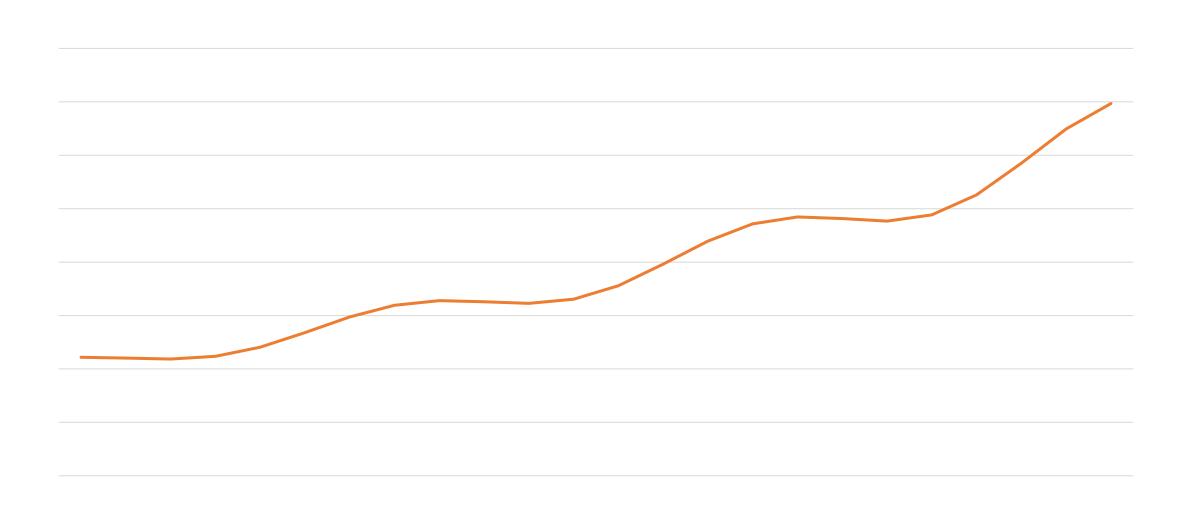
Modeling the Reserving Cycle Using Fourier Methods

IAA Colloquia 2021
James Ely, FCAS

Constant Inflation



Variable Inflation



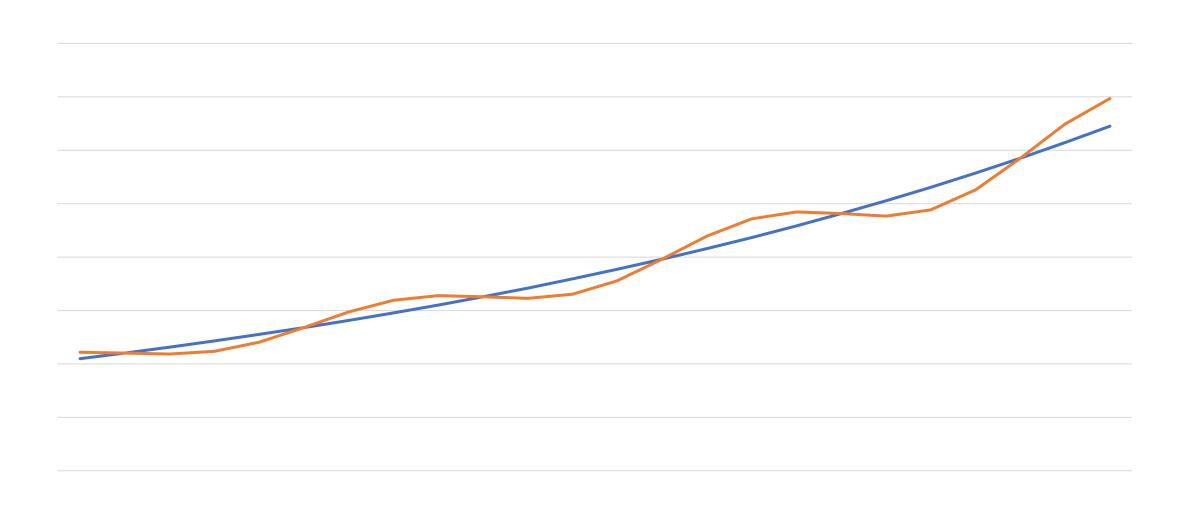
Inflation Risk in Reserving

• Variations in inflation cause diagonal effects in our triangles

 These variations in inflation and the associated diagonal effects constitute systemic risk in loss reserving. They are not diversifiable as they are often caused by external events.

Can we model and quantify this systemic risk?

Trend/Cycle



Modeling the Trend/Cycle

 In most actuarial analyses we focus on modeling the exponential trend

In this case our focus is on modeling the cycle

 I have chosen to use a Fourier Series because it is an appropriate method for modeling cyclical processes

Data Organization

 We want to model the diagonal effects on a two-dimensional data array by AY and age

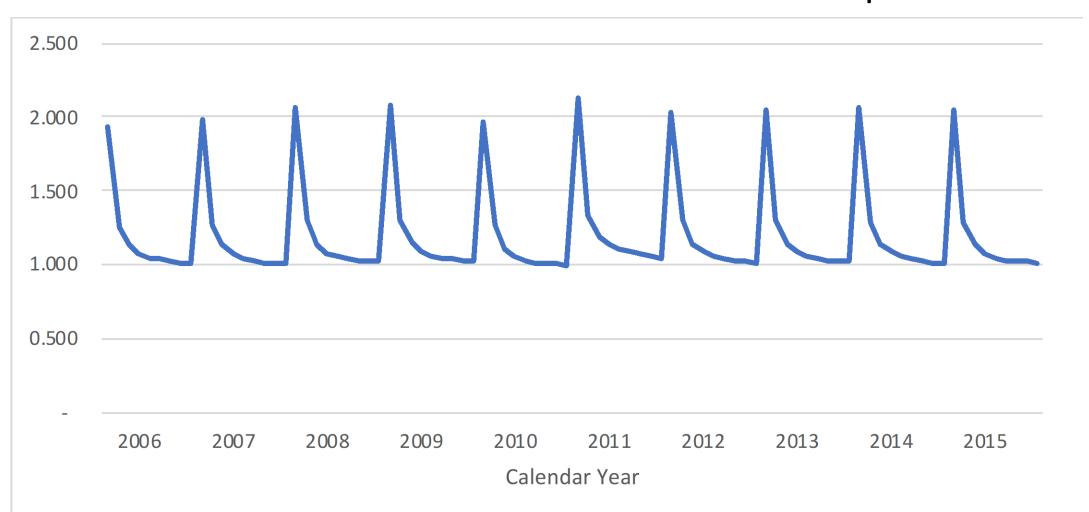
 The data must be reorganized as a periodic sequence so that we can compute the coefficients of a Fourier Series

• Start with a parallelogram of data and consider each CY diagonal as an individual cycle, i.e. sort it by CY and age

US Workers Compensation Paid Link Ratios

| | 12-24 | 24-36 | 36-48 | 48-60 | 60-72 | 72-84 | 84-96 | 96-108 | 108-120 |
|------|-------|-------|-------|-------|-------|-------|-------|--------|---------|
| AY | | | | | | | | | |
| 1997 | | | | | | | | | 1.011 |
| 1998 | | | | | | | | 1.018 | 1.010 |
| 1999 | | | | | | | 1.026 | 1.013 | 1.022 |
| 2000 | | | | | | 1.037 | 1.019 | 1.021 | 1.036 |
| 2001 | | | | | 1.048 | 1.025 | 1.033 | 1.034 | 1.002 |
| 2002 | | | | 1.082 | 1.044 | 1.043 | 1.042 | 1.005 | 1.052 |
| 2003 | | | 1.141 | 1.084 | 1.058 | 1.043 | 1.012 | 1.061 | 1.019 |
| 2004 | | 1.261 | 1.138 | 1.084 | 1.061 | 1.014 | 1.075 | 1.026 | 1.022 |
| 2005 | 1.931 | 1.274 | 1.136 | 1.092 | 1.026 | 1.087 | 1.029 | 1.027 | 1.016 |
| 2006 | 1.981 | 1.297 | 1.161 | 1.053 | 1.101 | 1.038 | 1.036 | 1.020 | 1.017 |
| 2007 | 2.056 | 1.307 | 1.113 | 1.135 | 1.058 | 1.044 | 1.029 | 1.022 | |
| 2008 | 2.072 | 1.267 | 1.198 | 1.088 | 1.058 | 1.040 | 1.026 | | |
| 2009 | 1.971 | 1.344 | 1.143 | 1.089 | 1.058 | 1.033 | | | |
| 2010 | 2.122 | 1.299 | 1.142 | 1.089 | 1.046 | | | | |
| 2011 | 2.030 | 1.297 | 1.148 | 1.078 | | | | | |
| 2012 | 2.049 | 1.289 | 1.134 | | | | | | |
| 2013 | 2.068 | 1.284 | | | | | | | |
| 2014 | 2.041 | | | | | | | | |

US Workers Compensation Paid Link Ratios as a Periodic Sequence



A Note on Data Type

In the previous slides I chose to use AY link-ratios as the input data. Link ratios mod-out exposure changes and the average trend.

Partial severities and partial pure premiums will also work, because they also mod-out exposure changes. But an additional step is required to find the least-squares trend.

Steps in Fourier Analysis

1. Calculate Fourier Coefficients a_n and b_n

2. Separate Signal from Noise

3. Calculate Variance Using Parseval's Equation

Separating Signal from Noise

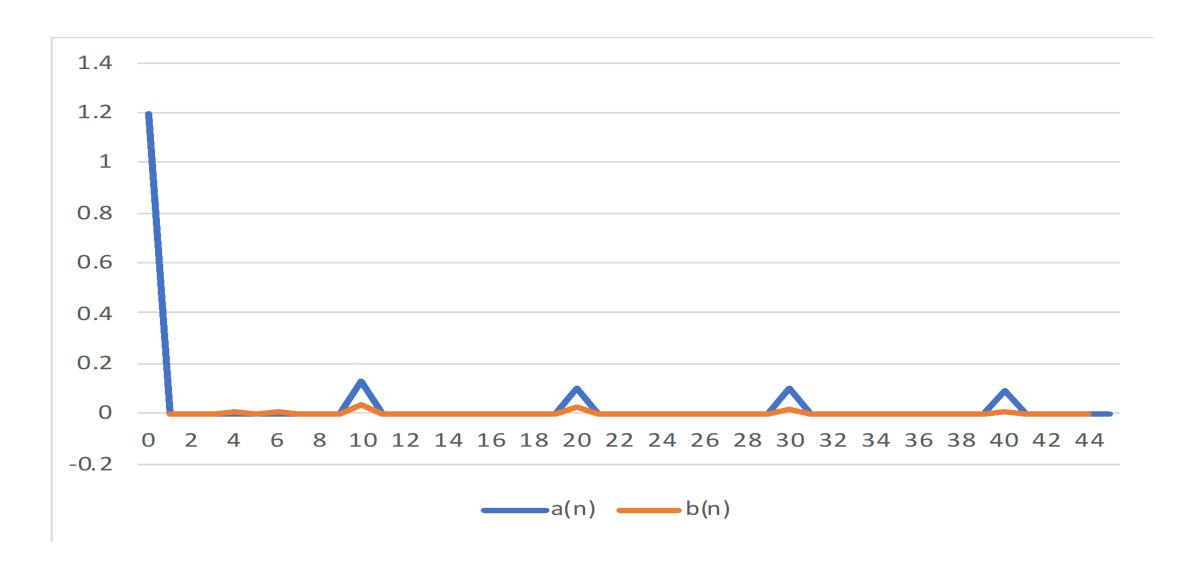
(by Analogy to Color Vision)

Find something green
 Look for a particular frequency or a narrow band of frequencies

What color is it?

Identify the frequencies that are the most significant

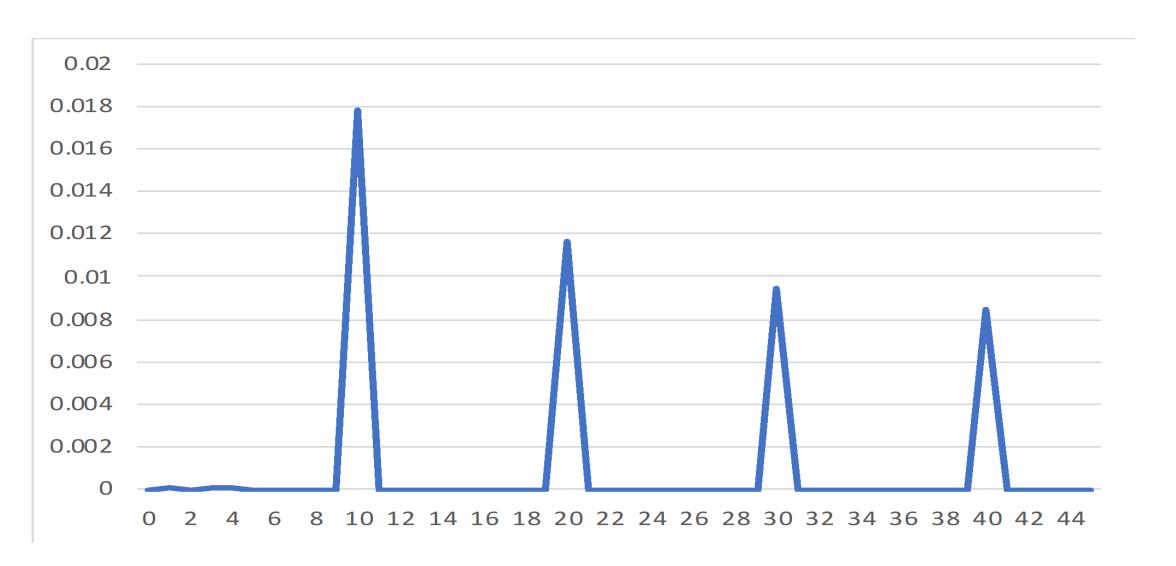
Fourier Coefficients for WC Link-Ratios



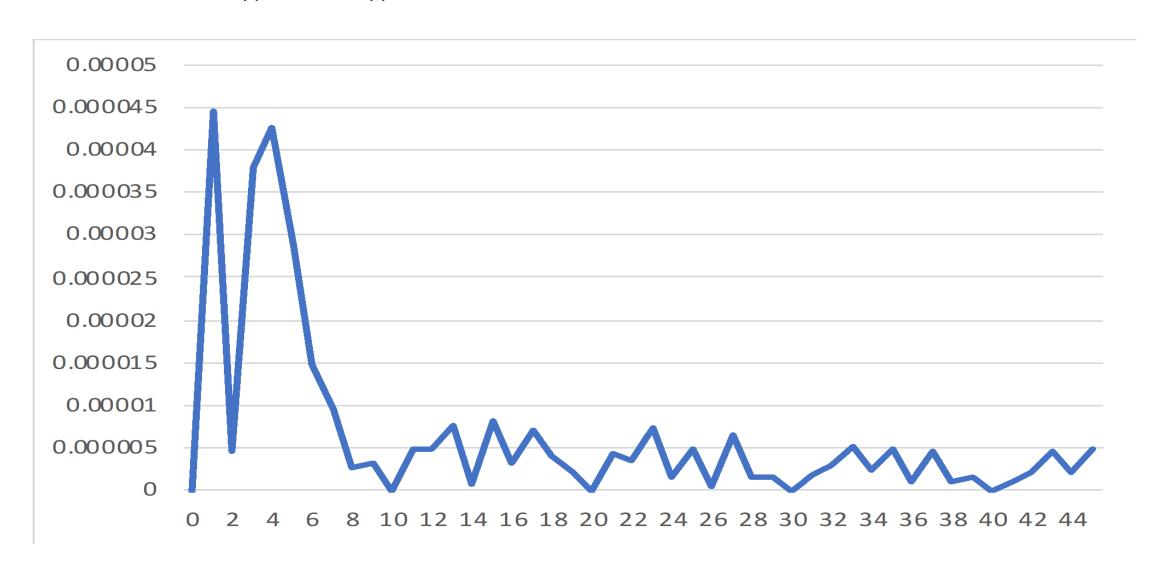
Modifications to Aid Interpretation

- Omit the constant term a₀
- Square the coefficients
- Add $a_n^2 + b_n^2$ term-by-term

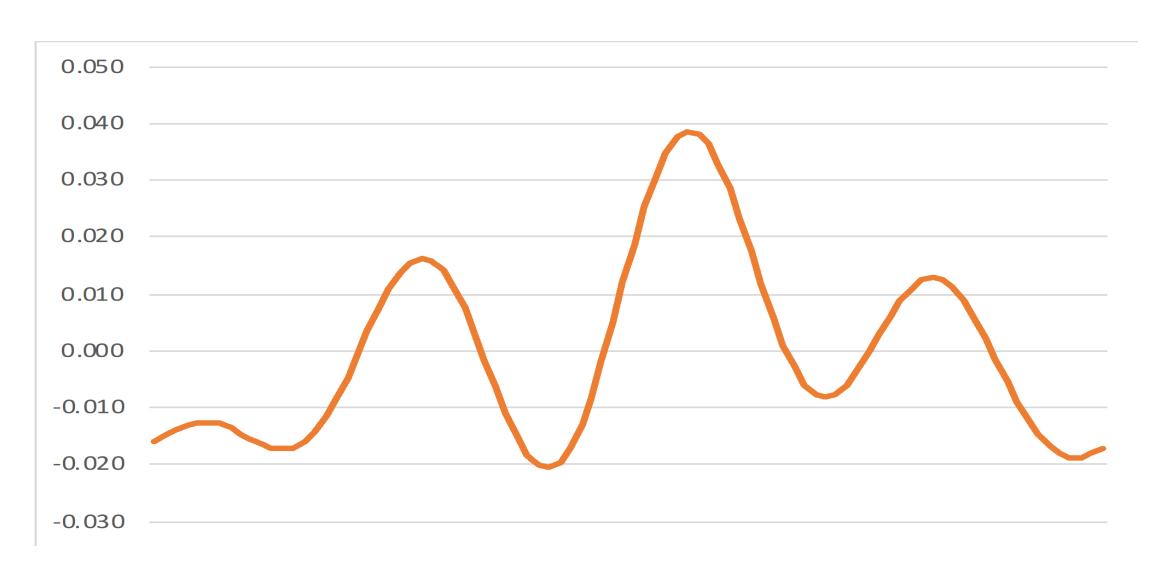
$(a_n^2 + b_n^2)$ for WC Link Ratios



$(a_n^2 + b_n^2)$ for Noise Frequencies



Modeled Reserving Cycle – 4 Terms



Parseval's Equation

Total Sum of Squares =
$$\sum_{n>0} (a_n^2 + b_n^2)$$

Systemic Reserve Risk

$$\frac{SS \ Cycle}{SS \ Noise} = .94$$

For Nationwide WC, the cyclical component is the dominant component of noise, as we should expect. For individual companies, the significance of the cyclical component depends on the size of the company, line of business, retained limits, and the time period chosen.

I use the Fourier Series as a Visualization of the Fourier Transform

The Discrete Fourier Transform (DFT) interpolates data with a complex wave function. But working in the complex plane is difficult to visualize.

A Fourier Series interpolates data with a real wave function.

• From a Fourier Series to DFT is a variation of Euler's formula:

$$e^{ix} = \cos x + i \sin x$$

From the DFT to Fourier Series is a variation on the identities

$$\cos x = \frac{e^{ix} + e^{-ix}}{2}$$

$$\sin x = \frac{e^{ix} - e^{-ix}}{2}$$

Why Should We Learn to Use Transforms in Actuarial Science?

Because we already think this way sometimes:

Return Time = Wavelength