

# WEATHER DERIVATIVES

## 1. Description of Weather Derivatives

Most of the weather derivatives have their payoff based on Heating Degree Days (HDD) or CDD. The typical derivatives contract is illustrated by the following sample:

Option type: CALL

Underlying: Heating Degree Days

Contract period: November 1, 1999 – March 31, 2000

Met Office: Chicago/O'Hare Airport

Strike: 5000

Dollars per unit: \$10,000

Maximal payoff: \$2,000,000

Starting from November 1, 1999 the following pattern is repeated each day:

1. The maximum  $T_{max}(I)$  and the minimal  $T_{min}(I)$  today's temperatures at that particular Met Office are averaged and the average determines the weather for that particular day  $W(I)$ . It means that:  $W(I) = (T_{max}(I) + T_{min}(I)) / 2$
2. The next step is the calculation of the offset from 65°F. The HDD(I) calculation formula is the following:  $HDD(I) = \max\{65 - W(I), 0\}$ .  
Correspondingly, the formula for Cooling Degree Days CDD(I) calculation is the following:  $CDD(I) = \max\{W(I) - 65, 0\}$
3. After that the values of HDD(I) and CDD(I) are summarized for all days in the contract period, including the first and the last one, in our sample November 1, 1999 and March 31, 2000 respectively.  $Total = \sum(I = \text{November 1, 1999 to March 31, 2000}) [HDD(I)]$
4. The payoff can be calculated on the day following the expiration on April 1, 2000. The formula would be:  $Payout = \min(\text{Dollars per unit} * \max(\text{Total} - 5000, 0), \$2,000,000)$

## 2. Issues of Derivatives Price Calculation.

The methodology of weather options, futures and swaps pricing is described in Izzy Nelken's 'Weather Derivatives-Prices and Hedging'. Two different approaches to weather option pricing are introduced in that working paper, they are the so called 'Burn Analysis' and 'Model for Weather'. The first approach is widely used in the insurance industry and answers the following hypothetical question: what would have been the cost and payout of the same option, futures or swap each year over the last 50 years?

The following 6 steps have to be taken to answer it:

- 1) Historical weather data collection
- 2) Conversion of data into Degree Days
- 3) Making necessary corrections
- 4) Calculation of the implied option premium for each year in the period
- 5) Calculation of the average implied premium
- 6) Discount back to the settlement date

The second approach is based on direct weather modeling and consists of 7 steps:

- 1) Historical weather data collection
- 2) Making necessary corrections
- 3) Creation of a statistical weather model
- 4) Forecasting the weather in the future using the model
- 5) Calculation of the implied premium for each calculated weather data sample
- 6) Calculation of the average implied premium
- 7) Discount back to the settlement date

The shortcoming of the first approach is the lack of any analytical formulas that could significantly increase the potentialities of the analysis. The main concern for using the second approach is the 3rd step, indeed, the meteorologists are trying to work out an adequate long-term statistical model of weather for many years and, from what we know, this goal has not been achieved so far.

In our calculations we are using a hybrid approach, which is devoid of the above-mentioned shortcomings and our step-by-step algorithm looks as follows:

- 1) Historical weather data collection
- 2) Conversion of data into Degree Days
- 3) Calculation of HDD and CDD statistics for given periods
- 4) Selection of analytical distribution function of HDD and CDD, using open statistical methods of distribution function feed
- 5) Creation of a pricing formula for options, futures and swaps pricing for a selected analytical distribution function of HDD and CDD (like Black-Sholes formula for log-normal distribution)
- 6) Calculation of the price of the derivative using Monte-Carlo method, flexibly accounting for the nuances of the statistical distribution.

### 3. Simple Option Pricing

The simple methods of weather derivatives pricing can be achieved by using probability distribution feed from historical monthly HDD or CDD levels, and integration of the probability level multiplied by option's payoff. The expected payoff of CDD Call option or its theoretical value would be the following:

$$Pr = Dpu * e^{-rd*t} \int_{Str}^{CDD_{max}} (CDD - Str) * P(CDD) dCDD$$

Where:

Pr- expected payoff of CDD option;

Dpu- Dollars per unit;

rd- rate of interest;

t –time to expiration;

Str-strike;

CDDmax= Maximal payout/ Dpu+Str;

P(CDD)- frequency function.

The calculation of option's fair price requires collection of historical data of daily temperatures and use of statistical methods of feeding the distribution function from this data. In many cases the distribution functions of CDD and HDD can be approximated using normal Gauss distribution. In such cases, the frequency function depends on the two main factors: the average value of mu and the standard deviation of sigma, and can be calculated using the following formula:

$$GS(x) = \frac{1}{\sqrt{2\pi}} e^{-\frac{1}{2}(x)^2}$$

$$P(CDD) = \frac{1}{\sigma} GS\left(\frac{CDD - \mu}{\sigma}\right)$$

For Gauss distribution, the expected payoff of a CDD Call option will be the following:

$$u_{\max} = \frac{CDD_{\max} - \mu}{\sigma}$$

$$u_{\text{strike}} = \frac{\text{Strike} - \mu}{\sigma}$$

$$Pr = Dpu * e^{-rd * t} (\sigma * (GS(u_{\text{strike}}) - GS(u_{\max})) + (\mu - \text{Strike}) * (Lp(u_{\max}) - Lp(u_{\text{strike}})))$$

$$Lp(u) = \int_{-\infty}^u GS(x) dx$$

Generally, the expected payoff of CDD (HDD) Call (Put) options is a function with the following parameters: tstart(period start date),tend(period end date),rd,Dpu,MaxPay, Strike ,mu,sigma, IsCall and can be calculated as below:

If IsCall=1(Call) then

theta=1

a=Strike

b= MaxPay/ Dpu+ Strike

If IsCall=0(Put) then

theta=-1

a=Strike- MaxPay/ Dpu

b= Strike

ub=(b-mu)/sigma

uf=(a-mu)/sigma

PrCP=Dpu\*exp(-rd\*(tend-tstart))\*theta\*(sigma\*(GS(ub)- GS(ua)))+(mu-Strike)\*(Lp(ub)- Lp(ua))

## 4. Retrieval of Function's Inputs

The determinative factor for the above-mentioned option pricing method is the retrieval of the relevant levels of average and standard deviation.Which time sample should we choose to assess the parameters? Should we use last 10 years or 20 or even 50? The problem is that the climate is not stationary and the requisite values of average and standard deviation change with time. Castlebridge LLC usually takes 10 years for average and 30 years for standard deviations. In any case, the inputs for the function are the annual levels of CDD (HDD) for the period from tstart to tend.

## 5. Monte Carlo Method

If daily CDD (HDD) statistics is taken as benchmark data, then it is possible to use Monte-Carlo method for calculation of CDD (HDD) payoff. Provisionally, the average of daily values of mudays(I) and standard deviations of sigmadays(I) of CDD (HDD) for each given period are calculated, where  $I=1,2,\dots,D$ ; D-number of days in period. If we make an assumption that the daily parameters have Gauss distribution and all observations are independent, then we can model the process of CDD (HDD) fluctuation N times (~1000), calculate the fair option price for each level, and compute the fair option value by averaging the results. The assumption about the independence of observation can be waived if the covariance matrix of temperature distribution by days is calculated and used to generate random vectors for CDD(HDD)(I) in the above calculations.

## 6. Excel Functions For Weather Derivatives Pricing

The two methods of weather option and futures price calculation described above are displayed in C:\MARK\weatherder.xls.

There are 11 functions that serve this purpose:

1. **PriceBasket** - this function calculates the price of a futures or basket option for nstn Met Stations using the end formula, derived under condition that CDD (HDD) are normally distributed. In case of nstn=1 the function simply calculates the price of an option or a futures.
2. **PriceMCBasket** - the function returns the price of a futures or a basket option for nstn Met Stations using Monte-Carlo method. In case of nstn=1 the function simply calculates the price of an option or a futures.
3. **PriceFut** - the function calculates the futures' price for one Met Station using the end formula, derived under condition that CDD (HDD) are normally distributed.
4. **PriceOpt** - the function returns the option's price for one Met Station using the end formula, derived under condition that CDD (HDD) are normally distributed and known distribution factors (expected value and dispersion)
5. **PriceMCFut** - the function calculates the futures' price for one Met Station using Monte-Carlo method with known distribution factors (expected value and dispersion) and normal distribution of CDD (HDD).
6. **PriceMCOpt** - the function returns the option's price for one Met Station using Monte-Carlo method with known distribution factors (expected value and dispersion) and normal distribution of CDD (HDD).
7. **CorrStn** - this subroutine calculates the correlation matrix for the Met Stations that form the basket.
8. **StatDailyCovNew** - this subroutine calculates the expected value and dispersion of CDD (HDD) distribution for each day of observation and the sum of CDD (HDD) parameters for all days.
9. **Normval** - this function returns the Gauss random value with given expected value and dispersion.
10. **Lp** - the function calculates the value of Laplace function.
11. **Nordis** - the function calculates the density function of normal (Gauss) distribution