

Miletus.jl

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Part I

Introduction

Chapter 1

Introduction

1.1 Overview

Miletus is a financial contract definition, modeling language, and valuation framework written in Julia. The implementation of the contract definition language is based on papers by Peyton Jones and Eber [PJ&E2000],[PJ&E2003].

As originally conceived in the referenced papers, complex financial contracts can often be deconstructed into combinations of a few simple primitive components and operations. When viewed through the lens of functional programming, this basic set of primitive objects and operations form a set of "combinators" that can be used in the construction of more complex financial constructs.

Miletus provides both basic the primitives for the construction of financial contract payoffs as well as a decoupled set of valuation model routines that can be applied to various combinations of contract primitives. In Miletus, these "combinators" are implemented through the use of Julia's user-defined types, generic programming, and multiple dispatch capabilities.

Unlike some existing implementations of financial contract modeling environments (created in languages such as Haskell or OCaml) that rely heavily on pure functional programming for the contract definition language, but may then switch to a second language (e.g. C++, Java, APL) for implementation of valuation processes, Miletus leverages Julia's strong type system and multiple dispatch capabilities to both express these contract primitive constructs and provide for generation of efficient valuation code. As seen in other parts of the Julia ecosystem, Miletus solves the two language problem with regards to defining and modeling financial contracts.

Miletus provides functionality for teams across an organization, both front office and back office, to use a common language for structuring, valuing and managing complex financial instruments. Whether a sales team needs to structure new products, an operations team deploying infrastructure for batch processing, a risk management team must determine exposure of a firm's portfolio, or regulators are evaluating capital requirements for solvency, Miletus allows for everyone to use the same language effectively and efficiently.

1.2 Installation

Installation of Miletus can be performed by obtaining an installer from Julia Computing as part of your Julia Fin purchase.

Once installed, to load the Miletus package in your current Julia session, use the following command:

using Miletus

At this point you can use any of the primitive Miletus types for defining new contracts, constructing and manipulating either your own contracts or a set of pre-existing option contracts included with Miletus, as well as executing valuation operations against any combination of built-in and user-defined primitives that comprise your contract.

Part II

Tutorial

Chapter 2

Tutorial

└100USD

2.1 Motivating example

In the example code below we show, without detailed explanation, how to construct and value a European call option on a single stock using combinations of the basic primitive types. Each of the primitive types and operations utilized will be explained in more detail in subsequent sections.

```
using Miletus
 using Base.Dates
 using Miletus.TermStructure
 using Miletus.DayCounts
using BusinessDays
 import Miletus: When, Give, Receive, Pay, Buy, Both, At, Either, Zero
import Miletus: YieldModel, maturitydate
Acquire the rights to a contract with 100 units
x = Receive(100)
| Amount L
100
Acquire the rights to a contract with 100 units as an obligation
x = Pay(100)
Give ∟
Amount
  └100
Acquire the rights to a contract with 100 USD as an obligation
x = Pay(100USD)
Give └
Amount
```

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Construct an object containing the core properties of our stock model including the start price, yield curve and carry curve

```
s = SingleStock()
SingleStock
```

The functional definition for buying a stock at a given price

Calling the Buy method defined as in the previous operation

Defining the acquisition of rights to a contract on a given date

Constructing a zero coupon bond with a function having the same components as in the previous operation

One of the most basic of option structures, acquisition of either a stock or an empty contract having no rights and no obligations

Combining all of the above concepts into the definition of a European call option

Calling the functional form of a European Call option defined using the same components as in the previous operation

Construction of a Geometric Brownian Motion Model used for describing the price dynamics of a stock

```
| gbmm = GeomBMModel(Date("2016-01-01"), 100.0USD, 0.1, 0.05, .15)
| Miletus.GeomBMModel{Miletus.CoreModel{Miletus.Currency.CurrencyQuantity{Miletus.Currency.CurrencyUnit{:USD}, Float64}, Miletus.TermStructure.ConstantYieldCurve, Miletus.TermStructure.ConstantYieldCurve}}(
| Miletus.CoreModel{Miletus.Currency.CurrencyQuantity{Miletus.Currency.CurrencyUnit{:USD}, Float64}, Miletus.TermStructure.ConstantYieldCurve, Miletus.TermStructure.ConstantYieldCurve}(100.0USD, Miletus. TermStructure.ConstantYieldCurve(Miletus.DayCounts.Actual365(),0.1,:Continuous,-1,2016-01-01), Miletus.TermStructure.ConstantYieldCurve(Miletus.DayCounts.Actual365(),0.05,:Continuous,-1,2016-01-01)), 0.15)
```

Valuation of our European call option whose underlying stock model uses a Geometric Brownian Motion Model for its price dynamics

```
| value(gbmm, eucall)
| 8.09128105913761USD
```

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2.2 Building Contracts with Primitive and Derived Types

Most of the types defined in Miletus are built upon a small set abstract types (Contract, Observable {T}, Process {T}, TermStruct, DayCount, AbstractModel), and each of the primitive combinators described in the original PJ&E papers are implemented as a typealias of a set of Julia types having one of these abstract types as a super type.

Contract primitives

The set of Contract primitives includes the following types:

- Zero()
 - A "null" contract
- Amount(o::Observable)
 - Receive an amount of the observable object o
- Scale(s::Observable, c::Contract)
 - Scale the contract c by s
- Both(c1::Contract, c2::Contract)
 - Acquire both contracts c1 and c2
 - This type corresponds to the and combinator in the PJ&E papers.
- Either(c1::Contract, c2::Contract)
 - Acquire either contract c1 or c2
 - This type corresponds to the or combinator in the PJ&E papers.
- Give(c::Contract)
 - Take the opposite side of contract c
 - Acquires the rights to contract c as an obligation
- Cond(p::Observable{Bool}, c1::Contract, c2::Contract)
 - If expression p is true at the point of acquisition, then acquire contract c1, otherwise acquire contract c2
- When(p::Observable{Bool}, c::Contract)
 - Acquire the contract c at the point when observable quantity p becomes true.
- Anytime(p::Observable{Bool}, c::Contract)
 - May acquire the contract c at any point when observable quantity p is true.
- Until(p::Observable{Bool}, c::Contract)
 - A contract that acts like contract c until p is true, at which point the object is abandoned, and hence becomes worthless.

Primative Observables

Like Contract, Observable {T} is defined as an abstract type. Specific instances of an Observable type are objects, possibly time-varying, and possibly unknown at contracting time, for which a direct measurement can be made. Example observable quantities include date, price, temperature, population or other objects that can be objectively measured.

Built-in primitive Observable types include the following:

- DateObs() <: Observable{Date}
 - A singleton type representing the "free" date observable
- AcquisitionDateObs() <: Observable{Date}
 - The acquisition date of the contract
- ConstObs{T} <: Observable{T}
 - A constant observable quantity
 - ConstObs(x) Constructor function for a constant observable of value x

Derived Observables

Built-in derived observable types include the following:

- AtObs(t::Date) <: Observable{Bool}
 - AtObs(t::Date) = LiftObs(==,DateObs(),ConstObs(t))
 - An observable that is true when the date is t
 - This type of observable is used as part of the construction of the derived contract primitives ZCB, WhenAt, Forward, and European
- BeforeObs(t::Date) <: Observable{Bool}
 - BeforeObs(t::Date) = LiftObs(<=,DateObs(),ConstObs(t))</pre>
 - An observable that is true when the date is before or equal to t
 - This type of observable is useds as part of the construction of the derived contract primitives Anytime-Before and American

Each of these derived Observable types makes use of a LiftObs operation.

LiftObs is defined as an immutable type whose type constructor applies a function to one or more existing Observable quantities to produce a new Observable.

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2.3 Constructing Observables and Contracts

To provide an example of how one goes about using the above primitive and derived Observable types, let's return to one of the operations from the opening "Motivting Example" section. We will break apart each piece of the constructed zero coupon bond, to point out the specific Contract and Observable components utilized.

Defining the acquisition of rights to a contract on a given date

Constructing a zero coupon bond with a function having the same components as in the previous operation

The most basic primitives in the above zero coupon bond construction are the Amount primitive Contract type used for representing the value of 100, the CurrencyUnit and CurrencyQuantity types used when representing USD, and the DateObs primitive Observable type used for representing the a Date.

The expression Receive (100USD) creates a Contract object that provides acquisition rights to 100USD.

The expression At(Date("2016-12-25")) creates a new LiftObs observable object that is true when the current date in the valuation model is "2016-12-25". The implementation of the At observable type constructor includes the following operations:

```
typealias AtObs LiftObs{typeof(==),Tuple{DateObs,ConstObs{Date}},Bool}
AtObs(t::Date) = LiftObs(==,DateObs(),ConstObs(t))
typealias At AtObs
```

WARNING: Method definition (::Type{Miletus.LiftObs{Base.#==, Tuple{Miletus.DateObs, Miletus.ConstObs{Base.
Dates.Date}}, Bool}})(Base.Dates.Date) in module Miletus at /Users/aviks/.julia/v0.5/Miletus/src/
observables.jl:65 overwritten in module ex-lift at none:2.

The arguments to LiftObs in the definition of AtObs include:

- The == function that will be applied to two observable values on date quantities
- A DateObs object that acts as a reference observable quantity for the "Current Date" when valuing a model

• An input date t which becomes a constant observable quantity ConstObs(t) to which the reference observable is compared when valuing a contract.

The commands below show both the hierarchy of observables and the type of the result returned by a call to At.

```
| At(Date("2016-12-25"))
| {==} |-
| DateObs |-
| 2016-12-25
| typeof(At(Date("2016-12-25")))
| Miletus.LiftObs{Base.#==,Tuple{Miletus.DateObs,Miletus.ConstObs{Date}},Bool}
```

With use of the When primitive Contract, the combination of our defined Receive(100USD) Contract object with the above At(Date("2016-12-25")) Observable object constructs new a zero coupon bond Contract that defines a payment of 100USD to the holder on December 25th, 2016.

The concept of optionality provides a contract acquirer with a choice on whether to exercise particular rights embedded in that contract. The most basic Contract primitives representing optionality in Miletus are the Either and Cond primitives described previously.

Adjusting the zero coupon bond example above to incorporate the Either, Both and AtObs Contract and Observable primitives allow for implementing a European Call option as repeated below.

The above operations are defined as the typealias EuropeanCall

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By combining various Contract and Observable primitives, contract payoffs of arbitrary complexity can be constructed easily.

The next section lists a number of built-in derived contracts that combine the above primitives in the defintion of various types of options instruments.

2.4 Built-in Derived Contracts

By combining these contract primitives, a set of typealias quantities are defined that allow for more compact syntax when creating various derived contracts. Using these type aliases, a set of constructors for these derived contracts are defined as shown below:

- Receive(x::Union{Real,CurrencyQuantity}) = Amount(ConstObs(x))
 - Receive an amount of a particular real valued object or currency
- Pay(x::Union{Real,CurrencyQuantity}) = Give(Receive(x))
 - Pay an amount of a particular real valued object or currency
- Buy(c::Contract, x::Union{Real,CurrencyQuantity}) = Both(c, Pay(x))
 - Purchase a contract c for an amount of a particular real valued object or currency
- Sell(c::Contract, x::Union{Real,CurrencyQuantity}) = Both(Give(c), Receive(x))
 - Sell a contract c for an amount of a particular real valued object or currency
- ZCB(date::Date, x::Union{Real,CurrencyQuantity}) = When(AtObs(date), Receive(x))
 - A "Zero Coupon Bond" that provides for obtaining a particular amount of a real valued object or currency on a particular maturity date
- WhenAt(date::Date, c::Contract) = When(AtObs(date), c)
 - Activate the contract c on the particular maturity date
- Forward(date::Date, c::Contract, strike::Union{Real,CurrencyQuantity}) = WhenAt(date, Buy(c, strike))
 - Purchase a contract c for a particular amount of a real valued object or currency (strike) on a particular maturity date
- Option(c::Contract) = Either(c, Zero())
 - Activate either contract c or nothing
- European(date::Date, c::Contract) = WhenAt(date, Option(c))
 - On a particular maturity date acquire either contract c or nothing
- EuropeanCall(date::Date, c::Contract, strike::Union{Real,CurrencyQuantity}) = European(date, Buy(c, strike))
 - A European call contract, with maturity date, on underlying contract c at price strike

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EuropeanPut(date::Date, c::Contract, strike::Union{Real,CurrencyQuantity}) = European(date, Sell(c, strike))

- A European put contract, with maturity date, on underlying contract c at price strike
- AnytimeBefore(date::Date, c::Contract) = Anytime(BeforeObs(date), c)
 - Activate the contract c anytime before a particular maturity date
- American(date::Date, c::Contract) = AnytimeBefore(date, Option(c))
 - Either activate the contract c or nothing anytime before a particular maturity date
- AmericanCall(date::Date, c::Contract, strike::Union{Real,CurrencyQuantity}) = American(date, Buy(c, strike))
 - An American call contract, with maturity date, on underlying contract c at price strike
- AmericanPut(date::Date, c::Contract, strike::Union{Real,CurrencyQuantity}) = American(date, Sell(c, strike))
 - An American put contract, with maturity date, on underlying contract c at price strike
- AsianFixedStrikeCall(dt::Date, c::Contract, period::Period, strike) = European(dt, Buy(Movin-gAveragePrice(c, period), strike))
 - An Asian option contract where the strike price is constant and whose pay off is based on the moving average price of the underlying over the life of the contract.
- AsianFloatingStrikeCall(dt::Date, c::Contract, period::Period, strike) = European(dt, Both(c, Give(MovingAveragePrice(c, period))))
 - An Asian option contract where the strike price and payoff are based on the moving average price of the underlying over the life of the contract.

2.5 DayCounts

Miletus provides implementations of a number of separate calendar implementations that take into consideration day count conventions from different countries and financial organizations worldwide. Each day count type is an instance of an abstract DayCount type.

Specific DayCount instances present in Miletus include:

- Actual360 Uses a coupon factor equal to the number of days between two dates in a Julian calendar divided by 360.
- Actual365 Uses a coupon factor equal to the number of days between two dates in a Julian calendar divided by 365.
- BondThirty360 / USAThirty360 Uses a coupon factor equal to the number of days between two dates assuming 30 days in any month and 360 days in a year. Used for the pricing of US Corporate Bonds and many US agency bond issues.
- EuroBondThirty360 / EuroThirty360 Uses a coupon factor equal to the number of days between two dates assuming 30 days in any month and 360 dates in a year.

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- ItalianThirty360
- ISMAActualActual
- ISDAActualActual
- AFBActualActual

For each DayCount type, the yearfraction function provides the fractional position within the associated year for a provided input date.

Modifying a particular date in the course of a calculation often needs to take into account the above DayCount convention, as well as a relevant holiday calendar. The adjust function takes into account holidays through functionality used from the HolidayCalendar included BusinessDays package.

2.6 Processes

In the context of the contract definition language implemented by Miletus, a Process, p(t), is a mapping from time to a random variable of a particular type. Both Contract objects and Observable objects can be modeled as a Process. Like Contract and Observable, a Process is defined in Miletus as an abstract type, where subtypes of Process are implemented as immutable types.

The following Process types are available for operating on Contract and Observable objects

- DateProcess() maps an Observable date to the given date.
- ConstProcess(val::T) maps an Observable value to a constant value (val::T) for all times.
- CondProcess(cond::Process{Bool}, a::Process{T}, b::Process{T}) based on first Process boolean value, maps to one of two distinct Process values.

2.7 Term Structures

Term Structures provide a framework for representing how interest rates for a given set of modeling assumptions change through time.

- TermStruct An abstract type that is a super type to all Term Structures implmented in Miletus
- YieldTermStructure An abstract type that encompasses various interest rate term structure models
- VolatilityTermStructure An abstract type that encompasses various volatility term structure models
- ConstantYieldCurve A concrete type encompassing a constant interest rate model
- ConstantVolatilityCurve A concrete type encompassing a constant volatility model
- compound_factor Multiplicative factor using the frequency and method by accumulated interest is included in principle for the purporses of interest rate calculations
- discount_factor Inverse of the above compound_factor
- implied_rate Determination of the current interest rate implied from the compounding factor
- forward_rate A rate of interest as implied by the current zero rate of a given YieldTermStructure for periods of time in the future.
- zero_rate The implied spot interest rate for a given YieldTermStructure and time horizon
- par_rate A coupon rate for which a bond price equals its nominal value

Chapter 3

Models

A valuation model encompasses both the analytical mathematical description of the dynamics involved in how an observable quantity changes through time, as well as a numerical method used for discretizing and solving those analytical equations.

There are a wide variety of different analytical models for describing the value dynamics of interest rates, stocks, bonds, credit instruments (e.g. mortgages, credit cards, other loans) and other securities. With regards to numerical methods, most techniques fall into one of four distinct categories; Analytical Methods (closed-form equations), Lattice Methods (e.g. trees), Monte Carlo Methods, and Partial Differential Equation solvers (e.g. finite difference, finite element).

The Contract and Observable primitives described previously are used for setting up payoffs that act as boundary conditions and final conditions on the use of a model to value an instrument.

3.1 Implemented Models and Valuation methods

- Core Model (objective assumptions underlying the model. everything except volatility. objective parameters that can be observed in the market)
- Core Forward Model
- Yield Curves and Dates
- Geometric Brownian Motion
 - GeomBMModel(startdate, startprice, interestrate, carryrate, volatility)
 - * A model for a SingleStock, following a geometric Brownian motion that includes the following fields:
 - · startdate
 - · startprice: initial price at startdate
 - · interestrate: risk free rate of return.
 - carryrate: the carry rate, i.e. the net return for holding the asset:
 - · for stocks this is typically positive (i.e. dividends)
 - for commodities this is typically negative (i.e. cost-of-carry)
 - * volatility:
 - The interestrate, carryrate and volatility are all specified on a continously compounded, Actual/365 basis.
 - · The price is assumed to follow the PDE:

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 $dS_t=(\kappa-\sigma^2/2)S_tdt+\sigma S_tdW_t$ * where W_t is a Wiener process, and κ = interestrate - carryrate.

- * Associated valuation routines make use of analytical methods for solving the Black-Scholes equation, or when determining implied volatitilies based on the Black-Scholes equation.
- Binomial Geometric Random Walk
 - BinomialGeomRWModel(startdate, enddate, nsteps, S₀, Δt, iR, logu, logd, p, q)
 - * A model for a Binomial Geometric Random Walk (aka Binomial tree)
 - * The valuation routines for binomial trees are initialized using the payoff condition of the associated contract at expiry(enddate) and subsequently work backward in time through the tree to determine the value of the contract at the initial time (startdate).
 - * Includes the following fields (or the Log of those values)
 - startdate : start date of process
 - · enddate : end date of process
 - · nsteps: number of steps in the tree
 - · S₀: inital value
 - · Δt: the time-difference between steps, typically days(startdate enddate) / (365*nsteps)
 - iR: discount rate, exp(-∆t*interestrate)
 - · u : scale factor for up
 - · d : scale factor for down
 - · p : up probability
 - · q: down probability, 1-p

Plot of the underlying stock price dynamics on the binomial tree.

```
![](../media/binomial_tree1.png)
```

- * Cox-Ross-Rubenstein Model
 - * Makes use of a risk-neutral valuation principle wherein the expected return from the traded security is the risk-free interest rate, and all future cash flows can be valued by discounting their respective cashflows at that risk-free interest rate.
 - * Imposes the condition that d = 1/u
 - * u = $\exp\sigma\Delta(*t)$
 - * d = $\exp\sigma\Delta(-*t)$
 - * p = $(\exp(r\Delta *t)-d)/(u-d)$
 - * q = $(u-exp(r\Delta*t))/(u-d)$

Plot of the underlying stock price dynamics on the binomial tree for the Cox-Ross-Rubenstein Model.

* Jarrow-Rudd Model

```
* u = exp((r\sigma-^2/2)\Delta*t + \sigma\Delta*t)
```

- * d = exp(($r\sigma$ -^2/2) Δ *t $\sigma\Delta$ *t)
- *p = q = 0.5
- * NOTE: not risk-neutral

```
* Jarrow-Rudd Risk Neutral

* u = exp((rσ-^2/2)Δ*t + σΔ*t)
* d = exp((rσ-^2/2)Δ*t - σΔ*t)
* p = (exp(rΔ*t)-d)/(u-d)
* q = (u-exp(rΔ*t))/(u-d)

* Tian

* u = 1/2*exp(rΔ*t)*v*(v+1+sqrt(v^2+2v-3)), where v = expσΔ(^2*t)
* d = 1/2*exp(rΔ*t)*v*(v+1-sqrt(v^2+2v-3)), where v = expσΔ(^2*t)
* p = (exp(rΔ*t)-d)/(u-d)
* q = (u-exp(rΔ*t))/(u-d)
```

- Monte Carlo Model
 - montecarlo(m::GeomBMModel, dates, n)
 - * Accepts a Geometrical Brownian Motion model of the underlying asset dynamics.
 - * Samples n Monte Carlo paths of the model m, at time dates.
 - * Returns a MonteCarloModel
 - MonteCarloModel(core, dates, paths)
 - * A MonteCarloModel is a type that represents the result of a simulation of a series of asset prices and includes the following fields:
 - * core: a reference CoreModel
 - * dates: an AbstractVector{Date}
 - * paths: a matrix of the scenario paths: the rows are the scenarios, and the columns are the values at each date in dates.
 - MonteCarloScenario(core, dates, path)
 - * A MonteCarloScenario is a single simulation scenario of a MonteCarloModel and includes the following fields:
 - * core: a reference CoreModel
 - * dates: an AbstractVector{Date}
 - * paths: an AbstractVector of the values at each date in dates.

3.2 Functions available for operating on a Model

- value()
- valueAt()
- forwardprice()
- yearfraction()
- yearfractionto()
- numeraire()
- startdate()
- ivol()

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3.3 Implied Volatlity calculations

• SplineInterpolation

- This is used to model interpolation between any two discrete points on a discrete convex curve. This implements double quadratic interpolation.

```
* `x`: An Array of the discrete values on the x axis
* `y`: An Array of the discrete values on the y axis
* `weights`: An Array of tuples of the weights of every quadratic curve modelled between two
discrete points on the curve
```

• SplineVolatilityModel

- ivol(m::SplineInterpolation, c::European)
 - * Compute the implied Black-Scholes volatility of an option c under the SplineVolatilityModel m.
- fit(SplineVolatilityModel, mcore::CoreModel, contracts, prices)
 - * Fit a SplineVolatilityModel using from a collection of contracts (contracts) and their respective prices (prices), under the assumptions of mcore.
- fit_ivol(SplineVolatilityModel, mcore::CoreModel, contracts, ivols)
 - * Fit a SplineVolatilityModel using from a collection of contracts (contracts) and their respective implied volatilities (ivols), under the assumptions of mcore.

GeomBMModel

- ivol(m::CoreModel, c::Contract, price)
 - * Compute the Black-Scholes implied volatility of contract c at price, under the assumptions of model m (ignoring the volatility value of m).
- fitvol(GeomBMModel, m::CoreModel, c::Contract, price)
 - * Fit a GeomBMModel using the implied volatility of c at price, using the parameters of the CoreModel m.

SABRModel

- ivol(m::SABRModel, c::European)
 - * Compute the implied Black-Scholes volatility of an option c under the SABR model m.
- fit_ivol(SABRModel, mcore::CoreModel, contracts, ivols)
 - * Fit a SABRModel using from a collection of contracts (contracts) and their respective implied volatilities (ivols), under the assumptions of mcore.
- sabr_alpha(F, t, σ ATM, β , ν , ρ) Not currently exported
 - * Compute the α parameter (initial volatility) for the SABR model from the Black-Scholes at-themoney volatility. * F: Forward price * t: time to maturity * σATM: Black-Scholes at-the-money volatility * β, ν, ρ: parameters from SABR model.

Part III

Examples

Chapter 4

Extended Examples

4.1 Spread Options

Below we define a set of various spread options that show how one can combine vanilla options into more complex payoffs.

```
using Miletus, Gadfly, Colors
import Miletus: Both, Give, Contract, WhenAt, value
import Base.strip
```

First define parameters for use in various contract and model definitions.

```
expirydate = Date("2016-12-25") startdate = Date("2016-12-1") interestrate = 0.05 carryrate = 0.1 volatility = 0.15 K_1 = 98.0USD K_2 = 100.0USD K_3 = 102.0USD L = 11 # Layers in the binomial lattice / Number of time steps
```

Next we define a range of prices to use for plotting payoff curves.

```
price = K_1-1USD:0.1USD:K_3+1USD
```

Then we construct example analytical, binomial, and Monte Carlo test models that will be used when valuing the various vanilla and spread options at the defined start date.

```
gbmm = GeomBMModel(startdate, K<sub>2</sub>, interestrate, carryrate, volatility)
crr = CRRModel(startdate, expirydate, L, K<sub>2</sub>, interestrate, carryrate, volatility)
mcm = Miletus.montecarlo(gbmm, startdate:expirydate, 10_000)
```

Next let's define a function for calculating the payoff curve of each spread at expiry over a range of asset prices. This function assumes that the provided date is the expiry date of all components within the contract c.

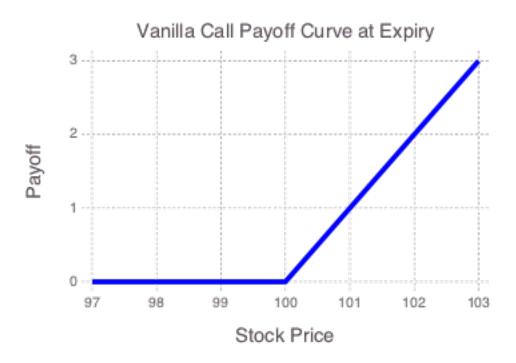


Figure 4.1:

```
function payoff_curve(c, d::Date, prices)
   payoff = [value(GeomBMModel(d, x, 0.0, 0.0, 0.0), c) for x in prices]
   p = [x.val for x in payoff]
   r = [x.val for x in prices]
   return r, p
end
```

Next we will create a set of vanilla call and put options at separate strikes that will be used for construction of the different spread options. The included plots show the payoff of the option at the middle strike, K_2 .

Vanilla Call Option

```
value(gbmm, call<sub>2</sub>)
```

```
1.3688351717682052USD
value(crr, call<sub>2</sub>)
1.4034866337776404USD
| value(mcm, call<sub>2</sub>)
1.3849767880288002USD
Vanilla Put Option
 put_1 = EuropeanPut(expirydate, SingleStock(), K_1)
 put<sub>2</sub> = EuropeanPut(expirydate, SingleStock(), K<sub>2</sub>)
 put_3 = EuropeanPut(expirydate, SingleStock(), K_3)
 s_1,pp_1 = payoff_curve(put_1, expirydate, price)
 s<sub>2</sub>,pp<sub>2</sub> = payoff_curve(put<sub>2</sub>, expirydate, price)
 s<sub>3</sub>,pp<sub>3</sub> = payoff_curve(put<sub>3</sub>, expirydate, price)
 plot(x = s_2, y = pp_2, Geom.line,
       Theme(default_color=colorant"blue", line_width = 1.0mm),
       Guide.title("Vanilla Put Payoff Curve at Expiry"),
       Guide.xlabel("Stock Price"), Guide.ylabel("Payoff"))
value(gbmm, put<sub>2</sub>)
1.6959851162778619USD
value(crr, put₂)
1.7306365782873316USD
value(mcm, put<sub>2</sub>)
1.6588648682783513USD
```

Now we will start to combine these vanilla calls and puts into various spread options.

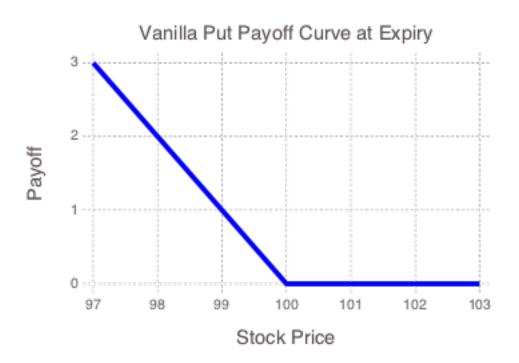


Figure 4.2:

Butterfly Call Spread

```
# Buy two calls at the high and low strikes
# Sell two calls at the middle strike
function butterfly_call(expiry::Date, K_1, K_2, K_3)
    @assert K_1 < K_2 < K_3
    c<sub>1</sub> = EuropeanCall(expiry, SingleStock(), K<sub>1</sub>)
    c<sub>2</sub> = EuropeanCall(expiry, SingleStock(), K<sub>2</sub>)
    c<sub>3</sub> = EuropeanCall(expiry, SingleStock(), K<sub>3</sub>)
    Both(Both(c_1,c_3), Give(Both(c_2,c_2)))
end
bfly_1 = butterfly_call(expirydate, K_1, K_2, K_3)
s,p_bfly<sub>1</sub> = payoff_curve(bfly<sub>1</sub>, expirydate, price)
blk = colorant"black"
red = colorant"red"
grn = colorant"green"
blu = colorant"blue"
plot(layer( x=s ,y=p_bfly_1,Geom.line,Theme(default_color=blk,line_width=1.5mm)),
      layer( x=s_1,y=cp_1 ,Geom.line,Theme(default_color=red,line_width=1.0mm)),
      layer( \ x=s_3,y= \ cp_3 \ , Geom.line, Theme(default\_color=grn, line\_width=1.0mm)),
      layer( \ x=s_2, y=-2cp_2 \ \ , Geom.line, Theme(default\_color=blu, line\_width=1.0mm)),
      Guide.manual_color_key("",["Butterfly Call", "call<sub>4</sub>", "call<sub>3</sub>", "-2call<sub>2</sub>"],
      ["black", "red", "green", "blue"]),
      Guide.title("Butterfly Call Payoff Curve at Expiry"),
```

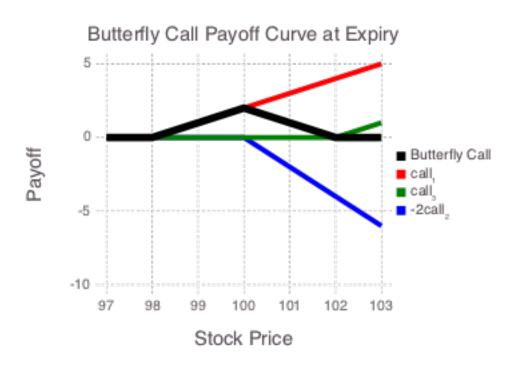


Figure 4.3:

```
Guide.xlabel("Stock Price"), Guide.ylabel("Payoff"))

| value(gbmm, bfly<sub>1</sub>)

| 0.40245573232657295USD

| value(crr, bfly<sub>1</sub>)

| 0.3760697909383439USD

| value(mcm, bfly<sub>1</sub>)

| 0.40403957435376725USD

| Butterfly Put Spread
```

Buy two puts at the high and low strikes
Sell two puts at the middle strike

function butterfly_put(expiry::Date, K_1 , K_2 , K_3)

 $p_1 = EuropeanPut(expiry, SingleStock(), K_1)$

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 $\texttt{@assert} \ \mathsf{K_1} \ < \ \mathsf{K_2} \ < \ \mathsf{K_3}$

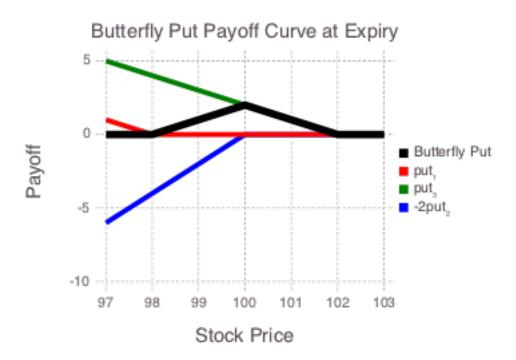


Figure 4.4:

```
p<sub>2</sub> = EuropeanPut(expiry, SingleStock(), K<sub>2</sub>)
    p<sub>3</sub> = EuropeanPut(expiry, SingleStock(), K<sub>3</sub>)
    Both(Both(p_1,p_3), Give(Both(p_2,p_2)))
bfly<sub>2</sub> = butterfly_put(expirydate, K<sub>1</sub>, K<sub>2</sub>, K<sub>3</sub>)
s,p_bfly<sub>2</sub> = payoff_curve(bfly<sub>2</sub>, expirydate, price)
blk = colorant"black"
red = colorant"red"
grn = colorant"green"
blu = colorant"blue"
plot(layer( x=s ,y=p_bfly2,Geom.line,Theme(default_color=blk,line_width=1.5mm)),
      layer(x=s_1,y=pp_1, Geom.line, Theme(default_color=red, line_width=1.0mm)),
      layer( \ x=s_3,y= \ pp_3 \ , Geom.line, Theme(default\_color=grn, line\_width=1.0mm)),
      layer( \ x=s_{2},y=-2pp_{2} \ \ ,Geom.line,Theme(default\_color=blu,line\_width=1.0mm)),
      Guide.manual_color_key("",["Butterfly Put", "put<sub>1</sub>", "put<sub>3</sub>", "-2put<sub>2</sub>"],
      ["black", "red", "green", "blue"]),
      Guide.title("Butterfly Put Payoff Curve at Expiry"),
      Guide.xlabel("Stock Price"), Guide.ylabel("Payoff"))
```

0.40245573232657295USD

value(gbmm, bfly₂)

```
value(crr, bfly₂)
0.37606979093834303USD
value(mcm, bfly<sub>2</sub>)
0.40403957435377524USD
Bear Call Spread
 # Buy a call at the high strike
 # Sell a call at the low strike
 function bear_call(expiry::Date, K1, K2)
     @assert K<sub>1</sub> != K<sub>2</sub>
     c_1 = EuropeanCall(expiry, SingleStock(), K_1)
     c_2 = EuropeanCall(expiry, SingleStock(), K_2)
     Both(Give(c_1), c_2)
 end
 bear<sub>1</sub> = bear_call(expirydate, K<sub>1</sub>, K<sub>2</sub>)
 s,p_bear<sub>1</sub> = payoff_curve(bear<sub>1</sub>, expirydate, price)
 blk = colorant"black"
 red = colorant"red"
 blu = colorant"blue"
 plot(layer( x=s, y=p_bear<sub>1</sub>,Geom.line,Theme(default_color=blk,line_width=1.5mm)),
       layer( \ x=s_1,y=-cp_1 \ \ ,Geom.line,Theme(default\_color=red,line\_width=1.0mm)),
      layer( \ x=s_{2},y= \ cp_{2} \ \ ,Geom.line,Theme(default\_color=blu,line\_width=1.0mm)),
      Guide.manual_color_key("",["Bear Call", "-call<sub>1</sub>", "call<sub>2</sub>"],
      ["black", "red", "blue"]),
      Guide.title("Bear Call Payoff Curve at Expiry"),
      Guide.xlabel("Stock Price"), Guide.ylabel("Payoff"))
| value(gbmm, bear<sub>1</sub>)
-1.1196804045372653USD
value(crr, bear₁)
-1.1071634323407784USD
value(mcm, bear<sub>1</sub>)
-1.1366268756697908USD
```



Figure 4.5:

Bear Put Spread

```
# Buy a put at the low strike
# Sell a put at the high strike
function bear_put(expiry::Date, K1, K2)
    @assert K<sub>1</sub> != K<sub>2</sub>
    p_1 = EuropeanPut(expiry, SingleStock(), K_1)
    p<sub>2</sub> = EuropeanPut(expiry, SingleStock(), K<sub>2</sub>)
    Both(p_1, Give(p_2))
end
bear<sub>2</sub> = bear_put(expirydate, K<sub>1</sub>, K<sub>2</sub>)
r,p_bear<sub>2</sub> = payoff_curve(bear<sub>2</sub>, expirydate, price)
blk = colorant"black"
red = colorant"red"
blu = colorant"blue"
plot(layer( x=s, y=p_bear2,Geom.line,Theme(default_color=blk,line_width=1.5mm)),
      layer( x=s<sub>1</sub>, y= pp<sub>1</sub> ,Geom.line,Theme(default_color=red,line_width=1.0mm)),
      layer( \ x=s_2, \ y=-pp_2 \ \ , Geom.line, Theme(default\_color=blu, line\_width=1.0mm)),
      Guide.manual_color_key("",["Bear Put", "call<sub>1</sub>", "-call<sub>2</sub>"],
      ["black", "red", "blue"]),
      Guide.title("Bear Put Payoff Curve at Expiry"),
      Guide.xlabel("Stock Price"), Guide.ylabel("Payoff"))
```

```
value(gbmm, bear<sub>2</sub>)
```



Figure 4.6:

```
-0.873755049943609USD

| value(crr, bear<sub>2</sub>)

| -0.886272022140092USD

| value(mcm, bear<sub>2</sub>)

| -0.8568085788110785USD
```

Bull Call Spread

```
# Buy a call at the low strike
# Sell a call at the high strike
function bull_call(expiry::Date, K<sub>1</sub>, K<sub>2</sub>)
    @assert K<sub>1</sub> != K<sub>2</sub>
    c<sub>1</sub> = EuropeanCall(expiry, SingleStock(), K<sub>1</sub>)
    c<sub>2</sub> = EuropeanCall(expiry, SingleStock(), K<sub>2</sub>)
    Both(c<sub>1</sub>, Give(c<sub>2</sub>))
end

bull<sub>1</sub> = bull_call(expirydate, K<sub>1</sub>, K<sub>2</sub>)
r,p_bull<sub>1</sub> = payoff_curve(bull<sub>1</sub>, expirydate, price)
```

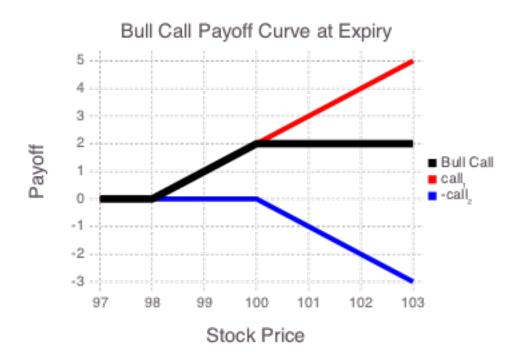


Figure 4.7:

```
blk = colorant"black"
 red = colorant"red"
blu = colorant"blue"
 plot(layer( x=s ,y=p_bull<sub>1</sub>,Geom.line,Theme(default_color=blk,line_width=1.5mm)),
      layer( x=s<sub>1</sub>,y= cp<sub>1</sub> ,Geom.line,Theme(default_color=red,line_width=1.0mm)),
      layer( \ x=s_{2},y=-cp_{2} \ \ \text{,Geom.line,Theme(default\_color=blu,line\_width=1.0mm)),}
      Guide.manual_color_key("",["Bull Call", "call<sub>1</sub>", "-call<sub>2</sub>"],
      ["black", "red", "blue"]),
      Guide.title("Bull Call Payoff Curve at Expiry"),
      Guide.xlabel("Stock Price"), Guide.ylabel("Payoff"))
value(gbmm, bull₁)
1.1196804045372653USD
value(crr, bull₁)
1.1071634323407784USD
value(mcm, bull<sub>1</sub>)
1.1366268756697908USD
```



Figure 4.8:

Bull Put Spread

```
# Buy a put at the high strike
# Sell a put at the low strike
function bull_put(expiry::Date, K1, K2)
     @assert K<sub>1</sub> != K<sub>2</sub>
     p_1 = EuropeanPut(expiry, SingleStock(), K_1)
     p<sub>2</sub> = EuropeanPut(expiry, SingleStock(), K<sub>2</sub>)
     Both(Give(p_1), p_2)
end
bull<sub>2</sub> = bull_put(expirydate, K<sub>1</sub>, K<sub>2</sub>)
r,p_bull<sub>2</sub> = payoff_curve(bull<sub>2</sub>, expirydate, price)
blk = colorant"black"
red = colorant"red"
blu = colorant"blue"
plot(layer( x=s ,y=p_bull<sub>2</sub>,Geom.line,Theme(default_color=blk,line_width=1.5mm)),
      layer( x=s<sub>1</sub>,y=-pp<sub>1</sub> ,Geom.line,Theme(default_color=red,line_width=1.0mm)),
      layer( \ x=s_2, y= \ pp_2 \ \ , Geom.line, Theme(default\_color=blu, line\_width=1.0mm)),
      Guide.manual_color_key("",["Bear Put", "-put<sub>1</sub>", "put<sub>2</sub>"],
      ["black", "red", "blue"]),
      Guide.title("Bear Put Payoff Curve at Expiry"),
      Guide.xlabel("Stock Price"), Guide.ylabel("Payoff"))
```

```
value(gbmm, bull<sub>2</sub>)
```

```
0.873755049943609USD
value(crr, bull₂)
0.886272022140092USD
value(mcm, bull,)
0.8568085788110785USD
Straddle Spread
 # Buy a put and a call at the same strike
 function straddle(expiry::Date, K)
     p = EuropeanPut(expiry, SingleStock(), K)
     c = EuropeanCall(expiry, SingleStock(), K)
     Both(p, c)
 end
 strd<sub>1</sub> = straddle(expirydate, K<sub>2</sub>)
 r,p_strd<sub>1</sub> = payoff_curve(strd<sub>1</sub>, expirydate, price)
 blk = colorant"black"
 red = colorant"red"
 blu = colorant"blue"
 plot(layer( x=s ,y=p_strd_1,Geom.line,Theme(default_color=blk,line_width=1.5mm)),
      layer( x=s<sub>1</sub>,y=cp<sub>2</sub> ,Geom.line,Theme(default_color=red,line_width=1.0mm)),
      layer( x=s2,y=pp2
                             ,Geom.line,Theme(default_color=blu,line_width=1.0mm)),
      Guide.manual_color_key("",["Straddle", "call2", "put2"],
      ["black", "red", "blue"]),
      Guide.title("Straddle Payoff Curve at Expiry"),
      Guide.xlabel("Stock Price"), Guide.ylabel("Payoff"))
value(gbmm, strd₁)
3.064820288046067USD
value(crr, strd₁)
3.134123212064972USD
value(mcm, strd<sub>1</sub>)
3.0438416563071513USD
```

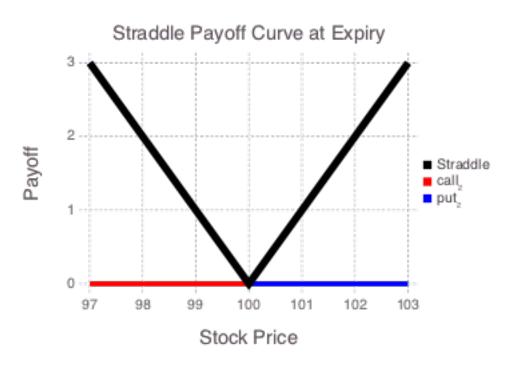


Figure 4.9:

Strip Spread

```
# Buy one call and two puts at the same strike
 function strip(expiry::Date, K)
     p = EuropeanPut(expiry, SingleStock(), K)
     c = EuropeanCall(expiry, SingleStock(), K)
     Both(c, Both(p, p))
 strip<sub>1</sub> = strip(expirydate, K<sub>2</sub>)
 r,p_strip = payoff_curve(strip<sub>1</sub>, expirydate, price)
 blk = colorant"black"
 red = colorant"red"
 blu = colorant"blue"
 plot(layer( x=s ,y=p_strip,Geom.line,Theme(default_color=blk,line_width=1.5mm)),
                             ,Geom.line,Theme(default_color=red,line_width=1.0mm)),
      layer( x=s<sub>1</sub>,y=cp<sub>2</sub>
      layer( \ x=s_2, y=2pp_2 \ \ , Geom.line, Theme(default\_color=blu, line\_width=1.0mm)),
      Guide.manual_color_key("",["Strip", "call<sub>2</sub>", "2put<sub>2</sub>"],
      ["black", "red", "blue"]),
      Guide.title("Strip Payoff Curve at Expiry"),
      Guide.xlabel("Stock Price"), Guide.ylabel("Payoff"))
| value(gbmm, strip<sub>1</sub>)
4.7608054043239285USD
```

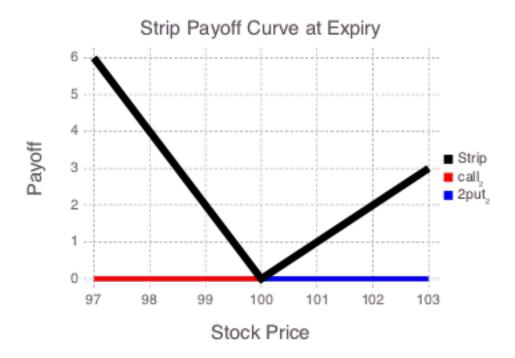


Figure 4.10:

```
| value(crr, strip<sub>1</sub>)
| 4.864759790352304USD
| value(mcm, strip<sub>1</sub>)
| 4.702706524585503USD
```

Strap Spread

```
# Buy one put and two calls at the same strike
function strap(expiry::Date, K)
    p = EuropeanPut(expiry, SingleStock(), K)
    c = EuropeanCall(expiry, SingleStock(), K)
    Both(p, Both(c, c))
end

strap<sub>1</sub> = strap(expirydate, K<sub>2</sub>)
r,p_strap = payoff_curve(strap<sub>1</sub>, expirydate, price)
blk = colorant"black"
red = colorant"red"
blu = colorant"blue"
plot(layer( x=s ,y=p_strap,Geom.line,Theme(default_color=blk,line_width=1.5mm)),
    layer( x=s<sub>1</sub>,y=2cp<sub>2</sub> ,Geom.line,Theme(default_color=red,line_width=1.0mm))),
```



Figure 4.11:

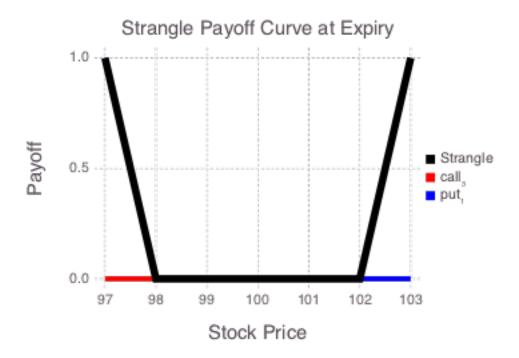


Figure 4.12:

Strangle Spread

1.473840565891766USD

```
# Buy a put at the low strike and a call at the high strike
function strangle(expiry::Date, K1, K2)
     p = EuropeanPut(expiry, SingleStock(), K<sub>1</sub>)
     c = EuropeanCall(expiry, SingleStock(), K<sub>2</sub>)
     Both(p, c)
end
 strangle_1 = strangle(expirydate, K_1, K_3)
 r,p_strangle = payoff_curve(strangle<sub>1</sub>, expirydate, price)
blk = colorant"black"
red = colorant"red"
blu = colorant"blue"
 plot(layer( x=s ,y=p_strangle,Geom.line,Theme(default_color=blk,line_width=1.5mm)),
                                ,Geom.line,Theme(default_color=red,line_width=1.0mm)),
      layer( x=s_1, y=cp_3
      layer( x=s2,y=pp1
                                ,Geom.line,Theme(default_color=blu,line_width=1.0mm)),
      Guide.manual_color_key("",["Strangle", "call<sub>3</sub>", "put<sub>1</sub>"],
      ["black", "red", "blue"]),
      Guide.title("Strangle Payoff Curve at Expiry"),
      Guide.xlabel("Stock Price"), Guide.ylabel("Payoff"))
value(gbmm, strangle₁)
```

```
| value(crr, strangle<sub>1</sub>)
| 1.5167575485224454USD
| value(mcm, strangle<sub>1</sub>)
| 1.4544457761800493USD
```

4.2 Coupon Bearing Bonds

Unlike a zero coupon bond, a coupon bearing bond pays the holder a specified amount at regular intervals up to the maturity date of the bond. These coupon payments, and the interest that can accumulate on those payments must be taken into account when pricing the coupon bond. The structuring of a coupon bond with Miletus provides an example of how to construct a product with multiple observation dates.

```
using Miletus, BusinessDays
using Miletus.TermStructure
using Miletus.DayCounts

import Miletus: Both, Receive, Contract, When, AtObs, value
import Miletus: YieldModel
import BusinessDays: USGovernmentBond
import Base.Dates: today, days, Day, Year
```

First let's show an example of the creation of a zero coupon bond. For this type of bond a payment of the par amount occurs only on the maturity date.

Next let's define a function for our coupon bearing bond. The definition of multiple coupon payments and the final par payment involves a nested set of Both types, with each individual payment constructed from a When of an date observation and a payment contract.

```
function couponbond(par,coupon,periods::Int,start::Date,expiry::Date)
  duration = expiry - start
  bond = When(AtObs(expiry), Receive(par))
  for p = periods-1:-1:1
      coupondate = start + duration*p/periods
      bond = Both(bond,When(AtObs(coupondate), Receive(coupon)))
  end
  return bond
end
```

```
couponbond (generic function with 1 method)
```

To construct an individual coupon bond, we first define necessary parameters for the par, coupon, number of periods, start date and expiry date.

```
par = 100USD
coupon = 1USD
periods = 12
startdate = today()
expirydate = today() + Day(360)
```

Now we can construct an instance of a coupon bearing bond.

```
cpb = couponbond(par,coupon,periods,startdate,expirydate)
```

```
Both |
Both
-Both
 | |-Both| | | | | | | |
| | |-Both|
 | | | | | | | | | Both|
    | |—DateObs|
                  | \_2018-02-04|
                  ∟Amount|
                    └-100USD|
                └─When|
                  |-{==}|
                    |-DateObs|
                    L2018-01-05
                  L_Amount |
                    L1USD
              ∟When|
                 <del>|-{==}|</del>
                 | |-DateObs|
                  L2017-12-06
                ∟Amount|
                  L1USD|
             ∟When|
               <del>|-{==}|</del>
                -DateObs
                L2017-11-06
               ∟Amount |
                L1USD|
             <del>|-</del>{==}|
```

```
| |-DateObs|
               | └2017-10-07|
               ∟Amount|
                 L1USD|
      <del>|-{==}|</del>
             | |—DateObs|
             | └2017-09-07|
             ∟Amount|
               L1USD|
    <del>|-{==}|</del>
           | | DateObs
           | <del>L</del>2017-08-08|
           ∟Amount |
             L1USD|
    | └─When|
        <del>|-</del>{==}|
         | |—DateObs|
         | └2017-07-09|
         L_Amount|
           L1USD
├-{==}|
       | |-DateObs|
       | -2017-06-09|
       L_Amount|
         L1USD|
 | └─When|
     <del>|-</del>{==}|
      |-DateObs|
      L2017-05-10
     ∟Amount|
       L1USD|
 ∟When|
   ⊢{==} |
   | | DateObs |
   ∟Amount |
     L1USD L
When
  ⊢{==}
   -DateObs
    └2017-03-11
  ∟Amount
   L1USD
```

Finally we can value this bond by constructing a yield curve and associated yield model and operating on the coupon bond contract with the defined yield model.

```
| yc = ConstantYieldCurve(Actual360(), .1, :Continuous, :NoFrequency, Dates.today())

| Miletus.TermStructure.ConstantYieldCurve(Miletus.DayCounts.Actual360(),0.1,:Continuous,-1,2017-02-09)

| ym = YieldModel(yc, ModFollowing(), USGovernmentBond())

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```

```
Miletus.YieldModel{Miletus.TermStructure.ConstantYieldCurve,Miletus.DayCounts.ModFollowing,BusinessDays.

USGovernmentBond}(Miletus.TermStructure.ConstantYieldCurve(Miletus.DayCounts.Actual360(),0.1,:

Continuous,-1,2017-02-09),Miletus.DayCounts.ModFollowing(),BusinessDays.USGovernmentBond())

value(ym,cpb)
```

100.92417167207167USD

4.3 Asian Option pricing

Asian options are structures whose payoff depends on the average price of an underlying security over a specific period of time, not just the price of the underlying at maturity. To price an Asian option, we will make use of a Monte Carlo pricing model, as well as a contract that considers a MovingAveragePrice

```
using Miletus
using Gadfly
using Colors

d1 = Dates.today()
d2 = d1 + Dates.Day(120)
```

Structing the model without currency units

```
m = GeomBMModel(d1, 100.00, 0.05, 0.0, 0.3)
mcm = montecarlo(m, d1:d2, 100_000)
```

Miletus.MonteCarloModel{Miletus.CoreModel{Float64, Miletus.TermStructure.ConstantYieldCurve, Miletus.

TermStructure.ConstantYieldCurve}, StepRange{Date, Base.Dates.Day}, Float64} (Miletus.CoreModel{Float64, Miletus.TermStructure.ConstantYieldCurve, Miletus.TermStructure.ConstantYieldCurve} (100.0, Miletus.

TermStructure.ConstantYieldCurve(Miletus.DayCounts.Actual365(), 0.05,:Continuous, -1,2017-02-09),

Miletus.TermStructure.ConstantYieldCurve(Miletus.DayCounts.Actual365(), 0.0,:Continuous, -1,2017-02-09)),2017-02-09:1 day:2017-06-09,[100.0 100.665 ... 118.557 119.593; 100.0 99.409 ... 88.9926 89.6832; ...;

100.0 100.144 ... 84.2522 85.7512; 100.0 101.474 ... 148.781 146.818])

We can view the underlying simulation paths used for our Geometric Brownian Motion Model using Gadfly as follows:

```
theme=Theme(default_color=Colors.RGBA{Float32}(0.1, 0.1, 0.7, 0.1))
p = plot([layer(x=mcm.dates,y=mcm.paths[i,:],Geom.line,theme) for i = 1:200]...)
```

Now let's value a vanilla European call option using a Geometric Brownian Motion Model.

```
o = EuropeanCall(d2, SingleStock(), 100.00)
value(m, o)
```

7.644207157741412

And value that same vanilla European call using a Monte Carlo Model

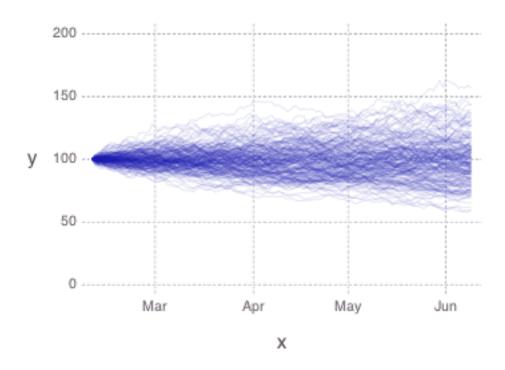


Figure 4.13:

```
value(mcm, o)
```

Next we construct a fixed strike Asian Call option. Note the MovingAveragePrice embedded in the definition.

```
| oa1 = AsianFixedStrikeCall(d2, SingleStock(), Dates.Month(1), 100.00)
```

```
value(mcm, oa1)
```

```
6.434610669797414
```

Similarly, we can construct a floating strike Asian Call option.