Energy, variability and weather finance engineering

D. Roussis, I. Parara, P. Gournari, Y. Moustakis, P. Dimitriadis, T. Iliopoulou, D. Koutsoyiannis and G. Karakatsanis Department of Water Resources and Environmental Engineering, School of Civil Engineering National Technical University of Athens (NTUA), Heroon Polytechniou 9, 15870 Zografou, Greece



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Renewable energy and environmental systems: modelling, control and management for a sustainable future

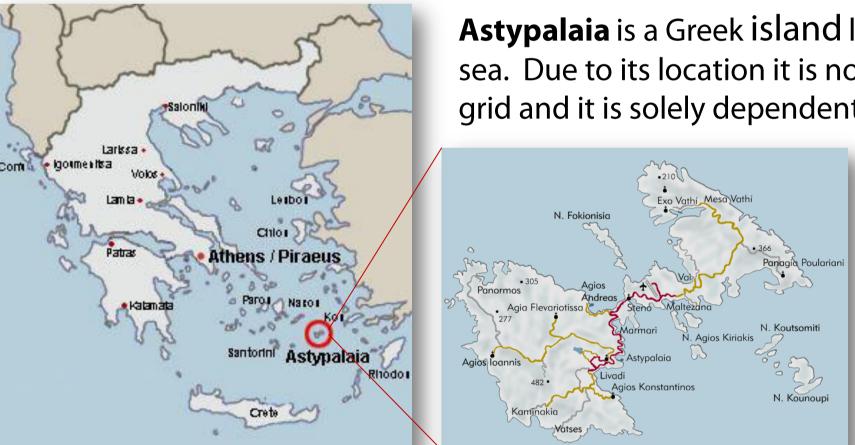
Project Description:

Many remote islands in Greece are not connected to the mainland energy grid and thus **fully** dependent on oil fired electricity generation in order to meet their energy demands [Friedrich & Lavidas, 2015]. The fossil fuels needed are imported and subsequently, the remote islands are **exposed** both to the international prices of oil and the extra margin imposed by the local suppliers. Difficulties lie along the costly transition to renewable sources of energy such as the present dependence on oil and the low predictability (or high variability) of hydrometeorological variables (e.g. rainfall, wind speed, temperature). Weather derivatives comprise mature financial tools which can safeguard against frequent hydrometeorological risks of low or medium impact, not covered by standard insurance contracts. In this context, we study the case of Astypalaia, a remote island in the area of South Aegean sea, facing all the aforementioned difficulties. In order to tackle these difficulties, we set a simple framework on the governing existing conditions and the potential use of weather derivatives as efficient tools in reducing the marginal price imposed by the local oil supplier, as it is constituted by factors such as the local **temperature** and the expected impact of tourism on the energy demand. Finally, we test the possible outcomes for both the public administration of the municipality of Astypalaia and the financial institution issuing the weather derivatives.

Contribution of the project

This project is part of a general attempt of the School of Civil Engineering, NTUA, focused on the **transition** from carbon-based energy to sustainable renewable forms in the case-study of Astypalaia. However, the transition is a costly process and the economic sustainability of renewable sources of energy is subject to the **fluctuations** of hydrometeorological variables. Even though the framework we set is simple, it is evident that weather derivatives have significant use in **integrating** the intermittent-load and base-load components of renewable energy sources into a **unified hybrid energy system**. Such energy systems could completely substitute the current ones which are heavily dependent on fossil fuels.

1. The case-study of Astypalaia



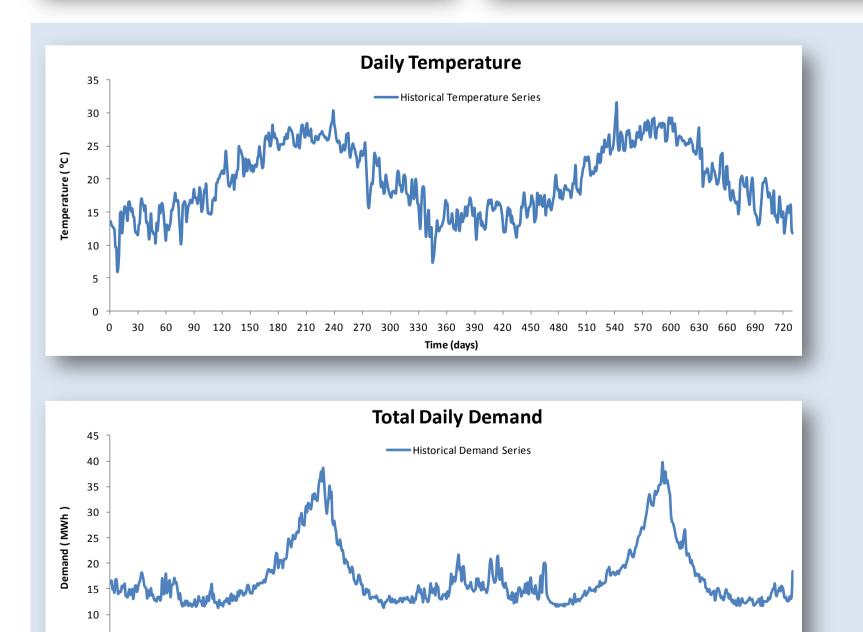
Astypalaia is a Greek island located in the southeastern Aegean sea. Due to its location it is not connected to the national power grid and it is solely dependent on oil fired electricity generation.



Capital: Chora

Population: 1334 residents

Area: 97 km²



Data Observations:

Generally, it appears that the increase in population due to tourism is more strongly affecting demand than a higher temperature. For example, on 26 June 2014, the island had a peak average daily temperature of 31.4 °C and a total daily demand of 20.89 MWh. However, in the two following months, an even higher demand can be observed, even reaching approximately 40 MWhr, without a corresponding increase in temperature.

About the Authors

Dimitrios Roussis, Iliana Parara, Panagiota Gournari and Yiannis Moustakis, are undergraduate students at the School of Civil Engineering of the National Technical University of Athens (NTUA)

Georgios Karakatsanis, Panayiotis Dimitriadis and Theano Iliopoulou, are PhD Candidates at the Department of Water Resources and Environmental Engineering of the National Technical University of Athens (NTUA).

Demetris Koutsoyiannis, is the dean of the School of Civil Engineering of the National Technical University of Athens (NTUA) and professor of Hydrology and Analysis of Hydrosystems.

Definitions and notations of weather finance

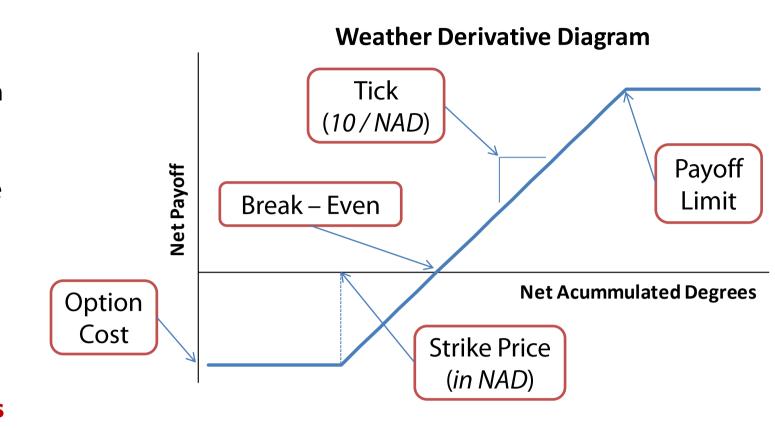
Weather Derivatives are financial tools that can be used by organizations or individuals as part of a risk management strategy to reduce the risk associated with adverse or unexpected weather conditions. Weather derivatives are index-based instruments that usually use observed weather data at a weather station

Option is a contract which gives the buyer (holder) the right, but not the obligation, to buy or sell an underlying asset or instrument at a specific strike price on a specified date. The seller has the corresponding obligation to fulfill the transaction – to sell or buy – if

to create an index on which a payoff can be based.

Weather Derivatives ≠ **Insurance contracts**

Insurance contracts cover <u>high risk – low probability</u> events, while weather derivatives cover low risk - high probability events.



Quantification measurement indices of weather derivatives

the buyer (owner) "exercises" the option.

So as to calculate the payoff of a weather derivative, we essentially need two indices: Accumulated HDDs/CDDs and the Strike Price of the contract. For each month period, we calculate the **Net Accumulated Degrees (NAD)** starting at day (i) by subtracting the degree index with the lower value.

$$HDD_i = \max(18.3 - T_i; 0)$$

$$H_{month} = \sum_{i=1}^{30} HDD$$

$$H_{month} = \sum_{i=1}^{30} HDD_i$$
 $C_{month} = \sum_{i=1}^{30} CDD_i$

The interests of each

The municipality of

Astypalaia is interested in

maximizing the rate of

potential payoff to the

total marginal value for

• The *financial institution*

is interested in fair-pricing

the options and having a

• The *local oil supplier* is

supplying the municipality

interested in covering

various expenses and

making a profit by

of Astypalaia.

guaranteed profit on

the duration of the

contract.

average.

counterpart:

$$CDD_i = \max(T_i - 18.3;0)$$

$$NAD_i = \max(H_{month} - C_{month}; C_{month} - H_{month})$$

Determining strike price values to be used for the calculation of payoffs

Accumulated HDDs and CDDs can be modelled as a log-normal distribution [Davis, 2001]. However, a normal distribution can be hypothesized to fit approximately [Harris, 2003]. The Strike Price (SP) is the minimum value of Net Accumulated Degrees for the contract to have any payoff at all. The resulting payoff is calculated assuming a *Tick*, which we assumed to have a constant value of 10 in the simulations.

$$Payoff_i = Tick \cdot \max(NAD_i - SP; 0)$$

Temperature vs Energy Demand 2014

Modelling the market and the marginal price of oil

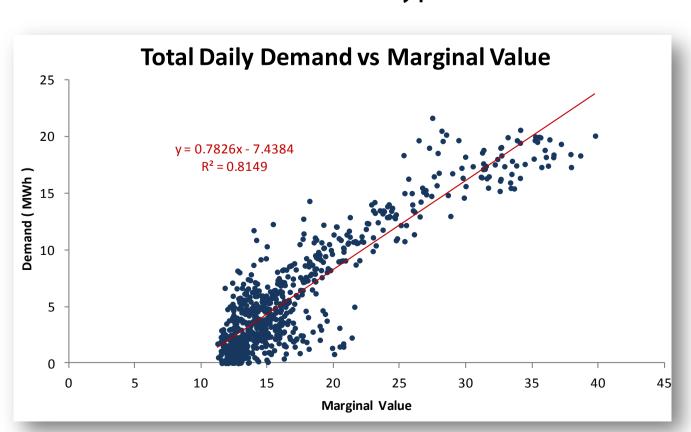
Assumptions:

- The international price of oil has an unpredictable behavior.
- The oil necessary for energy production cannot be supplied *directly* to the municipality of Astypalaia from the international market and therefore a local supplier is needed.
- Stable supply is assumed and therefore the local supplier charges an added marginal value.

§ 1.6 Average Temperature (°C) **Daily Marginal Value**

In order to construct the marginal value model, the difference between the average daily temperature and the **optimal comfort temperature** ($18.3^{\circ}C$) is taken into account, as well as a *dummy variable* which corresponds to the increase in population of the island during tourist seasons and the analogous increase in energy demand. Thus, the constructed model of the marginal value <u>must</u> be closely correlated to the energy demand an it seems there can be a linear equation between the two.

Construction of an added Marginal Value model:



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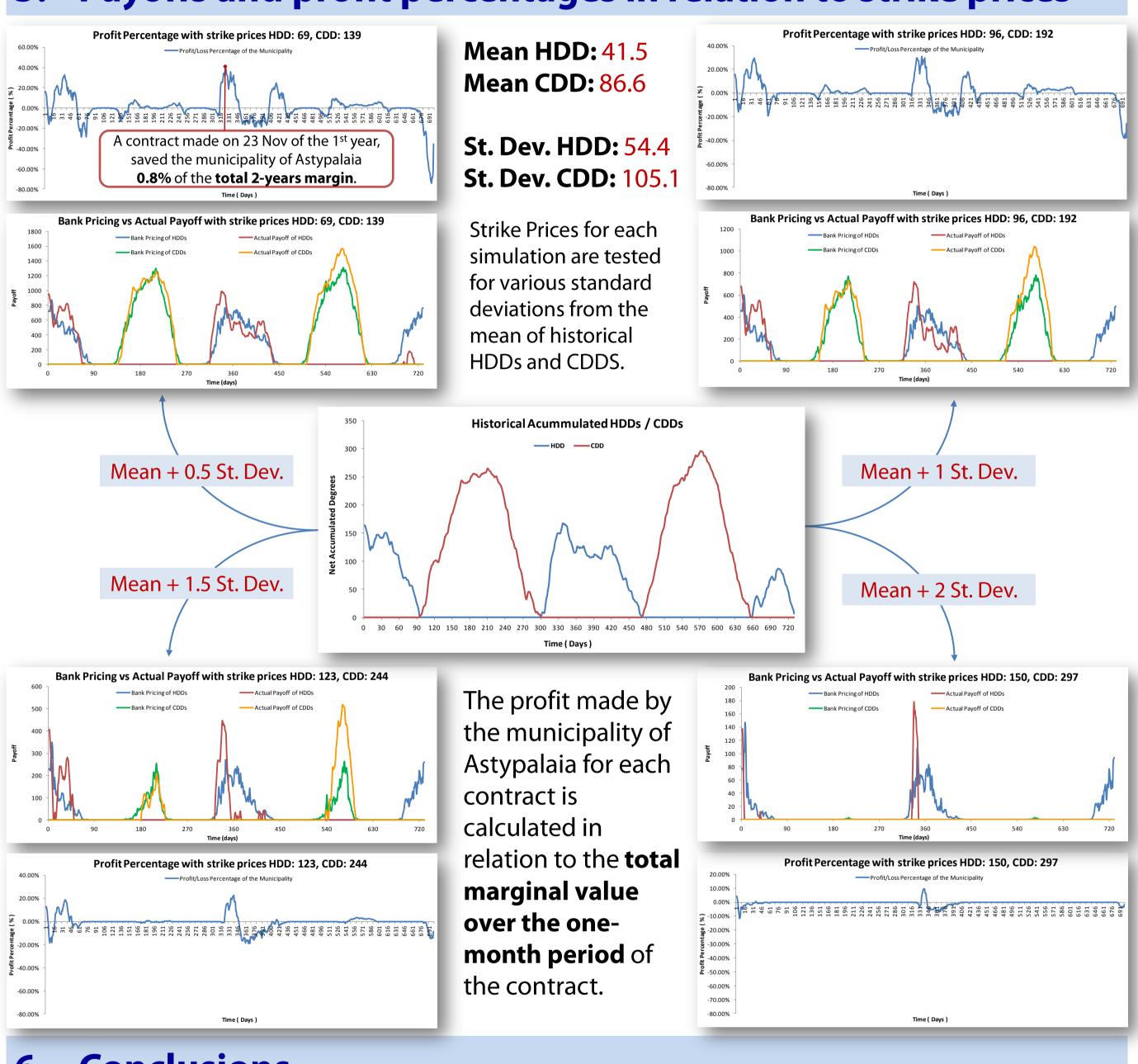
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Valuation of weather derivatives' expected payoffs

Assuming the municipality would obtain an option with a period of one month for each day of the two years, a pricing method is needed to determine if the expected payoff (cost of option) calculated by the financial institution corresponds with the actual payoff. The most common method for valuing derivatives is the Black-Scholes model. However, it is not suitable for use in pricing individual weather derivatives [Mircea & Cristina, 2012]. Instead, a Monte-Carlo simulation [Kung, 2010] was used as follows:

- 1. Starting at each day, sampled a random path for daily temperature, by using an AR(1) stochastic process over the one-month period of the contract.
- 2. Calculated the **Net Accumulated Degrees** from the simulated temperature.
- Calculated the payoff for each options contract, by setting **different strike prices**.
- 4. Repeated steps 1,2,3 to get many potential paths for the daily temperature and therefore possible payoffs.
- 5. Estimated the **expected payoff** for each day as the mean payoff of all samples.

5. Payoffs and profit percentages in relation to strike prices



Conclusions

- ✓ The derivatives were priced accurately in overall, but the financial institution was **exposed** to a considerable degree at the following approximate intervals:
 - 20 Jan 15 Feb of the 1st year • 15 Nov – 10 Dec of the 1st year
- 10 Feb 25 Feb of the 2nd year
- 5 Jul 30 Aug of the 2nd year
- ✓ Instead of utilizing a savings account based on a risk-free interest rate, the municipality of Astypalaia could actually achieve a larger profit by purchasing weather derivative contracts and particularly with HDDs as the underlying index, on the above intervals.
- ✓ The financial institution would prefer issuing **HDD-based** contracts over **CDD-based** ones. Also, it would not prefer to set particularly high strike prices.
- ✓ In our case-study, we can clearly see that as we increase the standard deviations used to determine the strike prices, weather derivatives become less useful as a financial tool for hedging the risk. In particular, the **exposure** of the financial institution **increases** and the percentage of **profit** made by the municipality of Astypalaia **decreases**.

Acknowledgments

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