

# A Dual Version of Asset-Liability Risk Modeling

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# INTRODUCTION - RISK MODELING

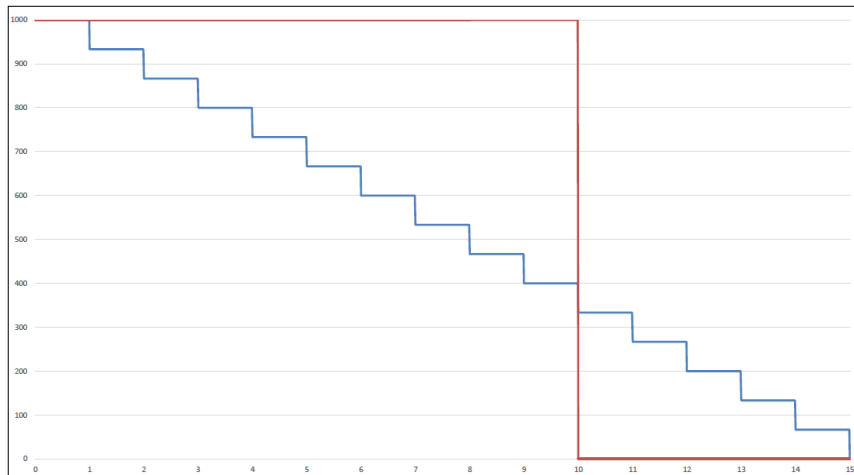
- Often, we model risk with the same models as for pricing, planning and forecasting
- In risk modeling we just assume extreme inputs, or look at the tails of random outcomes, or maybe even use statistical extreme value theory
- But we fine-tune pricing, planning and forecasting models to work well on normal inputs; can this foreclose good risk modeling in a holistic sense?
- Maybe risk needs radically different models; but somehow related to normal models, grounded in them, perhaps a formal duality?

# MODELING ASSET-LIABILITY INTEREST RATE RISK

- Traditionally we model known cash flows and take present values - a balance sheet view
  - Ignore future cash unless implied by balance sheet
  - Test future interest rates' effect on present values:
    - duration/convexity etc.
    - stochastic future interest rates
    - risk-neutral calibrations to market values
- A radically different model could start with going concern assumptions - an income view
  - Embrace future cash flow - on some normalized, on-going basis
  - Test future interest rates' effect on future spreads between asset earnings and liability requirements
- Strictly a work-in-progress: what tools would give a dual model to the balance sheet?

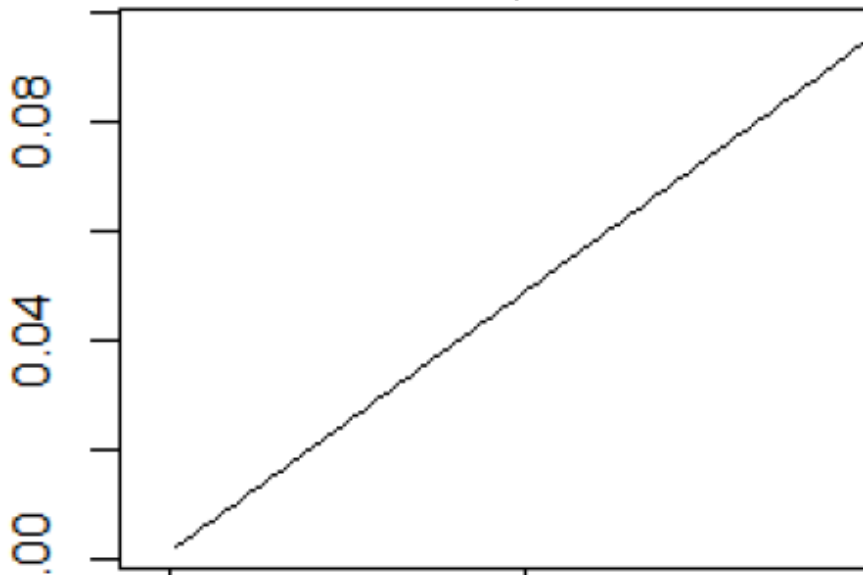
# A SIMPLE GOING CONCERN WITH A-L MISMATCH

Take in a steady stream of 10-year bullet liabilities and invest steadily in 15 year ladder asset maturities.



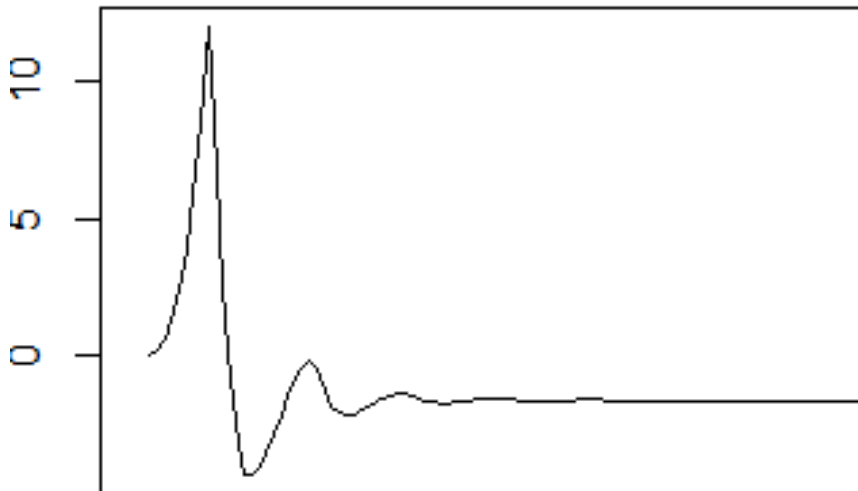
# A SIMPLE GOING CONCERN WITH A-L MISMATCH

Let interest rates increase steadily:



# A SIMPLE GOING CONCERN WITH A-L MISMATCH

Take in a steady stream of 10-year bullet liabilities and invest steadily in 15 year ladder asset maturities. The following spreads result if interest rates increase steadily:

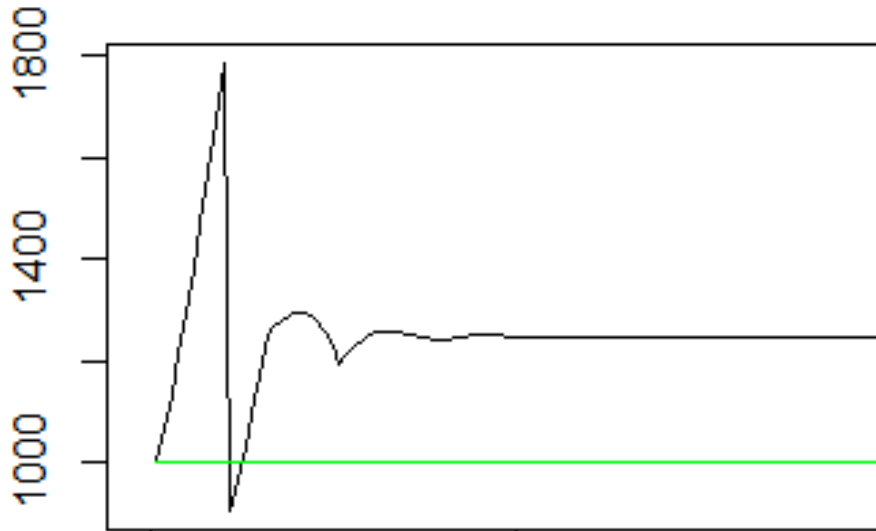


# Linear Inputs Gave Oscillating Output - What's Going On?

- In signal analysis – electronics or optics – this would be the clue to something called an "Edge Effect" or a "Gibbs' Phenomenon"
- Essentially, the linear inputs have encountered or involve some sort of underlying process that combines a jumble of hidden oscillating pieces
- The beginning (or ending) of the linear inputs splatters the underlying oscillations into the output piecemeal so we can see some of them
- Fourier analysis is the technical tool to explore this
- REALLY?? For ALM Work?
- Maybe there is a simpler explanation?

## Linear Input Gave Oscillating Output - Why?

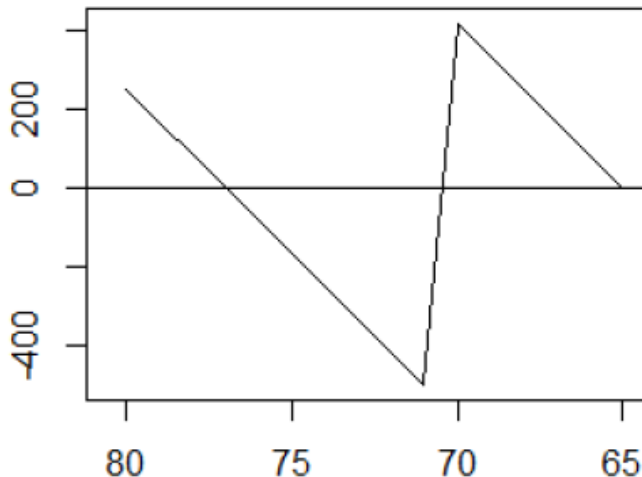
Maturity mismatch creates investment mismatch in going concern – early asset maturities need reinvesting





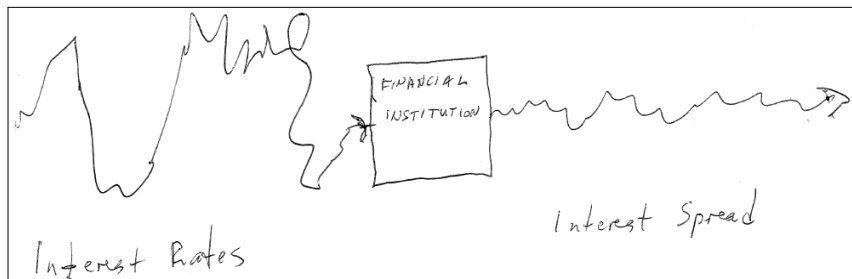
## Linear Input Gave Oscillating Output - Why?

And looking backwards even in steady state the net survivors still at each past rate oscillates, too – 12 and 9.5 year cycles observable



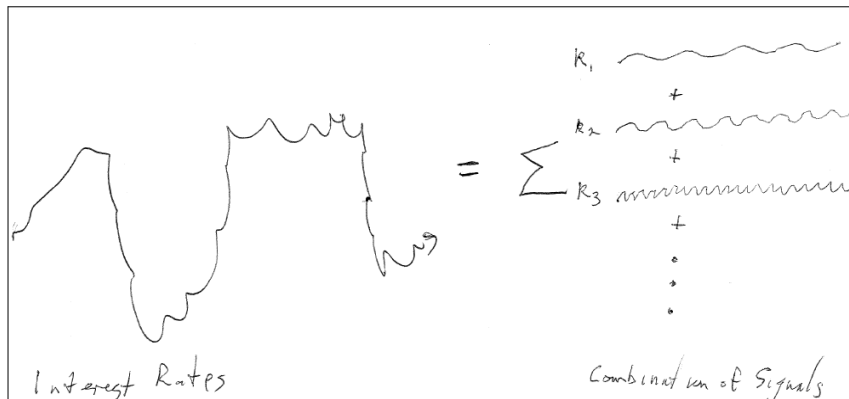
# OK, BUT THIS STILL CRIES OUT FOR FOURIER ANALYSIS

A financial institution is a receiver of a stream of interest rates that modulates them into an output stream of interest spreads (gain/loss)



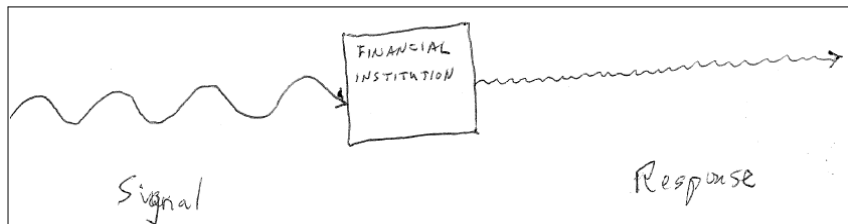
# THIS STILL CRIES OUT FOR FOURIER ANALYSIS

The interest rate stream consists of component signals



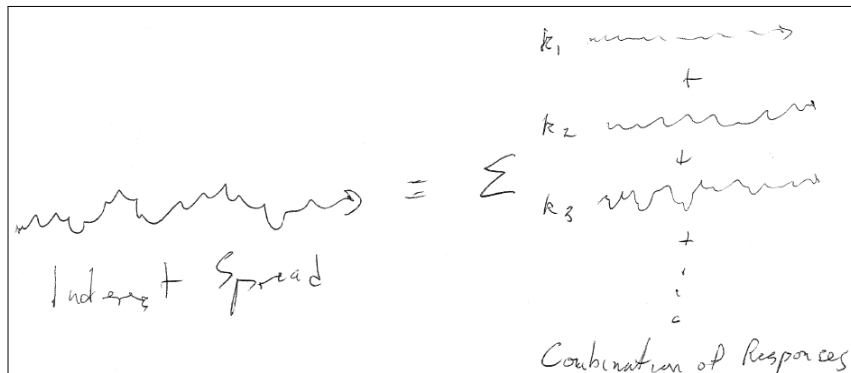
# THIS STILL CRIES OUT FOR FOURIER ANALYSIS

Suppose we know how the financial institution modulates each component of the input signal into an output response

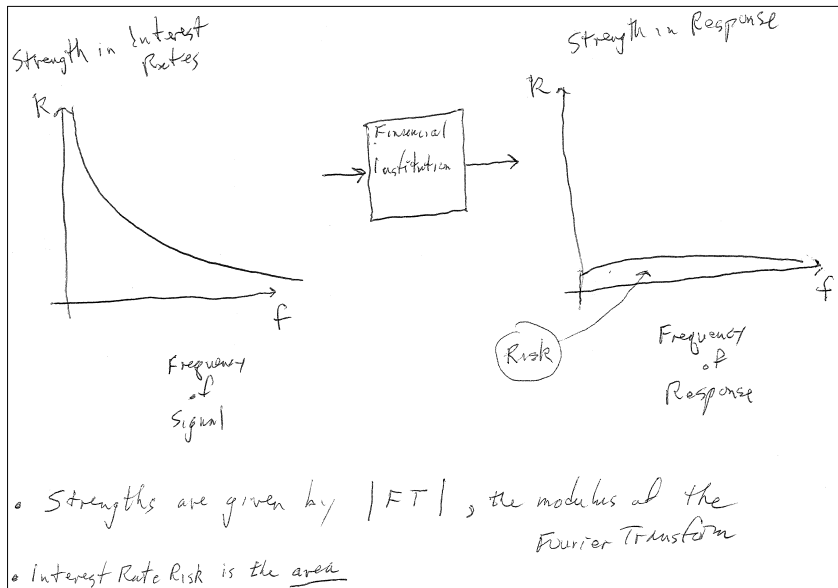


# THIS STILL CRIES OUT FOR FOURIER ANALYSIS

Then we can reconstruct the total response (the spread) to the original interest rate stream



# FOURIER ANALYSIS JUST CODIFIES THIS



# THIS IS THE DUAL VIEW OF INTEREST RATE RISK

- It looks at the institutional response to the entire spectrum of interest rate volatility
  - Dual to duration, etc. which puts most focus on the lowest frequency component(s) of the interest rate spectrum
- It looks at the going-concern interest rate spread (income statement)
  - Dual to the balance-sheet view of traditional immunization
  - Like the duality between position and momentum in physics
- Area under the spectrum is the proper risk measure
  - If random phases align against you the whole area contributes to your woe

# CAN'T GET THIS FROM YOUR NORMAL MODELS

(Or at least not directly from them)

## WHAT WE NEED IS

- A model of the external interest rate spectrum
  - As an abstract random phenomenon, not just past  $x$  years or a closed time series
  - FORECASTING DISTRACTS FROM RISK ANALYSIS!
- A model of the modulation process
  - Unique to each financial institution
  - Applicable to all possible external signals
- And, of course, the Fourier Analysis technique



# Fourier Transform

- Given a function  $r(t)$ , say the interest rate over time, you can write it as a sum of oscillating components

$$r(t) = \int_{-\infty}^{\infty} FT[r](f) e^{2\pi ift} df$$

where  $FT[r](f)$ , called the Fourier Transform of  $r(t)$  at  $f$ , determines the component of  $r(t)$  that oscillates with frequency  $f$ .

- The standard oscillation with frequency  $f$  is  $e^{2\pi ift}$ .
- Note,  $e^{2\pi ift}$  is a complex number at each time  $t$  that corkscrews around the complex unit circle as time passes.
- The frequency  $f$  determines how fast and in which direction it spins.

$$r(t) = \int_{-\infty}^{\infty} FT[r](f) e^{2\pi ift} df$$

- So  $FT[r](f)$  is a complex number
- Whose modulus  $|FT[r](f)|$  at each frequency  $f$  tells us how large  $e^{2\pi ift}$  looms inside  $r(t)$  for that  $f$
- Whose phase at each frequency  $f$  tells us how much the version of  $e^{2\pi ift}$  inside  $r(t)$  is rotated from its usual starting point (at  $t = 0$ ) for that  $f$ .
- With all these complex numbers spinning around, how can we get a real function  $r(t)$  back out of the formula?
- It just requires that  $FT[r](f)$  and  $FT[r](-f)$  be complex conjugates for each frequency  $f$ .

# Fourier Transform Properties

- There is a formula for  $FT [r] (f) = \int_{-\infty}^{\infty} r(t) e^{-2\pi ift} df$
- If  $a(t)$  and  $b(t)$  are two functions of  $t$ , and  $k$  and  $j$  are constants, then for each frequency  $f$  we have

$$FT [ka + jb] (f) = kFT [a] (f) + jFT [b] (f)$$

- If we define  $(a * b) (t) = \int_{-\infty}^{\infty} a(t - s) b(s) ds$  (the "convolution") then

$$FT [a * b] (f) = FT [a] (f) FT [b] (f)$$

- If we define  $\Delta(t) = 1$  for  $t \geq 0$  and  $= 0$  for  $t < 0$  then

$$FT [\Delta] (f) = \frac{1}{2\pi if} 1_{f \neq 0} + \frac{1}{2} \delta(f), \text{ for } \delta = \text{impulse at } 0$$

- Note:  $(\Delta * b) (t) = \int_{-\infty}^t b(s) ds = B(t)$ , etc. for any  $b, B$

# START WITH THE MODULATION PROCESS

Let  $r(s)$  = the interest rate at time  $s$

$\Delta_B(s)$  = new Liabilities taken on at time  $s$

(Assume  $\Delta_B(s)$  takes a simple going-concern form)

$B(s, t)$  = Liabilities matured out of  $r(s)$  by time  $t$

$b(s, t) = \frac{\partial}{\partial t} B(s, t)$  the rate of Liabilities maturing out of  $r(s)$  at time  $t$

$\Delta(s) = 1$  for  $s \geq 0$  and  $= 0$  for  $s < 0$

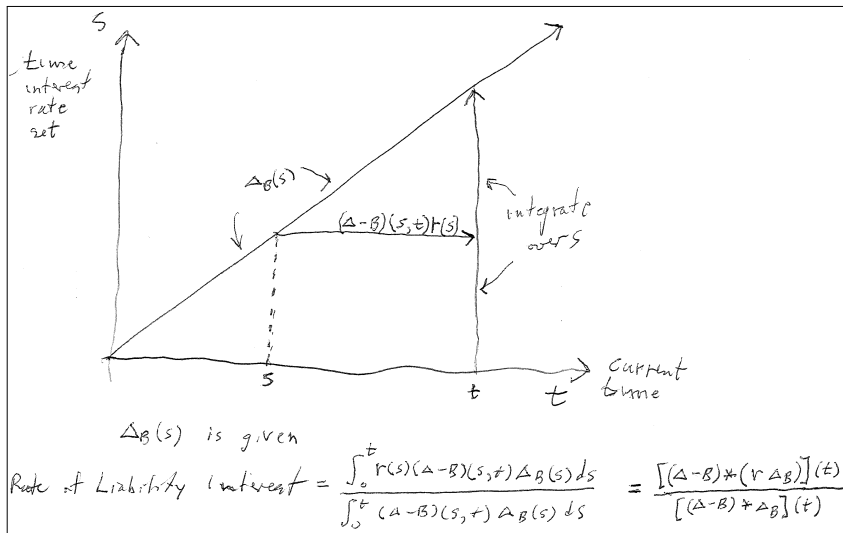
$(\Delta - B)(s, t)$  = Liabilities still owed  $r(s)$  at time  $t$  = survival function of  $B(s, t)$  viewed as a cdf.

This gives a crude going-concern model of interest requirements on the Liabilities

$$\text{Rate of interest required (at time } t) = \frac{[(\Delta - B) * (r \Delta_B)](t)}{[(\Delta - B) * \Delta_B](t)}$$

# START WITH THE MODULATION PROCESS

## Interest requirements on the Liabilities (going concern)



# START WITH THE MODULATION PROCESS

That's a generalization of the usual definition of convolution and it won't be commutative

## A Few Other Things We Need

$a^{*k} = a * a * \dots * a$   $k$  times makes sense and we will use it

When we need it,  $\delta =$  Dirac delta function (impulse at 0)

In particular,  $a^{*(0)} = \delta$

Also,  $FT[\delta](f) = 1$  for all  $f$

# START WITH THE MODULATION PROCESS

If  $\Delta_A(s)$  = new Assets taken on at time  $s$  then  $\Delta_A(s)$  will be a function of everything else in the model

$$\text{In fact, } \Delta_A(s) = \left( \left( \sum_{k=0}^{\infty} a^{*k} \right) * (\delta - b) * \Delta_B \right) (s)$$

$A(s, t)$  = Assets matured out of  $r(s)$  by time  $t$

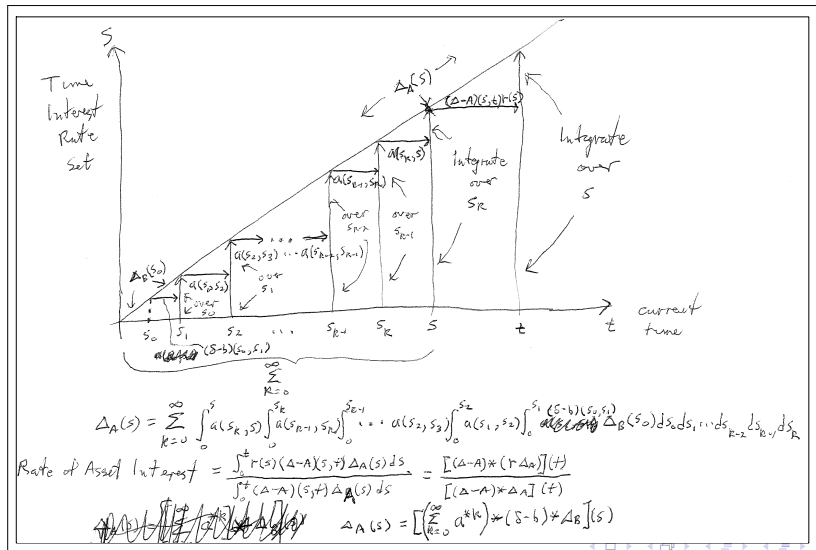
$a(s, t) = \frac{\partial}{\partial t} A(s, t)$  the rate of Assets maturing out of  $r(s)$  at time  $t$

$(\Delta - A)(s, t)$  = Assets still earning  $r(s)$  at time  $t$  = survival function of  $A(s, t)$  viewed as a cdf.

$$\text{Rate of interest available (at time } t) = \frac{\left[ (\Delta - A) * \left( r \left[ \left( \sum_{k=0}^{\infty} a^{*k} \right) * (\delta - b) * \Delta_B \right] \right) \right] (t)}{\left[ (\Delta - A) * \left( \left( \sum_{k=0}^{\infty} a^{*k} \right) * (\delta - b) * \Delta_B \right) \right] (t)}$$

# START WITH THE MODULATION PROCESS

## Interest generated by the Assets (going concern)





# START WITH THE MODULATION PROCESS

- Going concern interest rate spread  $s$  at time  $t$  is the difference

$$s(t) = \frac{\left[ (\Delta - A) * \left( r \left[ \left( \sum_{k=0}^{\infty} a^{*k} \right) * (\delta - b) * \Delta_B \right] \right) \right](t)}{\left[ (\Delta - A) * \left( \left( \sum_{k=0}^{\infty} a^{*k} \right) * (\delta - b) * \Delta_B \right) \right](t)} - \frac{[(\Delta - B) * (r \Delta_B)](t)}{[(\Delta - B) * \Delta_B](t)}$$

where the denominators are equal (a good test of your convolution algebra)

- At this point I don't know how to progress without assuming homogeneous business strategy, ie.  $B(s, t) = B(t - s)$ ,  $A(s, t) = A(t - s)$ , etc. for all  $s$  and  $t$
- Among other things this makes the convolutions the usual commutative definition.

# CONTINUING WITH THE MODULATION PROCESS

Some useful facts are

$$\begin{aligned}(\Delta - A) * \left( \sum_{k=0}^{\infty} a^{*k} \right) &= \Delta * (\delta - a) * \left( \sum_{k=0}^{\infty} a^{*k} \right) \\ &= \Delta * \delta \\ &= \Delta\end{aligned}$$

and  $\lim_{t \rightarrow \infty} \left( \sum_{k=0}^{\infty} a^{*k} \right) (t) = \frac{1}{\mu_A}$  where  $\mu_A$  is the mean of  $A$  considered as a cdf.

Also, those survival functions  $(\Delta - A)$  and  $(\Delta - B)$  involved in convolutions (= integrals) suggests that some more means are lurking in these formulas, for example  $\Delta * (\Delta - A) (t) \rightarrow \mu_A$  for  $t \rightarrow \infty$ , called "the surface interpretation of the mean"

# CONTINUING WITH THE MODULATION PROCESS

- If we assume a level stream of new Liabilities  $\Delta_B = \Delta$  the formula for the spread  $s$  is (after a lot of algebra to get  $r$  alone)

$$s = \frac{\left[ \frac{\mu_B}{\mu_A} (\Delta - A) - (\Delta - B) \right] * r}{[(\Delta - B) * \Delta]}$$
$$\frac{(\Delta - A) * \left\{ \left[ \left( \sum_{k=0}^{\infty} a^{*k} \right) * \left( \frac{\mu_B}{\mu_A} (\Delta - A) - (\Delta - B) \right) \right] r \right\}}{[(\Delta - B) * \Delta]}$$

- Amazingly, the messy term is a transient that goes to 0 as the homogenous going-concern reaches steady-state.
- In the permanent steady state, the denominator  $[(\Delta - B) * \Delta] \rightarrow \mu_B$
- For stable growing new Liabilities you just use distortions of  $A$ ,  $B$ ,  $a$ ,  $b$ ,  $\mu_A$  and  $\mu_B$ .
- The permanent steady-state term is made-to-order for a Fourier Transform

# CONCLUSION FOR THE MODULATION PROCESS

For each frequency  $f$  the Fourier transform of the steady-state going-concern spread with a level stream of new liabilities is

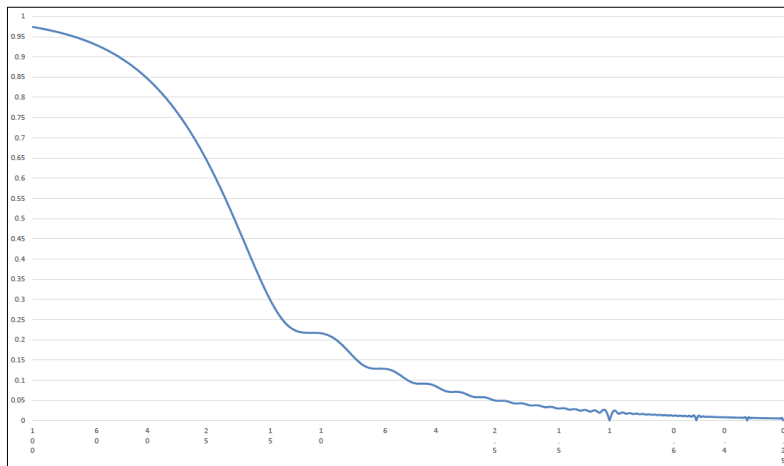
$$\begin{aligned} FT [s] (f) &= FT \left[ \frac{\Delta - A}{\mu_A} - \frac{\Delta - B}{\mu_B} \right] (f) FT [r] (f) \\ &= FT \left[ \Delta * \left( \frac{\delta - a}{\mu_A} - \frac{\delta - b}{\mu_B} \right) \right] (f) FT [r] (f) \\ &= FT [\Delta] (f) FT \left[ \frac{\delta - a}{\mu_A} - \frac{\delta - b}{\mu_B} \right] (f) FT [r] (f) \\ &= \left( \frac{1}{2\pi if} 1_{f \neq 0} + \frac{1}{2} \delta (f) \right) \left( \frac{1 - FT [a] (f)}{\mu_A} - \frac{1 - FT [b] (f)}{\mu_B} \right) \\ &\quad \cdot FT [r] (f) \\ &= \frac{1}{2\pi if} \left( \frac{1 - FT [a] (f)}{\mu_A} - \frac{1 - FT [b] (f)}{\mu_B} \right) FT [r] (f) \text{ if } f \neq 0 \end{aligned}$$

# CONCLUSION FOR THE MODULATION PROCESS

- In other words  $\frac{1}{2\pi if} \left( \frac{1-FT[a](f)}{\mu_A} - \frac{1-FT[b](f)}{\mu_B} \right)$  represents how the financial institution modulates the external interest rate frequency strengths  $FT[r](f)$  into interest spread frequency responses  $FT[s](f)$  when there is a level stream of new liabilities.
- We should note that if the new liability stream  $\Delta_B$  grows at a stable rate  $g$  the Fourier Transform of the interest rate spread works out to  $FT[s](f) = \frac{1}{\ln(1+g)+2\pi if} \left( \frac{1-FT[a](f)}{\mu_A} - \frac{1-FT[b](f)}{\mu_B} \right) FT[r](f)$  where the distorted versions of the functions and means must be used if the assumed growth  $g$  is not 0, and also in that case the equation works for  $f = 0$  too.
- The factor  $\frac{1}{\ln(1+g)+2\pi if}$  in the modulation already teaches an important lesson for risk management: a stable, well-managed level of growth is a very effective risk-control mechanism.
- But let's illustrate the basic modulation for our simple financial institution with 15-year ladder assets and 10-year bullet liabilities.

# ASSET MODULATION SPECTRUM (15 Year Ladder)

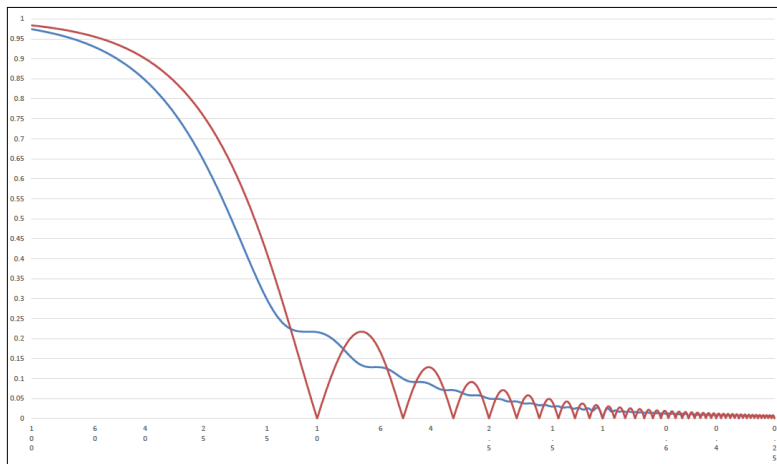
Modulus  $\left| \frac{1}{2\pi if} \left( \frac{1 - FT[a](f)}{\mu_A} \right) \right|$ ; don't forget there's a phase, too



Horizontal axis labeled by wavelength ( $\frac{1}{f}$ ) on a logarithmic scale.

# NOW THE LIABILITY SPECTRUM (10 Year Bullet)

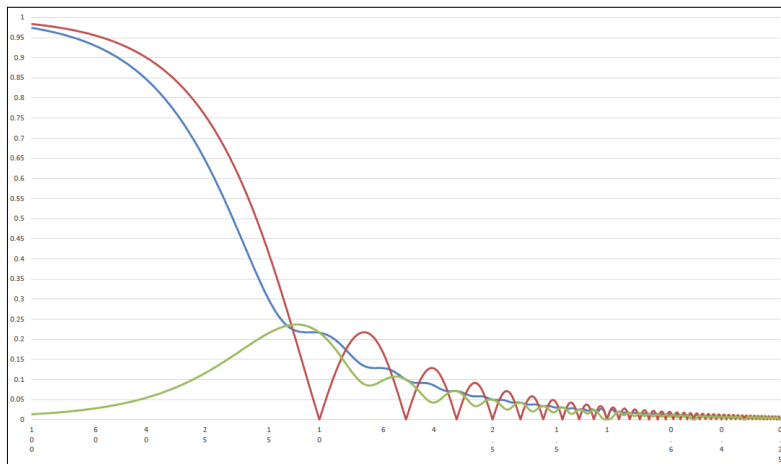
Modulus  $\left| \frac{1}{2\pi if} \left( \frac{1-FT[a](f)}{\mu_A} \right) \right|$  and  $\left| \frac{1}{2\pi if} \left( \frac{1-FT[b](f)}{\mu_B} \right) \right|$ ; don't forget phases



Horizontal axis labeled by wavelength on a logarithmic scale.

# SUBTRACT FOR THE NET MODULATION SPECTRUM

Modulus  $\left| \frac{1-FT[a](f)}{2\pi if \mu_A} - \frac{1-FT[b](f)}{2\pi if \mu_B} \right|$ ; phases matter!

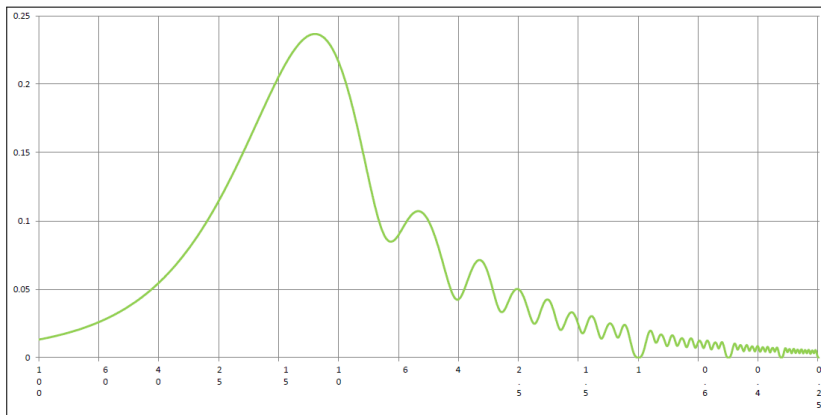


Wavelength on a logarithmic scale from 100 years to 0.25 years



# NET SPECTRUM = RISK CONTROL PROFILE

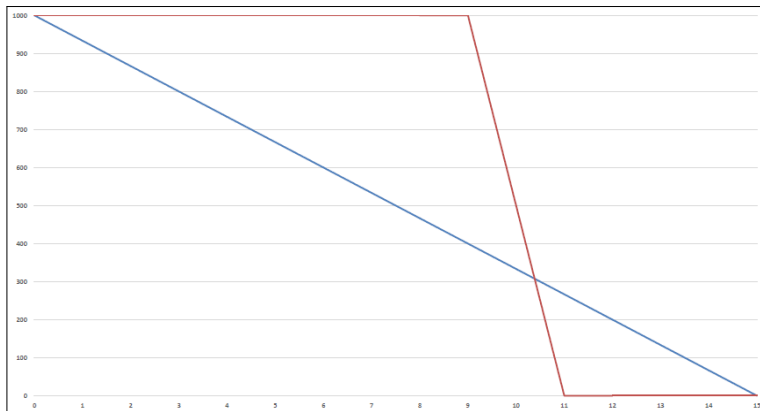
Modulus  $\left| \frac{1-FT[a](f)}{2\pi if\mu_A} - \frac{1-FT[b](f)}{2\pi if\mu_B} \right|$ ; phases matter!



- Risk max's at 12 year interest rate cycle (!); next 5.4 ( $= \frac{1}{2} \frac{12+9.5}{2}$ )
- But true risk exposure is the entire area under curve - what if the phases all line up?

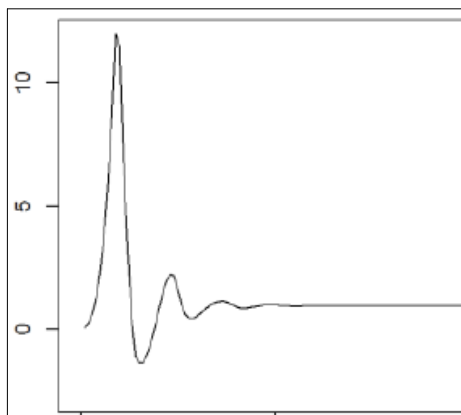
# A SLIGHTLY DIFFERENT FINANCIAL INSTITUTION

Steady stream of Liabilities that mature straight-line 9 to 11 years  
Assets straight line 0 to 15 years



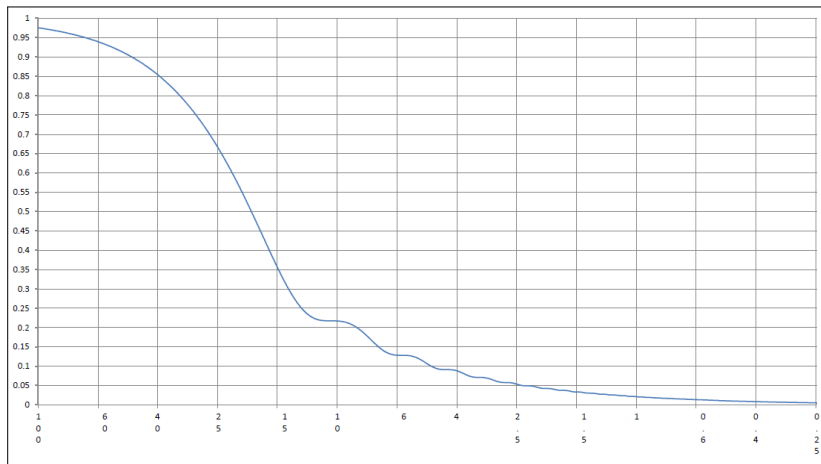
# A DIFFERENT GOING CONCERN WITH A-L MISMATCH

Take in a steady stream of 9-11 year st. line liabilities and invest steadily in 0-15 year st. line asset maturities. The following spreads result if interest rates increase steadily:

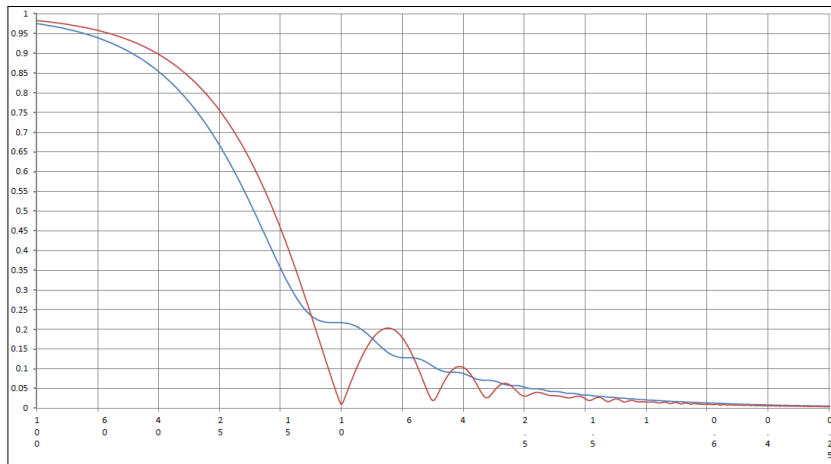


Steady-state profit, not loss

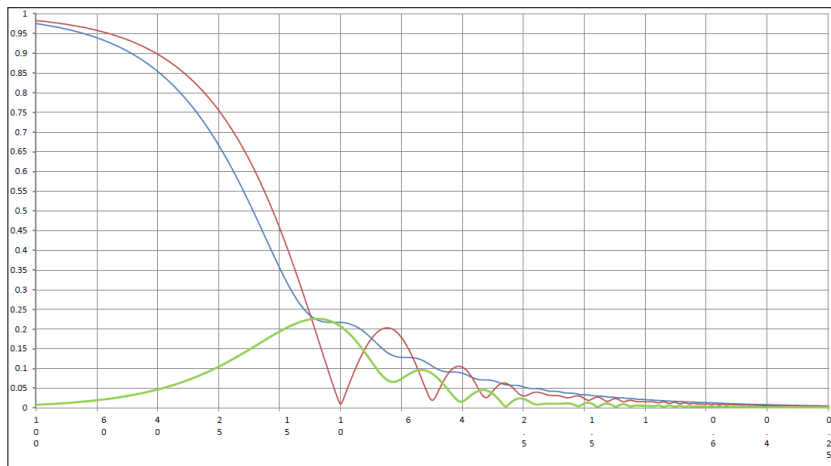
# ASSET SPECTRUM (15 Year Straight Line)



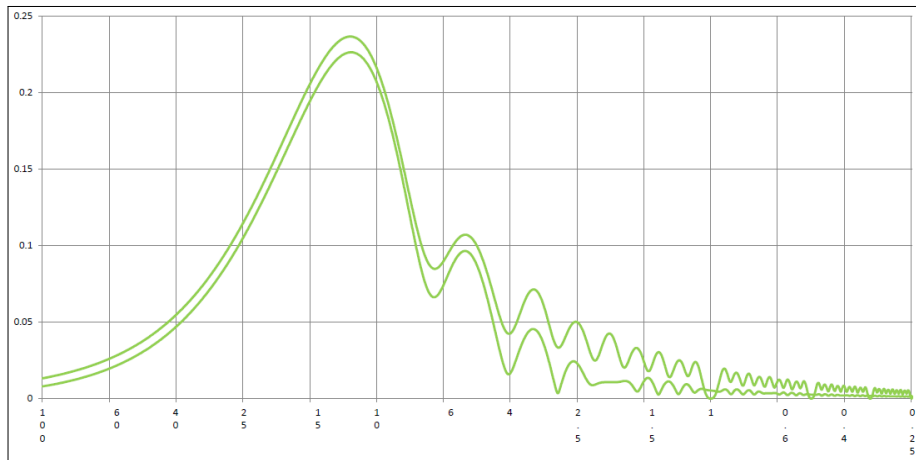
# LIABILITY SPECTRUM (9 to 11 Year Straight Line)



# NET SPECTRUM



# COMPARATIVE NET SPECTRA

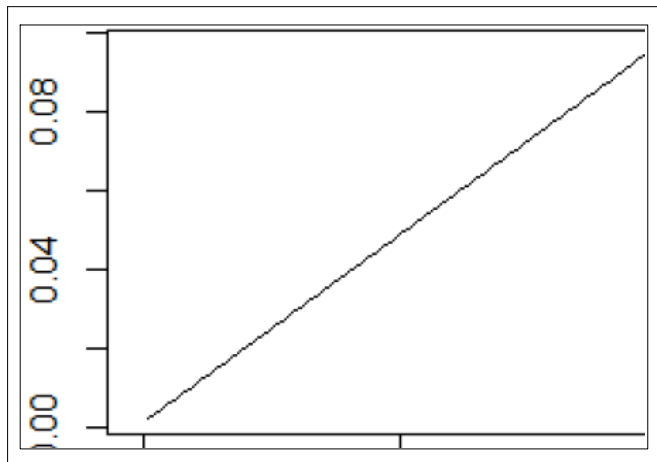


WHAT CAN WE SAY ABOUT THE  
EXTERNAL INTEREST RATE SPECTRUM

$FT[r](f)$  ?



# FINGER EXERCISE - STRAIGHT LINE INCREASE



If  $r(t)$  is linear with constant slope  $r'$  then  $\frac{dr}{dt}(t) = r'$ , so  
 $r(t) = (\Delta * \frac{dr}{dt})(t)$  and  $FT[r](f) = FT[\Delta](f) FT[\frac{dr}{dt}](f)$

# SPECTRUM OF STRAIGHT LINE INCREASE

$$\begin{aligned} FT[r](f) &= FT[\Delta](f) FT\left[\frac{dr}{dt}\right](f) \\ &= \left(\frac{1_{f \neq 0}}{2\pi if} + \frac{1}{2}\delta(f)\right) FT[r'](f) \\ &= \left(\frac{1_{f \neq 0}}{2\pi if} + \frac{1}{2}\delta(f)\right) r'\delta(f) \end{aligned}$$

because  $FT[\text{constant}] = \text{constant} \cdot \delta$ .

Thus  $FT[r](f) = 0$  unless  $f = 0$ , in which case it's an impulse function.

For interest rate spread  $s(t)$  we know that

$$FT[s](f) = \left[\frac{1 - FT[a](f)}{2\pi if \mu_A} - \frac{1 - FT[b](f)}{2\pi if \mu_B}\right] FT[r](f) \text{ but}$$

$\left[\frac{1 - FT[a](f)}{2\pi if \mu_A} - \frac{1 - FT[b](f)}{2\pi if \mu_B}\right] = 0$  when  $f = 0$ , so we'll need l'Hôpital's help to unravel  $FT[s](0) = 0 \cdot \infty$ .

# SPECTRUM OF SPREAD FROM STRAIGHT LINE

$$FT [s] (0) =$$

$$= \lim_{f \rightarrow 0} \left[ \frac{1 - FT [a] (f)}{2\pi if \mu_A} - \frac{1 - FT [b] (f)}{2\pi if \mu_B} \right] \left( \frac{1_{f \neq 0}}{2\pi if} + \frac{1}{2} \delta (f) \right) r' \delta (f)$$

$$= \lim_{f \rightarrow 0} \left[ \frac{1 - FT [a] (f)}{(2\pi if)^2 \mu_A} - \frac{1 - FT [b] (f)}{(2\pi if)^2 \mu_B} \right] 2\pi if \left( \frac{1_{f \neq 0}}{2\pi if} + \frac{1}{2} \delta (f) \right) r' \delta (f)$$

$$= \lim_{f \rightarrow 0} \left[ \frac{1 - FT [a] (f)}{(2\pi if)^2 \mu_A} - \frac{1 - FT [b] (f)}{(2\pi if)^2 \mu_B} \right] (1_{f \neq 0} + \pi if \delta (f)) r' \delta (f)$$

$$= \lim_{f \rightarrow 0} \left[ \frac{1 - FT [a] (f)}{(2\pi if)^2 \mu_A} - \frac{1 - FT [b] (f)}{(2\pi if)^2 \mu_B} \right] 1_{f \neq 0} r' \delta (0)$$

$$= \lim_{f \rightarrow 0} \left[ \frac{1 - FT [a] (f)}{(2\pi if)^2 \mu_A} - \frac{1 - FT [b] (f)}{(2\pi if)^2 \mu_B} \right] r' \delta (0)$$

because  $\lim_{f \rightarrow 0} 1_{f \neq 0} = 1$

# SPECTRUM OF SPREAD FROM STRAIGHT LINE

Now use l'Hôpital twice

$$\begin{aligned} FT [s] (0) &= \lim_{f \rightarrow 0} \left[ \frac{1 - FT [a] (f)}{(2\pi if)^2 \mu_A} - \frac{1 - FT [b] (f)}{(2\pi if)^2 \mu_B} \right] r' \delta (0) \\ &= \lim_{f \rightarrow 0} \left[ -\frac{\frac{d^2}{df^2} FT [a] (f)}{\frac{d^2}{df^2} (2\pi if)^2 \mu_A} + \frac{\frac{d^2}{df^2} FT [b] (f)}{\frac{d^2}{df^2} (2\pi if)^2 \mu_B} \right] r' \delta (0) \\ &= \left[ -\frac{FT \left[ (2\pi i)^2 t^2 a(t) \right] (0)}{2 (2\pi i)^2 \mu_A} + \frac{FT \left[ (2\pi i)^2 t^2 b(t) \right] (0)}{2 (2\pi i)^2 \mu_B} \right] r' \delta \end{aligned}$$

because for any density  $h(t)$  it's true that

$\frac{d}{df} FT [h(t)] (f) = -FT [2\pi i t h(t)] (f)$ . Now 2nd moments appear

$$\begin{aligned} FT \left[ (2\pi i)^2 t^2 h(t) \right] (0) &= \int_{-\infty}^{\infty} (2\pi i)^2 t^2 h(t) e^{-2\pi i t \cdot 0} dt \\ &= (2\pi i)^2 \int_{-\infty}^{\infty} t^2 h(t) dt = (2\pi i)^2 \mu'_{H2} \end{aligned}$$

# SPECTRUM OF SPREAD FROM STRAIGHT LINE

- So

$$FT [s] (0) = -\frac{1}{2} \left[ \frac{\mu'_{A2}}{\mu_A} - \frac{\mu'_{B2}}{\mu_B} \right] r' \delta (0)$$

is the impulse function at  $f = 0$  that constitutes the entire spectrum of the stable state interest rate spread  $s(t)$  caused by a straight line movement of the external interest rate  $r(t)$ .

- This spectrum implies that  $s(t)$  is a constant

$$s(t) = -\frac{1}{2} \left[ \frac{\mu'_{A2}}{\mu_A} - \frac{\mu'_{B2}}{\mu_B} \right] r'$$

- If we calculate ratios of second to first moments for the simple asset and liability maturity schedules that we showed earlier, this formula gives exactly the small constant steady-state loss (or gain) that we saw earlier by brute force calculation.
- $\frac{1}{2} \frac{\mu'_{H2}}{\mu_H}$  is the mean of what risk theory calls "the equilibrium distribution" of the distribution  $H$ , with density  $\frac{S_H(t)}{\mu_H}$ ,  $H = A$  or  $B$

# 1ST CONCLUSION FOR THE MODULATED PROCESS

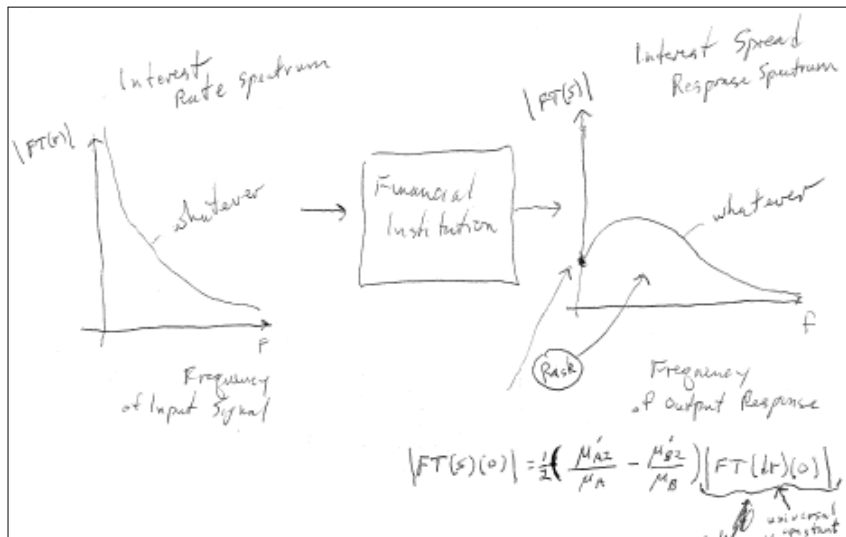
- This rather specialized result at  $f = 0$  generalizes to any external interest rate process  $r(t)$ :

$$|FT[s](0)| = \frac{1}{2} \left| \frac{\mu'_{A2}}{\mu_A} - \frac{\mu'_{B2}}{\mu_B} \right| |FT[dr](0)|$$

where  $|FT[dr](0)|$  is the frequency 0 (i.e. drift) component of the Fourier Transform of the process  $dr(t)$  that generates  $r(t)$ .

- If the model has growing new liabilities  $\Delta_B(t)$  then distortions of both the means and the second moments must be used
- It should be no surprise that these equilibrium distribution means  $\frac{1}{2} \frac{\mu'_{A2}}{\mu_A}$  and  $\frac{1}{2} \frac{\mu'_{B2}}{\mu_B}$  can be formally related (a duality) with the traditional duration concept.
- All of the risk area beyond  $f = 0$  still remains, however, untouched by this dual version of "duration".

# 1ST CONCLUSION FOR THE MODULATED PROCESS



# NOW THE EXTERNAL INTEREST RATE SPECTRUM

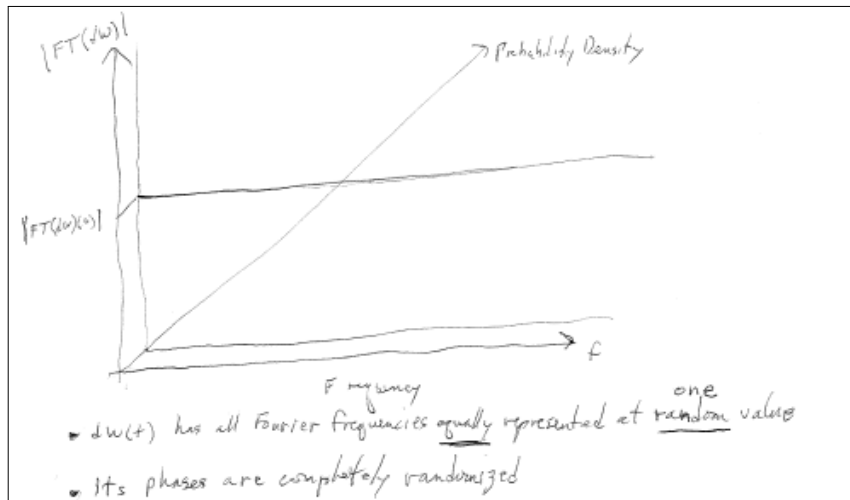
- Assume that Brownian motion drives whatever process we end up with
- $dW(t)$  is the random Brownian increment at each time  $t$ ;  
 $\{dW(t)\}_{-\frac{1}{2dt} \leq t \leq \frac{1}{2dt}}$  are  $\frac{1}{dt}$  independent  $N(0, dt)$  RVs
  - A fixed world runs from  $-\frac{1}{2dt}$  to  $\frac{1}{2dt}$ ; Brownian sampling gives the  $dW(t)$  at each  $t$  which then is fixed once and for all
- $FT[dW](f) = \int_{-\infty}^{\infty} e^{-2\pi ift} dW(t) = e^{2\pi i\phi(f)} N(0, \frac{1}{dt})$  with random phase  $\phi(f)$ . Why?
  - $\{dW(t)\}$  is a set of  $\frac{1}{dt}$  independent samples from  $N(0, dt)$  so  $\int_{-\frac{1}{2dt}}^{\frac{1}{2dt}} e^{-2\pi ift} dW(t)$  is normal with  $\mathbb{E} = 0$ ,  $\mathbb{V} = \left(\frac{1}{dt}\right)^2 dt = \frac{1}{dt}$ , i.e.
  - $\mathbb{E} \left[ |FT[dW](f)|^2 \right] = \mathbb{E} [FT[dW](f) FT[dW](-f)]$  (conjugates)
  - $= \int_{-\frac{1}{2dt}}^{\frac{1}{2dt}} \mathbb{E} [dW^2(t)]$  (independent)
  - $= \int_{-\frac{1}{2dt}}^{\frac{1}{2dt}} dt = \frac{1}{2dt} - \left(-\frac{1}{2dt}\right) = \frac{1}{dt}$



# THE SPECTRUM OF $dW(t)$

- We even can identify the specific  $N(0, \frac{1}{dt})$  RV:  $|FT[dW](f)|^2 = FT[dW](f) FT[dW](-f) = \int_{-\frac{1}{2dt}}^{\frac{1}{2dt}} dW^2(t) = (FT[dW](0))^2$
- So  $|FT[dW](f)| = |FT[dW](0)|$ , same value for all  $f$ , and the phase of  $FT[dW](f)$  is totally random in  $f$  (and unknowable)
- $FT[dW](0)$  is a random real number, drawn from  $N(0, \frac{1}{dt})$ , fixed for all time, and unknowable (see picture)
- This is a little like renormalization in physics. It sounds strange but it works since everything we actually observe will just be relative to this unknowable thing.
- Remember, we promised that true risk models will be very different from our usual models!
- All of the Fourier frequencies are equally represented in  $FT[dW](f)$
- Random walk comes from randomized phase relationships.

# SPECTRUM OF THE BROWNIAN INCREMENT



# THE SPECTRUM OF BROWNIAN MOTION $W(t)$

Now we know everything we need to get from  $FT [dW]$  to  $FT [W]$

$$W(t) = (\Delta * dW)(t) \text{ so}$$

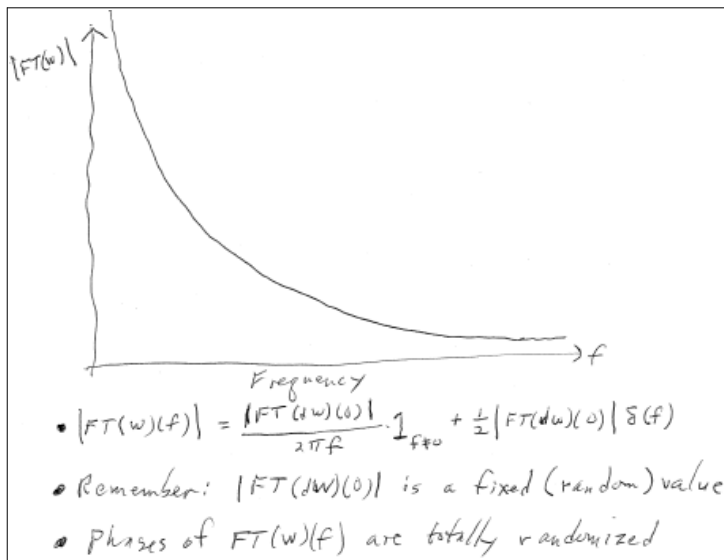
$$\begin{aligned} FT [W](f) &= FT [\Delta * dW](f) \\ &= FT [\Delta](f) FT [dW](f) \\ &= \left( \frac{1_{f \neq 0}}{2\pi if} + \frac{1}{2} \delta(f) \right) e^{2\pi i \phi(f)} FT [dW](0) \end{aligned}$$

where  $\phi(f)$  is a totally random phase. This gives

$$\begin{aligned} |FT [W](f)| &= \left| \frac{1_{f \neq 0}}{2\pi if} + \frac{1}{2} \delta(f) \right| |FT [dW](0)| \\ &= \frac{|FT [dW](0)|}{2\pi |f|} 1_{f \neq 0} + \frac{|FT [dW](0)|}{2} \delta(f) \end{aligned}$$

with phases totally randomized (note: last step required  $1_{f \neq 0} \cdot \delta(f) = 0$ ).  
The random phases are what makes the walk random.

# THE SPECTRUM OF BROWNIAN MOTION



# MEAN-REVERTING GEOMETRIC BROWNIAN MOTION

- The external interest rate  $r(t)$  is likely to have a mean-reversion of some kind and a zero-avoidance of some kind.
- Mean-reverting Geometric Brownian (Black-Karaisinski) looks like:

$$dr(t) = \left\{ \frac{1}{2}\sigma^2 - \ln(1-F)[\ln T - \ln r(t)] - \frac{1}{4}\sigma^2[1 + 1_{F=0}] \right\} r(t) dt + \sigma r(t) dW$$

i.e.  $dr(t) = (L + \ln(1-F)\ln(r)(t))r(t)dt + \sigma r(t)dW(t)$

with  $L = \frac{1}{2}\sigma^2 - \ln(1-F)\ln T - \frac{1}{4}\sigma^2[1 + 1_{F=0}]$

- Decoding:
  - $0 \leq F \leq 1$  is an annualized mean-reversion strength
  - $1_{F=0}$  picks up the (little-known) need to change drift compensation from  $-\frac{1}{2}\sigma^2$  toward  $-\frac{1}{4}\sigma^2$  when there's mean-reversion
  - With this drift compensation  $\mathbb{E}[r(t)] = T$  in the steady-state
  - Start process at  $r(-\frac{1}{2dt}) = T$ ; drift comp. important when  $F = 0$
- $r(t) = (\Delta * dr)(t)$  so  $FT[r](f) = FT[\Delta](f)FT[dr](f)$  and off we go
- Alas,  $FT[dr](f)$  has  $FT[r](f)$  in it and also  $FT[\ln r]$  in it.
- We have to work for a solution

# MEAN-REVERTING GEOMETRIC BROWNIAN MOTION

- Start with an integration by parts:

$$d[e^{-2\pi ift} r(t)] = e^{-2\pi ift} dr(t) - 2\pi ife^{-2\pi ift} r(t) dt$$

$$2\pi ife^{-2\pi ift} r(t) dt = e^{-2\pi ift} dr(t) - d[e^{-2\pi ift} r(t)] \text{ and now } \int_{-\frac{1}{2dt}}^{\frac{1}{2dt}} dt$$

$$\begin{aligned} 2\pi if FT[r](f) &= FT[dr](f) - e^{-2\pi if \frac{1}{2dt}} r\left(\frac{1}{2dt}\right) + e^{2\pi if \frac{1}{2dt}} T \\ &= FT[dr](f) - e^{-2\pi if \frac{1}{2dt}} [T + FT[dr](0)] + e^{2\pi if \frac{1}{2dt}} T \\ &= FT[dr](f) - e^{-2\pi if \frac{1}{2dt}} FT[dr](0) + 2\pi if T \delta(f) \end{aligned}$$

by a careful application of l'Hôpital's rule

- Now substitute

$$\begin{aligned} FT[dr](f) &= L \cdot FT[r](f) + \ln(1 - F) FT[\ln(r) \cdot r](f) + \sigma FT[r \cdot dW](f) \\ &= L \cdot FT[r](f) + \ln(1 - F) [FT[\ln r] * FT[r]](f) + \sigma [FT[r] * FT[dW]](f) \end{aligned}$$

and solve for  $FT[r](f)$ :

$$\begin{aligned} FT[r](f) &= \frac{1}{2\pi if - L} \{ \ln(1 - F) [FT[\ln r] * FT[r]](f) \\ &\quad + \sigma [FT[r] * FT[dW]](f) - e^{-2\pi if \frac{1}{2dt}} FT[dr](0) + 2\pi if T \delta(f) \} \end{aligned}$$

# MEAN-REVERTING GEOMETRIC BROWNIAN MOTION

- A similar calculation gives an expression for  $FT[\ln r]$  using:

$d[e^{-2\pi ift} \ln r(t)] = e^{-2\pi ift} d \ln r(t) - 2\pi ife^{-2\pi ift} \ln r(t) dt$  to integrate by parts

- $d \ln r(t) = -K dt + \sigma dW(t)$  for

$K = \{ \ln(1 - F)[\ln T - \ln r(t)] + -\frac{1}{4}\sigma^2[1 + 1_{F=0}] \}$  to substitute in the resulting integral, giving

- $FT[\ln r](f) = \frac{1}{2\pi if - \ln(1 - F)} \{ -K\delta(f) + \sigma FT[dW](f) - e^{-2\pi if \frac{1}{2dt}} FT[d \ln r](0) + 2\pi if\delta(f) \}$

- That can be substituted into the expression for  $FT[r](f)$

- The resulting expression takes a lot of work but leads to

$$FT[r](f) = \frac{\sigma[FT[r]*FT[dW]](f) - FT[dr](0)1_{f=0} + 2\pi ifT\delta(f)}{2\pi if - \frac{1}{2}\sigma^2 1_{F \neq 0} - Q[r](f)\sigma[FT[r]*FT[dW]](f)}$$

# MEAN-REVERTING GEOMETRIC BROWNIAN MOTION

- In  $FT[r](f) = \frac{\sigma[FT[r]*FT[dW]](f) - FT[dr](0)1_{f=0} + 2\pi ifT\delta(f)}{2\pi if - \frac{1}{2}\sigma^2 1_{F \neq 0} - Q[r](f)\sigma[FT[r]*FT[dW]](f)}$  it looks like we have  $FT[r](f)$  on both sides of the equation (it is part of those convolutions.)
- However, we can interpret the expression  $[FT[r] * FT[dW]](f)$  to be a randomly weighted average of  $FT[r](h)$  over all values of  $h$  with the specific value  $f$  contributing primarily a random phase and perhaps (needs more analysis) a small random fluctuation in the modulus as  $f$  varies.
- Specifically,  $[FT[r] * FT[dW]](f) = FT[dW](0) \cdot (\text{factor})(f)$  where the factor depends upon  $f$  only for a phase and at most a small random fluctuation in modulus
- The expression  $Q[r](f)\sigma[FT[r] * FT[dW]](f)$  is a real number.
- $Q[r](f)$  depends upon  $f$  only for a phase and (perhaps) a randomly fluctuating modulus  $< 1$
- $Q[r](f) = 0$  when  $F=0$



# SPECTRUM FOR EXTERNAL INTEREST RATE

For its modulus,

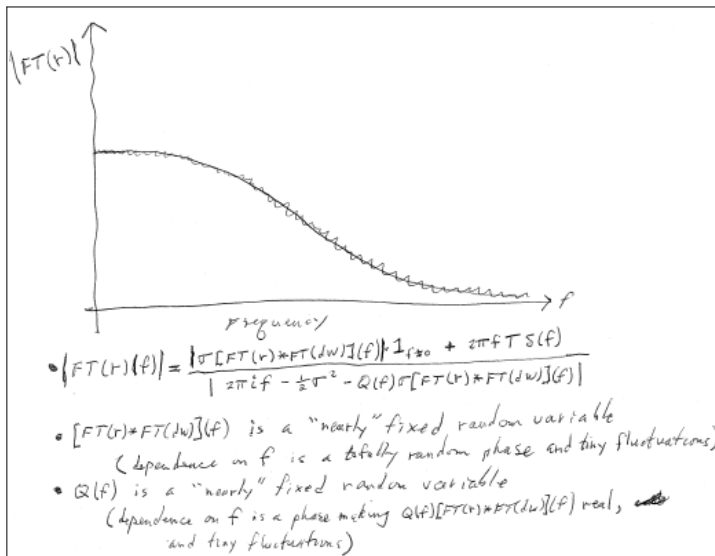
$|FT[r](f)|_{1_{f \neq 0}} = \frac{\sigma|[FT(r)*FT(dW)](f)|_{1_{f \neq 0}} + 2\pi f T \delta(f)}{|2\pi i f - \{\frac{1}{2}\sigma^2 + Q(f)\sigma[FT(r)*FT(dW)](f)\}_{1_{f \neq 0}}|}$  with totally randomized phase.

The expression for  $FT[r](f)$  is completely useless for forecasting because of the phase randomization. You can't even estimate the current phases because you need  $t \rightarrow \infty$  to calculate a phase.

But the modulus carries the full risk exposure.

Note that when  $F = 0$  this looks a lot like Brownian Motion (goes to  $\infty$  when  $f = 0$ , but mean reversion sets a maximum on value at  $f = 0$ )

# THE EXTERNAL RATE SPECTRUM (F not 0)



# THAT'S OUR DUAL MODEL FOR INTEREST RISK

So the interest rate spread in our going-concern has a risk spectrum of:

$|FT [s] (f)| = \left| \frac{1}{\ln(1+g)+2\pi if} \left( \frac{1-FT[a](f)}{\mu_A} - \frac{1-FT[b](f)}{\mu_B} \right) FT [r] (f) \right|$  where the phase is totally randomized, where the distorted versions of the functions and means must be used if the assumed growth  $g$  is not 0, and where

$|FT [r] (f)| = \frac{\sigma|[FT(r)*FT(dW)](f)|\mathbf{1}_{f \neq 0} + 2\pi f T \delta(f)}{2\pi if - \left\{ \frac{1}{2}\sigma^2 + Q(f)\sigma[FT(r)*FT(dW)](f) \right\} \mathbf{1}_{f \neq 0}}$  is the external rate spectrum.

I'm still working on numerical illustration of the external rate spectrum, which is needed to get a feel for where on the going-concern risk spectrum we most need to compress the response.

- For the modulation process
  - My paper at the 1998 International Congress of Actuaries

link to it at bottom of

[http://www.math.uconn.edu/~bridgeman/Papers\\_and\\_Presentations/index](http://www.math.uconn.edu/~bridgeman/Papers_and_Presentations/index)

- - But really, anyone who has programmed an ALM model has done this, whether they know it or not
- For the Fourier Analysis - any good text; I like
  - Rudin's Real and Complex Analysis
  - Brigham's Fast Fourier Transform
  - Meikle's A New Twist To Fourier Transforms
- For the application to random walk - you need to be careful; I used an actual-infinitesimals approach following the ideas in
  - Robinson's Non-Standard Analysis
  - But he didn't apply it to random walk ... I did and am confident I got it right

# SPECIAL THANKS TO

Chengyun Li