



# Statistical Forecasting of Traffic-Related Pedestrian Fatalities in the United States

Jeff Pascua, B.Eng



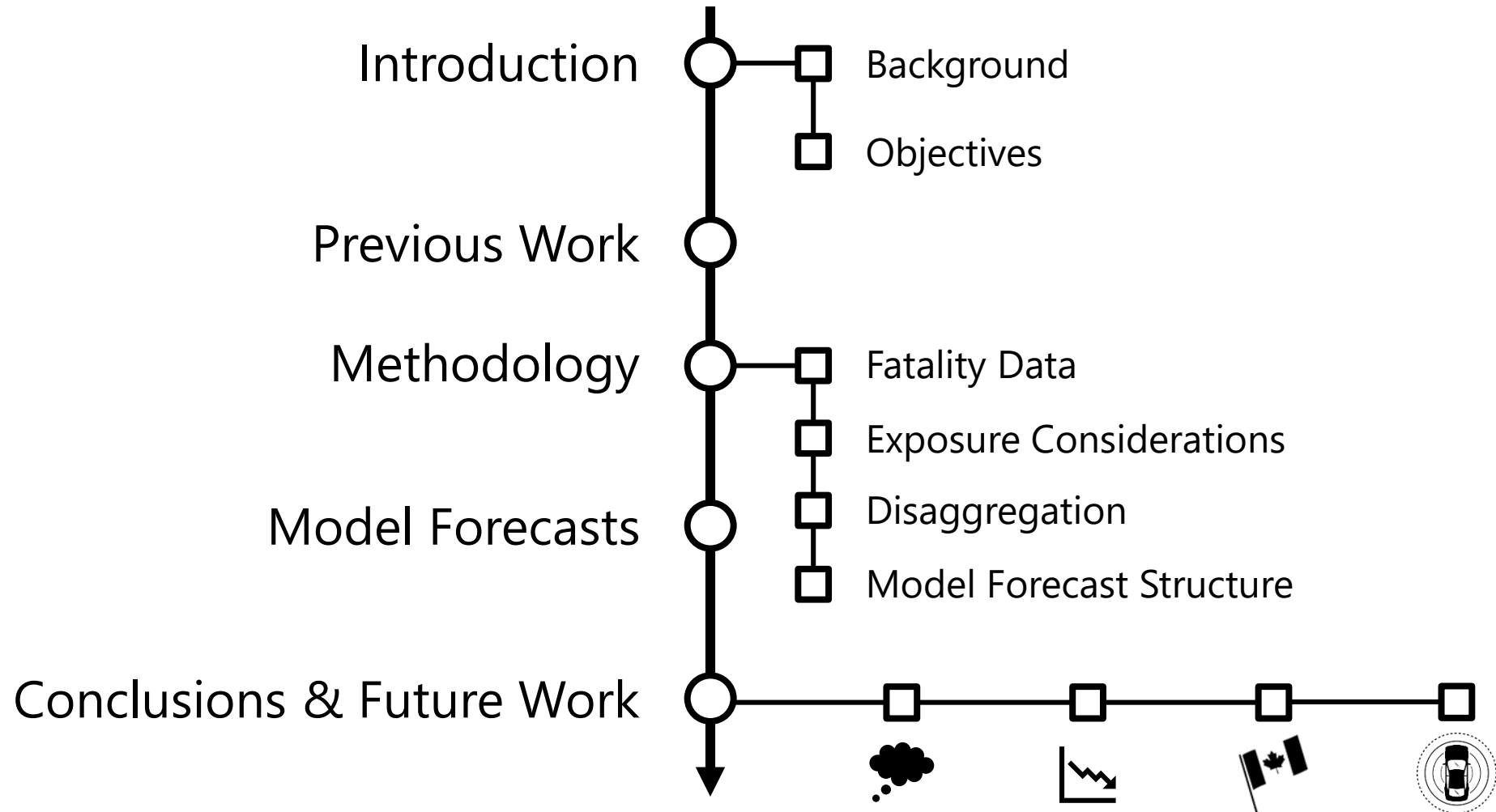
**Presentation prepared for:**

*Pedestrian Safety Session of the 2018 CARSP Conference, Victoria, B.C.*

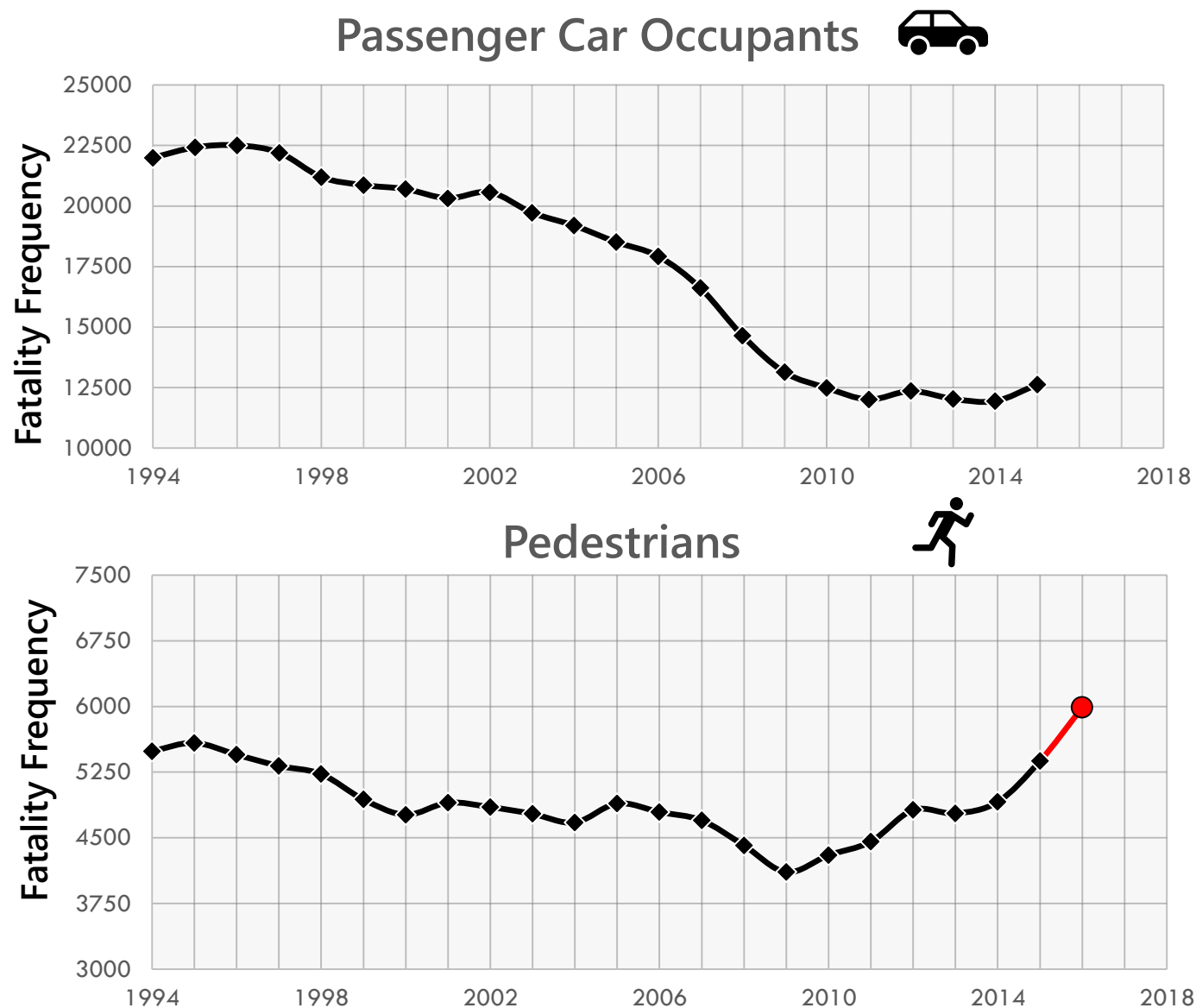
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Sacha Dubois, MPH



# Overview



Pedestrians  
are the most  
vulnerable of  
all road users.



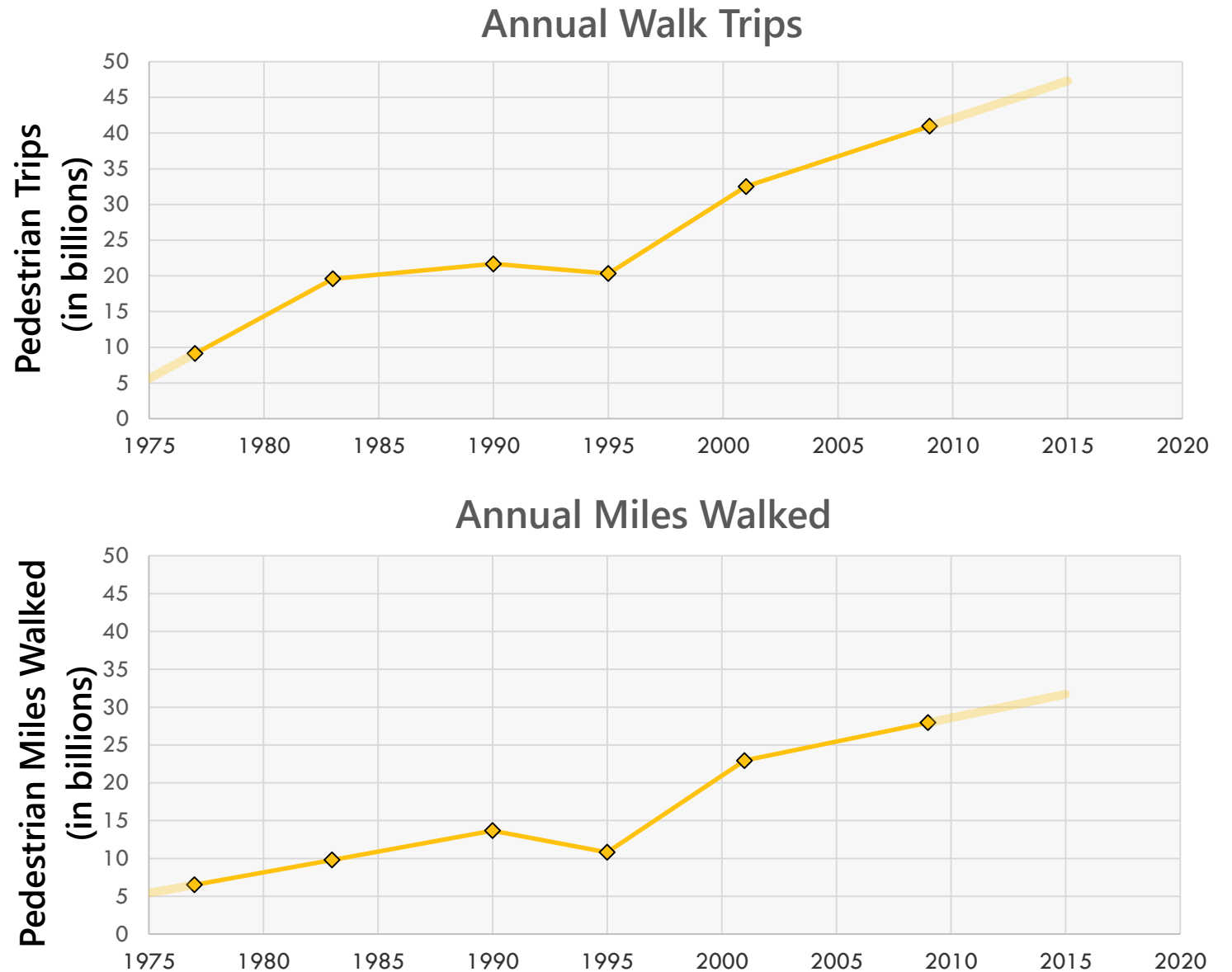
Source: NHTSA Fatality Analysis Reporting System (FARS) [1]

Figure 1: Annual U.S. Fatalities by Person Type (1994-2015).

Pedestrian activity appears to be on the rise.

~ 20 billion walk trips in 1983.

~ 40 billion walk trips in 2009.



Source: U.S. DOT FHWA NHTS [2]

Figure 2: Annual U.S. pedestrian travel trends (1977-2009) with linear interpolations and extrapolations.




What will  
pedestrian  
safety look like  
in the future?



## FHWA's *Strategic Agenda for Pedestrian and Bicycle Transportation* [3]:

### 1. Targets to increase AT mode share:

 **30%**  
2025

*"Increase the percentage of short trips represented by bicycle and walking from 20.1% (2009) to 30%..."*



What will  
pedestrian  
safety look like  
in the future?



FHWA's *Strategic Agenda for  
Pedestrian and Bicycle Transportation* [3]:

## 2. AT injury reduction targets:

- a) *"Achieve an 80  
percent reduction in  
pedestrian and bicycle  
fatalities and serious  
injuries in 15 years..."*

↓ 80%  
2031



What will  
pedestrian  
safety look like  
in the future?

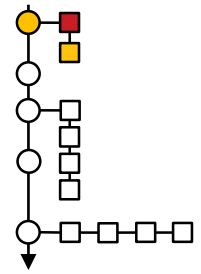


## FHWA's *Strategic Agenda for Pedestrian and Bicycle Transportation* [3]:

### 2. AT injury reduction targets:

b) "...**zero** pedestrian and bicycle fatalities and serious injuries in the next 20 to 30 years."

↓ 100%  
~ 2036 -  
2046



# Research Objectives

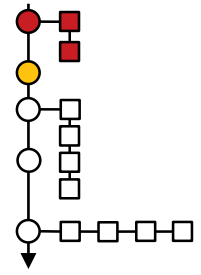
1

To quantitatively assess long-term pedestrian safety on a national scale.

2

To identify at-risk pedestrian cohorts that are more susceptible to traffic-related fatality.



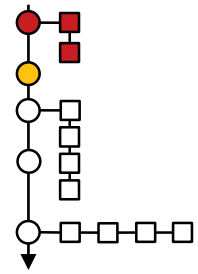


# Previous Work

## Current State of Research

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- Few studies have exclusively forecasted safety of **non-motorized transportation modes**
- Majority of pedestrian safety literature is **cross-sectional** [4]
- Previous studies utilize **macro-level predictor variables** [5,6]
- **VMT** is **changing** among American **millennials** and **baby-boomers** [7, 8]



# Previous Work

## Setting Road Safety Targets

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Three general approaches to establishing road safety targets [9]:

a) Aspirational

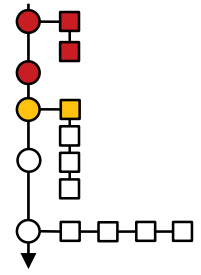
- relatively arbitrary
- limited numerical justification
- “top-down”

b) Model-Based

- data-driven, reliant on assumptions
- model structure dictates trend
- “baseline forecasts”

c) Evidence-Based

- quantitatively-based targets
- accounting for recent and future trends
- “bottom-up”



# Methodology

## Fatality Data

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### 🚶 NHTSA FARS

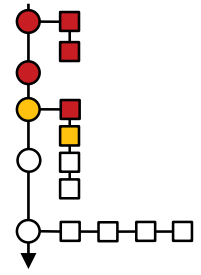
🚶 Fatality *Analysis* Reporting System (1975 - present)

🚶 census of all reported vehicle-related crashes that:

🚶 are on publicly-available roadways.

🚶 resulted in death of at least one motorist or non-motorist

🚶 victim pronounced fatally injured within 30 days of crash.



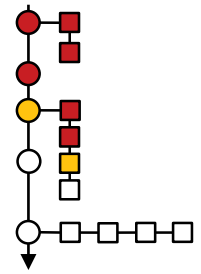
# Methodology

## Exposure Considerations

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### 🚶 FHWA NHTS

- 🚶 National Household Travel Survey (1969 - present)
- 🚶 sample-based inventory of American travel
  - 🚶 demographics, trip metrics, etc.
  - 🚶 representative weights for national estimates.

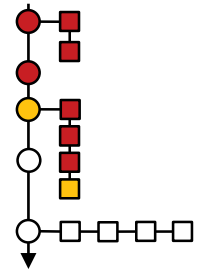


# Methodology

## Disaggregation

- 🚶 classify fatality and travel data
- 🚶 12 age-sex categories
- 🚶 model forecasts for cohorts marked with ★ are shown in the next section.

| Sex       |         |   |         |
|-----------|---------|---|---------|
| Age Group | Male    |   | Female  |
|           | 5 - 15  | ★ | 5 - 15  |
|           | 16 - 19 |   | 16 - 19 |
|           | 20 - 34 |   | 20 - 34 |
|           | 35 - 54 |   | 35 - 54 |
|           | 55 - 64 | ★ | 55 - 64 |
|           | 65+     | ★ | 65+     |



# Methodology

## Model Forecast Structure

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### 🚶 SPSS CURVEFIT

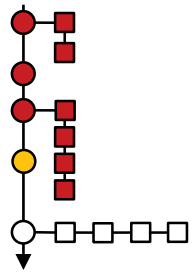
🚶 11 regression models including (but not limited to):

🚶 Polynomials\*

🚶 Logistic

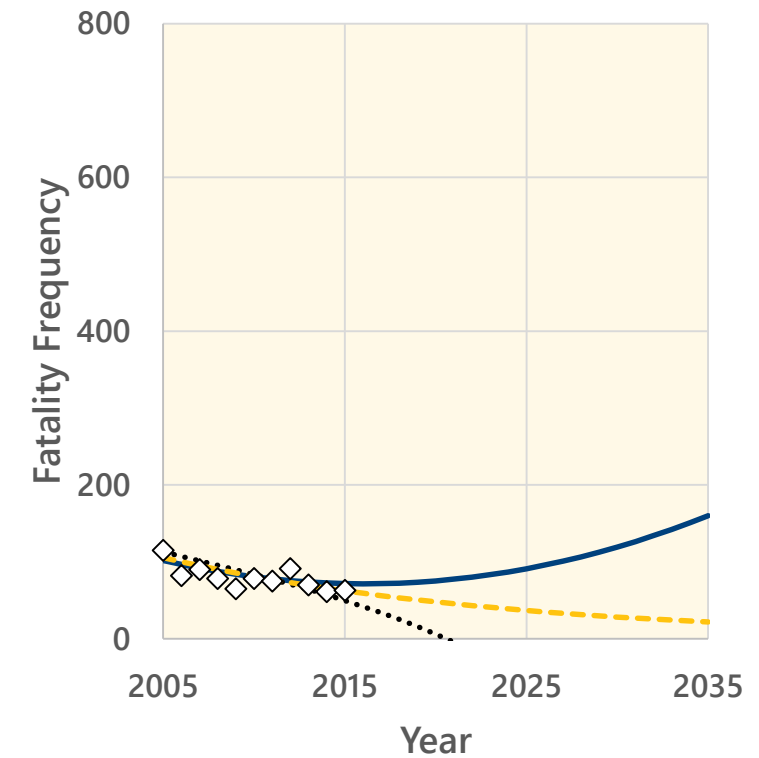
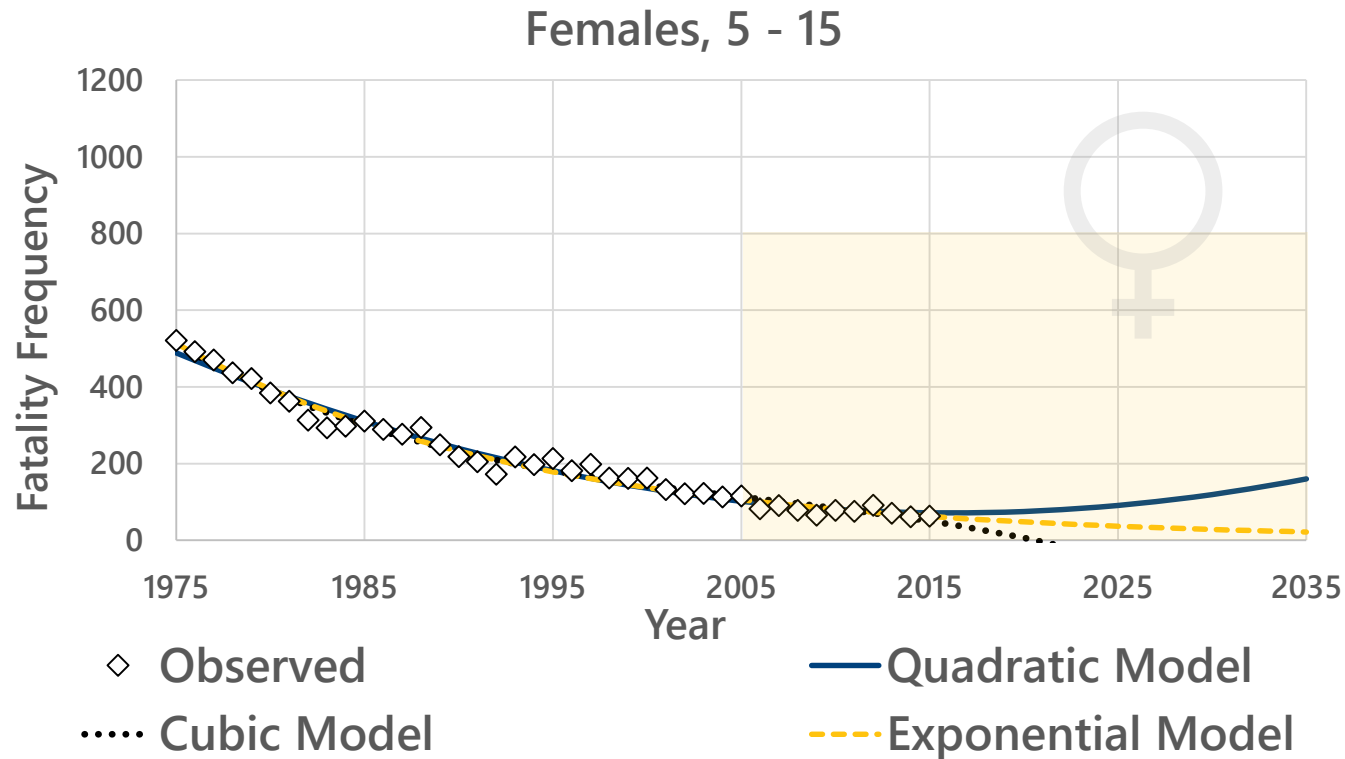
🚶 Exponential / Logarithmic

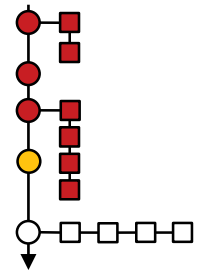
🚶 models chosen based on AIC & appropriateness



# Model Forecasts

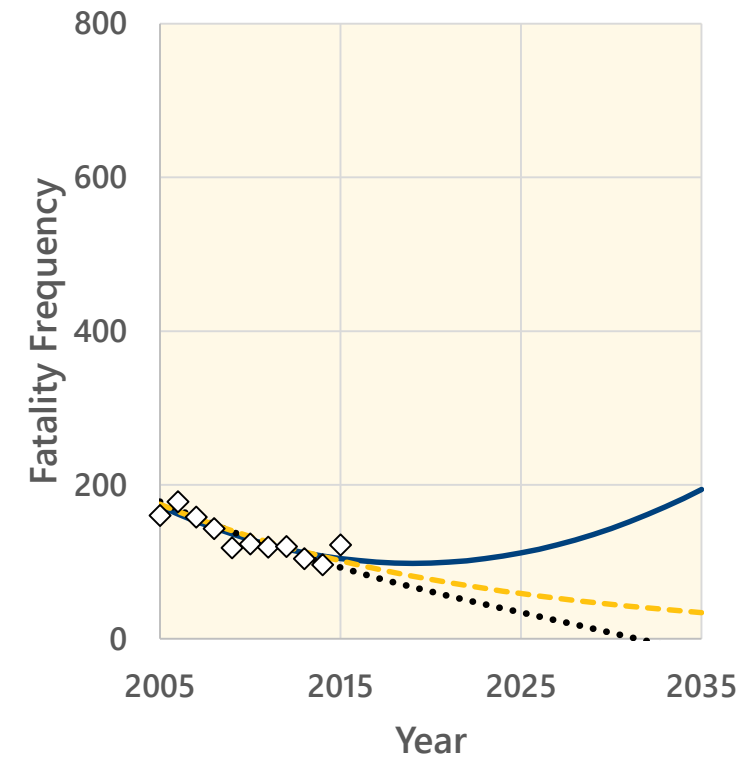
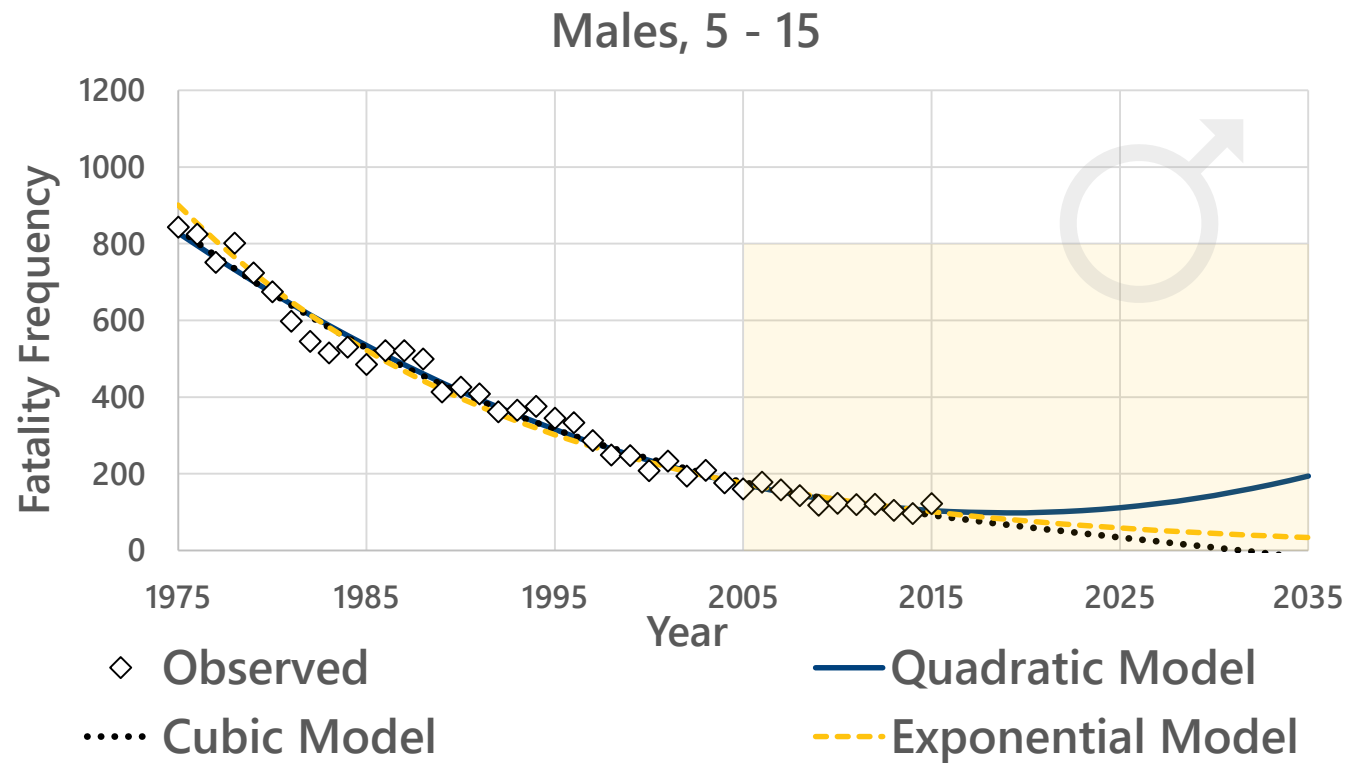
Females, Aged 5 - 15



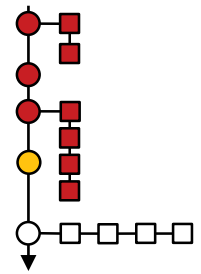


# Model Forecasts

Males, Aged 5 - 15

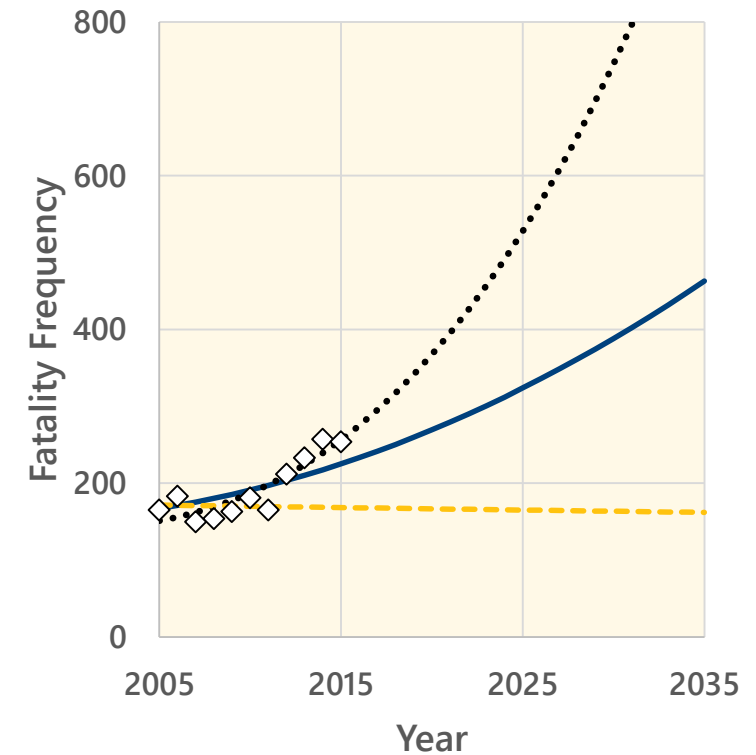
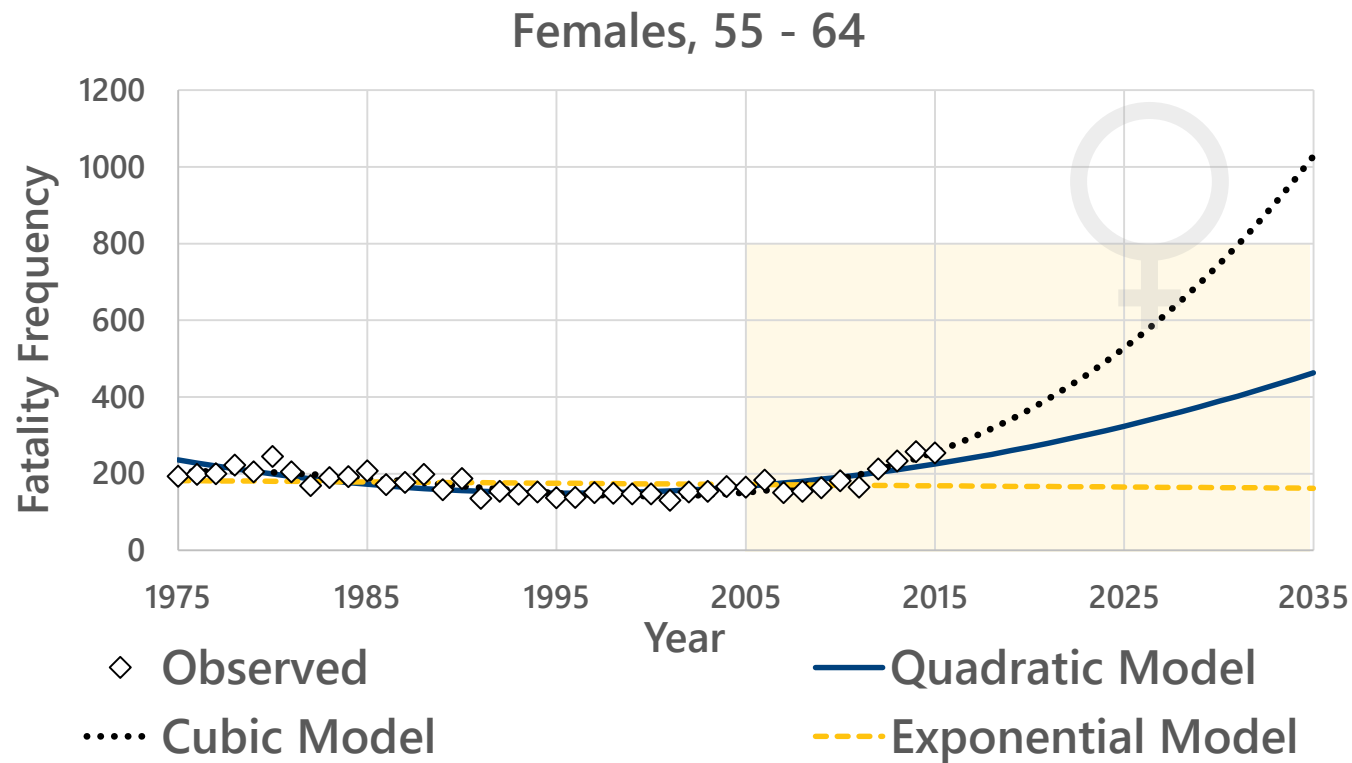


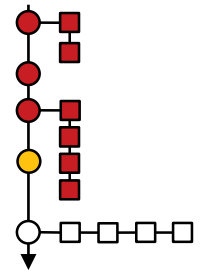




# Model Forecasts

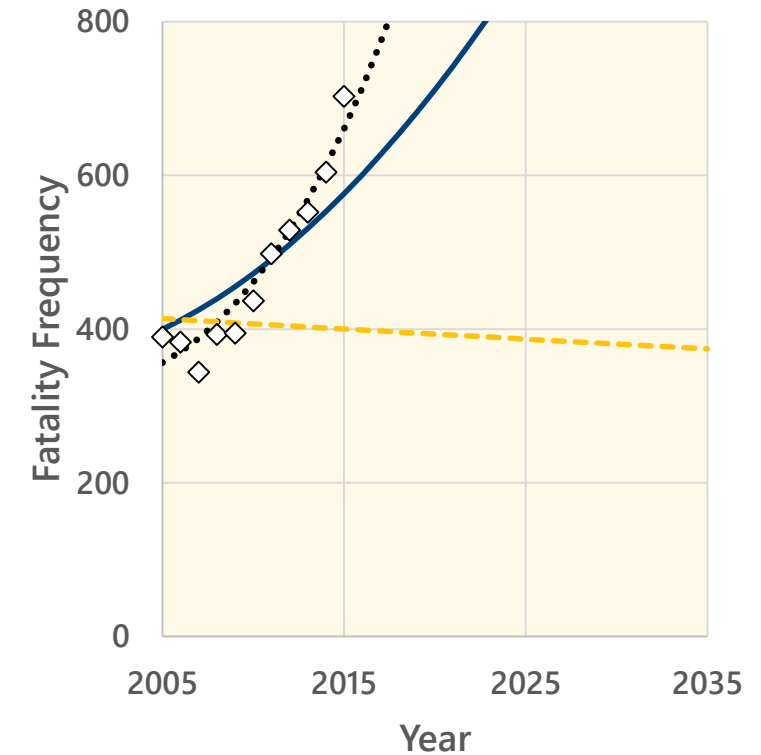
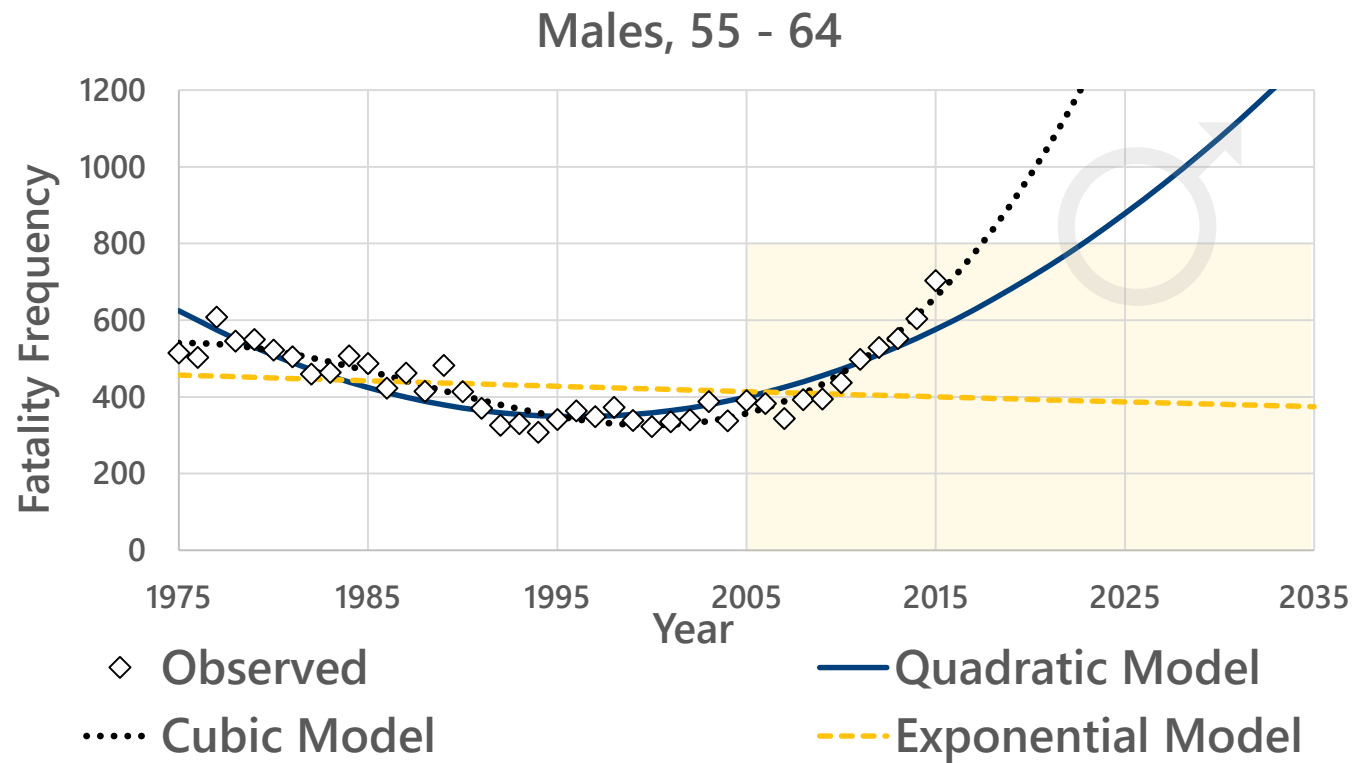
## Females, Aged 55 - 64

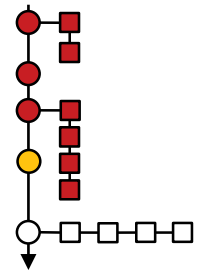




# Model Forecasts

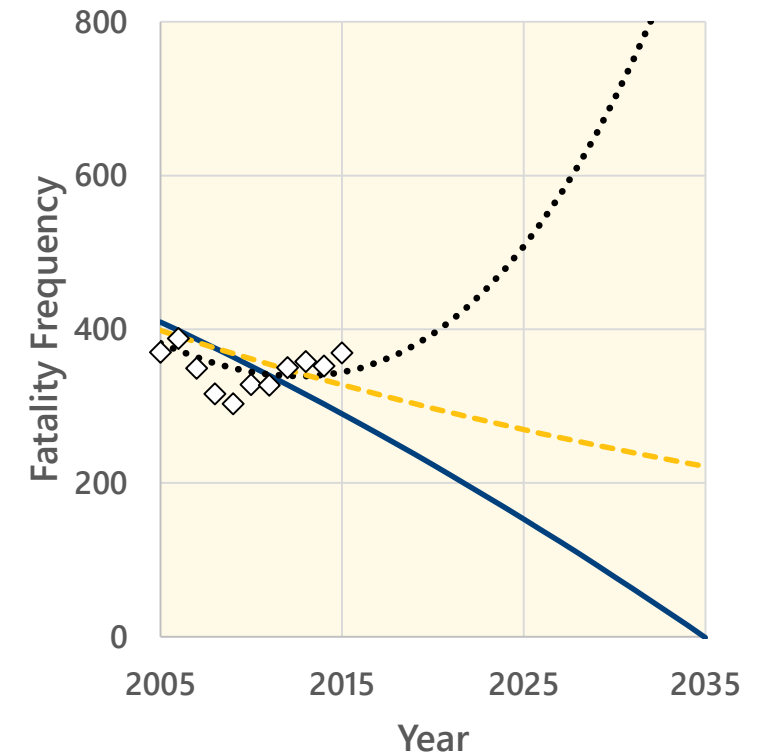
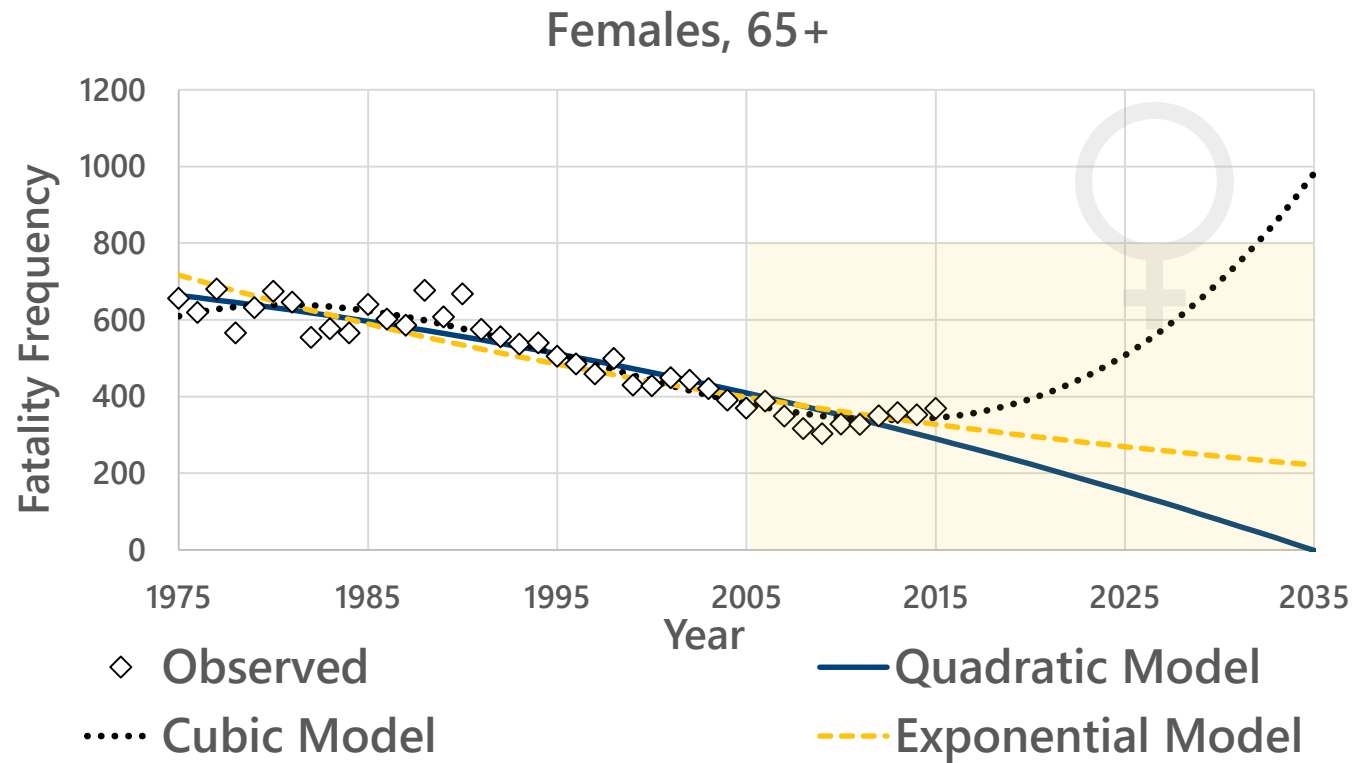
Males, Aged 55 - 64

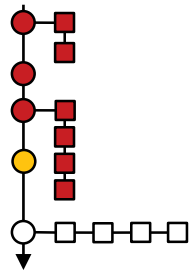




# Model Forecasts

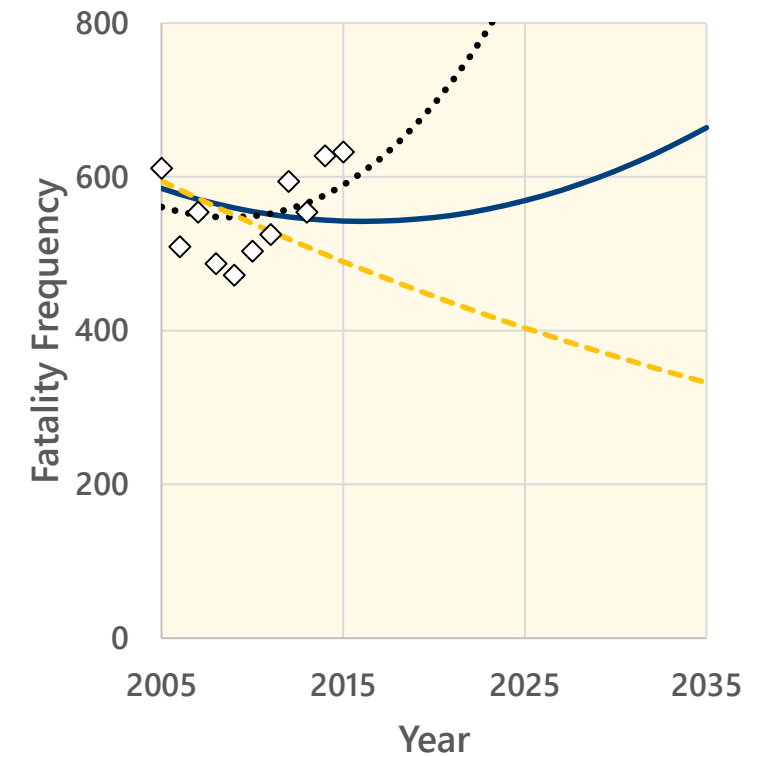
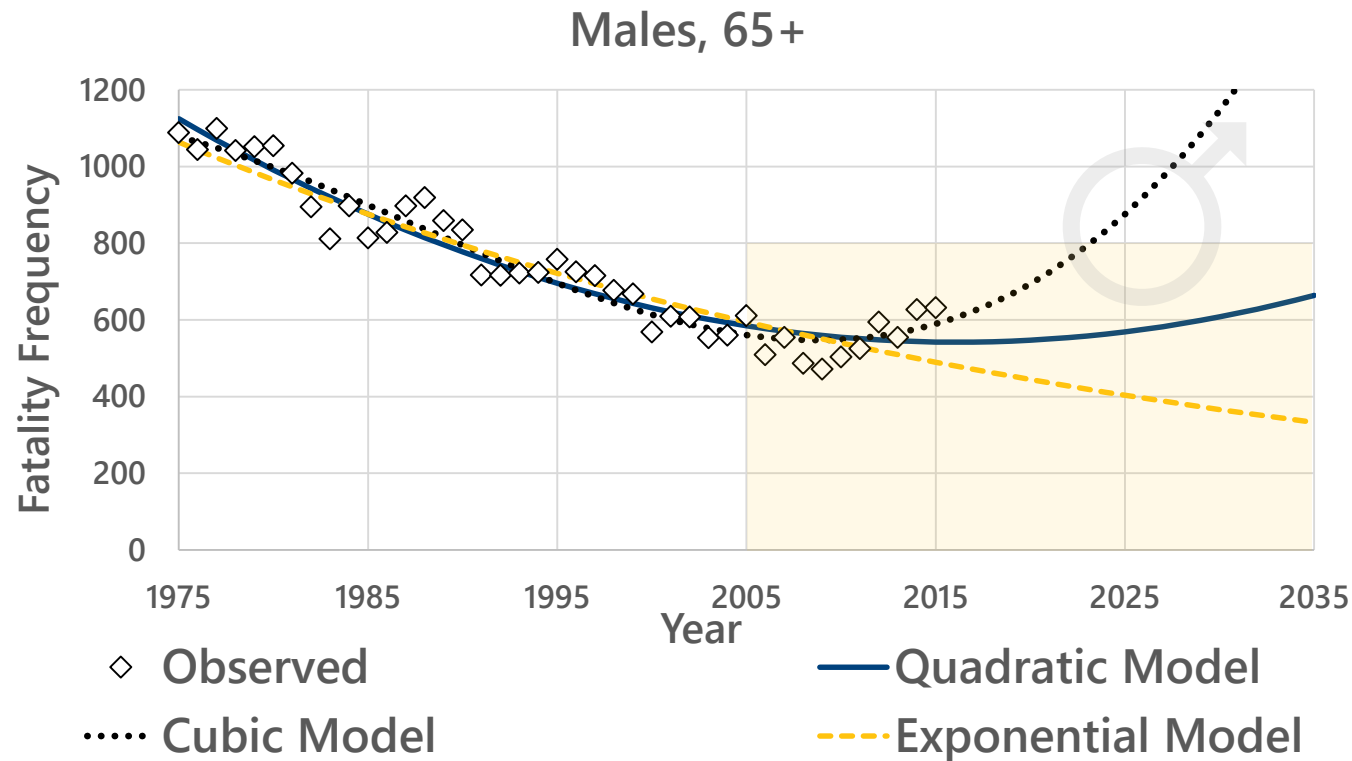
Females, 65+

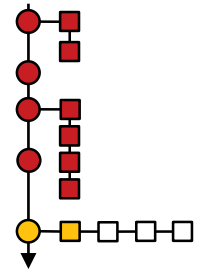




# Model Forecasts

Males, 65+



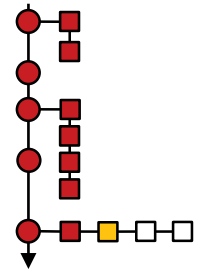


# Conclusions

## Key Findings from Forecasts



- Child pedestrian injuries (age 5 – 15) have been consistently declining since 1975.
- Pedestrian fatalities appear to be rising for those aged 55+:
- Generally speaking, males appear to be more at risk when compared to females.
- Polynomial-based forecasts can be misleading.



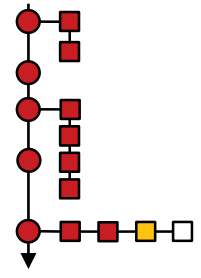
# Future Work

## Framework Refinement

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- using advanced models
- accounting for all severity levels
- rate-based metrics vs. absolute injury counts
- critical age?
- contribution of infrastructure
- quantify and incorporate safety effects of policy changes



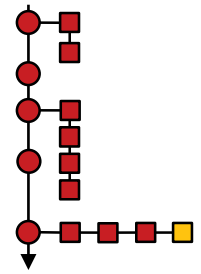
# Future Work

## Implementation in Canada



- Canada's RSS 2025 [10] does not specify any quantitative targets.
- Potential for framework implementation at sub-macroscopic geographical units:
  - Provincial / Territorial
  - Municipal
  - etc.





# Future Work

## The Influence of Emerging Technologies



### How a Self-Driving Uber Killed a Pedestrian in Arizona

By TROY GRIGGS and DAISUKE WAKABAYASHI UPDATED MARCH 21, 2018

[11]

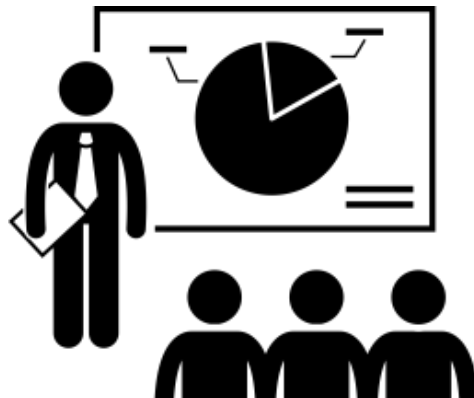




# The development of an effective traffic fatality forecast would be: *collaborative* *human-focused*



*data-driven*



To improve forecast reliability,  
the **quantity** and **quality** of data  
should be improved.

Counterintuitive to want  
more injury data!



The objective is to reduce injuries!

Improvements in capturing  
travel data can be made!



Leveraging technology to  
gather “big data”!

# References

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# Questions?

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Thank you! Merci!

