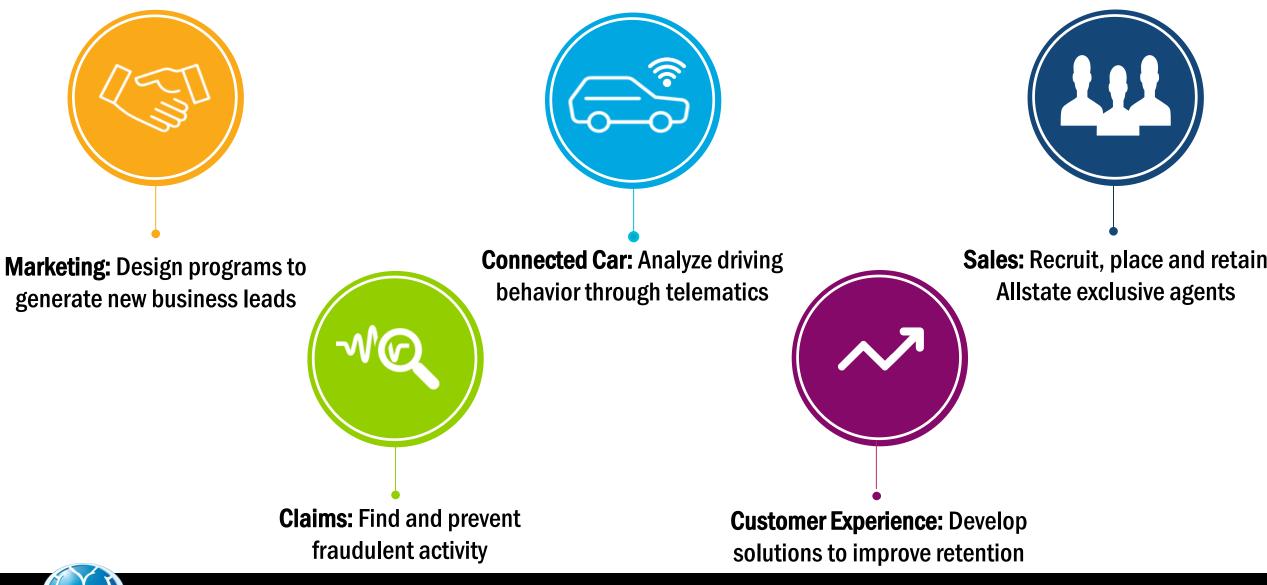


Where We Work

We have experts across seven locations: Bangalore - Belfast – Charlotte - Chicago Northbrook - Seattle - Silicon Valley



How D³ Supports Allstate with Data & Analytics



The Challenge

Model Risk with Advanced Analytics



Meeting the Challenge

Our model validation framework aims to:

- 1. Ensure effective <u>model risk management</u>, living into the enterprise program
- 2. Help create the most <u>useful analytic insights</u> possible



- Various practices grew within modeling silos
- Fast-paced environment with pressure to show value
- Inconsistent demand for governance, user assumption of quality models

APPROACH:

- Take the best, add the rest
- Simplicity & Transparency
- Mutual value-add

BUILD:

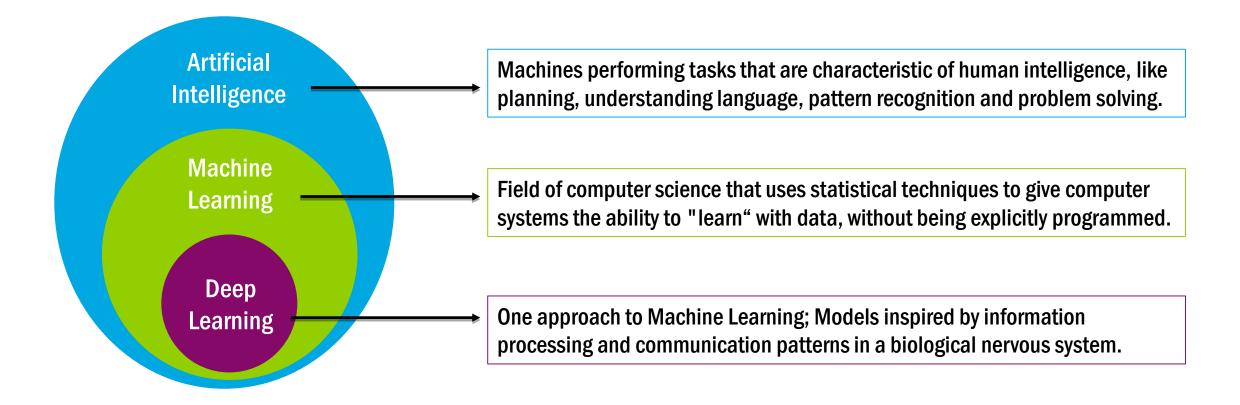
- Gain alignment
- Standards & measurement
- Resourcing
- Pilot and Evolve



- All models compliant with enterprise policy
- Validation a normal part of model development and maintenance
- Transparency and awareness to residual risk



Some Working Terminology



"AI" tools automate business processes (Robotics) and/or make decisions based on data (Machine Learning)



Advanced Analytics

What's the Same & What's Different



What's the Same & What's Different

<u>The overall objective is the same</u>: We are trying to manage model risk to an acceptable level, while producing the most useful analytics for business decision-making.

		SAME	DIFFERENT
	Data & Inputs	Data structure	Data (un)structureData vs. assumptions
~@	Methodology	 Use quantification algo Appropriate for use case 	
Q	Mechanics	Coded formulas & logic	 Open source packages Calculation transparency
	Output & Reporting	Uncertain results transTesting & vetting	ParencyHoldout data & overfittingTolerance for precision
\bigcirc	Operation	Access, backup, chang	• Owner handoff (org-specific)
<u>31</u>	Implementation & Improvement	Benchmark & perform	• Performance over time



Lessons Learned

What Worked / Challenges & Adjustments



What Worked

Build Alignment

- Risk Management preparation
- Regular leader engagement
- Find champions & leverage subject expertise

Seize Opportunity

- Part-time staffing over full-time commitment
- Personal development via rotation
- Principle-based, leverage existing practices

Unite the Purpose

- Bottom-up Listening: Best practices, pain points
- Show the Value
 - Minimize audit pain, better models
 - E.g., Remove bias, provide templates

Help Proactively

- Standards to ease documentation/compliance
- Allow time to remedy findings before model release
- Transparency



Challenges and Adjustments

What Seems Simple, Often is Not

- Imperfect model landscape information
- Connect data source & model user
- Terminology & taxonomy

Synergize Feedback

- Peer review late in development led to rework
- Feedback from reviewers, modelers, data, etc.
- Consolidate, remove redundancy
- Timely review findings communication, with credit for remediation

Balance Need with Practicality

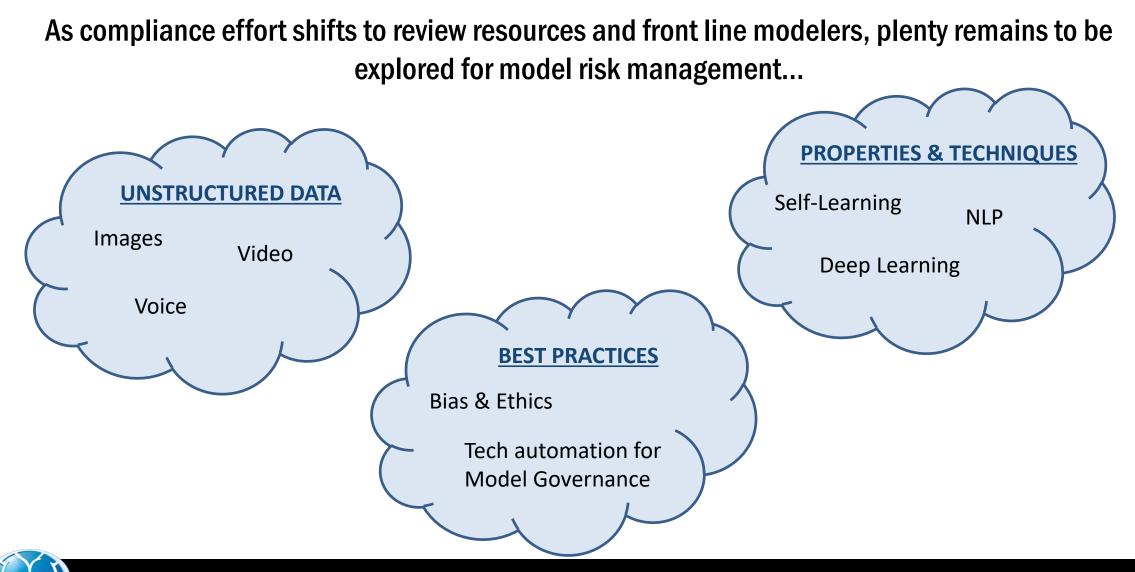
- Too much leeway what's the process, steps
- Inconsistent governance/control maturity

Accountability

• When to take off training wheels



What's on the Horizon?



Key Takeaways

1 The overall model risk management objective for advanced analytics is no different, but the "how" poses interesting challenges.

2 Build alignment on all levels, connect yourself and others.

3 Be transparent and empathetic where you cannot compromise.

4 Embrace the culture: take advantage of opportunities to learn and improve.

