RISK ASSESSMENT OF WIND POWER GENERATION PROJECT INVESTMENTS BASED ON REAL OPTIONS

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Abstract
This work presents an assessment model for investment in renewable power generation projects and its associated risk.

The first part presents a classic economic study whose objective is to determine the profitability of eolic energy power plants, calculating the energy productions and the price of the energy sold to the market in each case. The economic parameters used to determine the profit value of the installations have been: the Net Present Value (NPV), the payback and the Internal Rate of Return (IRR). The economic appraisal has been calculated on different settings, in which different values for significant variables have been considered in the study of the economic viability of the project.

In the second part, real options valuation methods for generation investment have been applied. The work goes deeper into the deferment option to calculate the premium that a company should pay to have the option to defer the investment. The idea is to compare this premium with the result obtained in a NPV classic analysis. The main idea is to insert the values obtained by NPV analysis in different periods into the option valuation tree. Thus, a classic approach to have a more realistic trinomial option tree can be used, as well as other tools like American real options or NPV curves. This makes risk management easier and more reliable. Several practical cases will be present in order to validate the model.

Keywords: investment assessment, risk management, real options, eolic electric generation, renewable energy

Resumen
En el presente artículo se expone el desarrollo de un modelo de valoración de inversiones en proyectos de generación eléctrica eólica y su riesgo asociado.

En una primera fase se acomete la valoración por métodos clásicos calculando la producción y los precios de venta al mercado eléctrico para niveles de producción equivalentes en distintos escenarios. Los parámetros económicos empleados para determinar la rentabilidad de la instalación han sido el Valor Actual Neto (VAN), el Plazo de Recuperación y la Tasa Interna de Rentabilidad (TIR).

A continuación, se realizan valoraciones en las mismas condiciones y con los mismos parámetros con un método de valoración basado en opciones reales (OR). Con este método se analizan distintas posibilidades (opciones) a acometer las distintas inversiones.

Es esta forma, y basándose en el método de OR (contrastado con el clásico), se obtiene una valoración de la conveniencia y del riesgo de acometer este tipo de inversiones utilizando...
herramientas tales como la curva del VAN, los árboles trinomiales de decisión o las opciones reales americanas. Como aplicación real del modelo se presentan distintos casos prácticos.

Palabras clave: valoración de inversiones, gestión del riesgo, opciones reales, generación eléctrica eólica, energías renovables

1. Introduction

The world is affected by the incessant demand increase of all types of energy, where prices of raw materials (oil in particular) are in a constant state of turmoil. Due to the instability of fossil fuel-based energy prices over the last years, the need to reduce dependence on conventional energy sources and to protect the environment has fomented the use of clean sources of energy.

Renewable energy sources have been supported and subsidized by different countries. Among them, wind energy seems to be the most successful in terms of market penetration. Increasing generation capacity in liberalized power markets requires the producers to account for future long-term uncertainties. In particular, for wind producers, the inherent intermittency of its energy production, especially due to the wind regime, makes it necessary to use stochastic models to decide upon future investments. Due to the considerable lifetime of these plants and the mentioned uncertainties, traditional discounted cash flow methods used to obtain the Net Present Value (NPV) of the investment are not suitable for these projects.

To take into account uncertainty, real options models can be used to develop flexible investment strategies. Depending on the present value in a certain time, the decision maker can decide to execute, wait, or abandon the construction project of a power plant.

2. Objectives

This work focuses on a detailed decision making tool to evaluate a project a wind power plant building project under uncertainty using the real options methodology.

First, the developed tool allows the investor to estimate future cash flows and NPVs derived from the construction of the plant and its future operation in the market. To obtain the cash flows there are several steps that are required. First, the wind speed is estimated by parameterization of a Weibull function; next, the production curve of the wind turbine produces the energy as a function of the wind speed. In addition, the electricity prices to remunerate the wind producer are modelled using Geometric Brownian Motion with Mean Reversion (GBM-MR). It's assumed that the wind generations are paid at the spot prices, but any incentive scheme can be easily added to the model. With all this, plus the investment cost estimation, the stochastic cash flows and NPVs are obtained. By shifting the initial time for investment, the model allows to estimate the NPV curves. These curves represent the evolution of the NPVs that would result if the investment were done at different times.

Secondly, the real options methodology is applied using the estimated parameters of the stochastic NPV curves. A trinomial investment decision tree is built, where the values of the parameters are only valid for specific time intervals, since a unique GBM-MR model only holds for prices (not NPVs) during the entire lifetime of the project. To evaluate the attractiveness of the investment, the American option of the project (that allows investing before the expiration of the option takes place) is formulated, as well as the probabilities of three possible alternatives: execute, wait, or abandon. In short, the real options method provides the investor with the capacity to evaluate the price of the option to invest in a project.
3. Document Structure

The remaining sections of the paper are organized as follows. Section 4 revises the current literature on real options applications to electricity, and, in particular, to generation investment and renewable energy. Section 5 introduces the concept of NPV curve and the piecewise estimation of its parameters and shows the effect of risk aversion in the model. Section 6 depicts the value of the real option to invest and the calculation of the probabilities to invest now, to wait or to abandon. Section 7 provides an illustrative example and several results, and Section 8 expounds the conclusions.

4. Literature Review

Distributed generation has become an important source of energy in liberalized electricity markets due to its benefits, such as loss reduction, deferment of grid investments and its ability to reduce emissions to comply with the Kyoto protocol (Ault et al, 2003). The impact of renewable energy is traditionally measured from the societal perspective and focuses on social welfare and other overall system benefits (El-Khattam et al, 2004). Another approach is to assume that the builder of a new wind plant wants to maximize its own profits and has to decide whether to build or not and when to do it. This requires careful evaluation of the financial aspects involved (Khatib, 1997) and adequate analytical decision tools are needed.

Real options analysis is widely used as a tool to help decision making in many fields [4, 5]. It is successfully applied both in operation and planning of power systems: i) to perform a generation asset valuation and ii) to find optimal timing for new generation investments under uncertainty.

As regard to the first application, the operation of a power plant can be studied from a generation asset perspective, where fuel and electricity prices are modeled using mean reverting processes (Tseng, 2000 and 2002). Financial option theory is used to value the plant using the concept of Value at Risk. Sophisticated models add operational constraints, as in (Deng and Oren, 2003), or define multi-stage stochastic models of the operational decisions, with two-factor lattices describing fuel and electricity prices, such as in (Tseng and Lin, 2007). Another multi-stage investment under market uncertainty model, where the authors use a stochastic process to estimate the power plant’s present value, is shown in (Correia et al, 2008).

Secondly, the problem of investment is addressed using the real options approach. In (Fleten and Näsäkkälä, 2003), spark spread and emission costs are used to value a gas-fired plant. The same authors study the upgrade of a base-load plant in (Näsäkkälä and Fleten, 2003) into a peak-load plant. The evaluation of an investment for two inter-related plant projects is described in (Wang and Min, 2006), where a quadrinomial tree represents the market value of the units. In (Fleten et al, 2007), a real options method to evaluate investments in renewable generation, including wind generation, makes extensive use of price volatility to decide upon investment timing. In addition, the NPV break-even price is determined under price uncertainty.

5. NPV Curve and its Piecewise Parameter Estimation. Risk Profile Characterization

5.1. NPV curve calculation

In this work it is assumed that the income resulting from the energy produced is the product of two stochastic processes: the energy produced represented by a GBM-MR model. The price is estimated for a period of more than 1 year, since the NPV calculation requires long periods.

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The model could also be enriched by using long-term contract values, but this is outside the scope of this paper.

The yearly cash flows resulting from the income model, subtracting the investment, maintenance costs, depreciation and interests, and applying corporate taxes, can be used to estimate the NPV of the wind investment. This is the standard calculation of the value of an investment used in Economics and Finance textbooks. However, a more interesting approach is to study the evolution of the NPV for long periods of time. The NPV curve represents the construction of the trajectory of the resulting NPVs when the investment takes place at successive times, updating the investment costs and cash flow values to the corresponding reference periods. In this paper, the NPV curve is calculated on a monthly basis and the annual value corresponds to the average value of the 12 months. Fig. 1 presents an example of how to obtain the different NPVs and Fig. 2 shows the resulting NPV curve.
5.2. NPV curve piecewise parameter estimation

It is possible to characterize the stochastic process that represents the NPV using GBM-MR estimation models. However, as mentioned in the introduction, it cannot be assumed that a NPV curve follows a GBM-MR process with constant parameters. The values of the parameters change, in particular $\phi$ and $\lambda$, with the $\sigma$ parameter remaining approximately constant showing a slightly increasing trend. To solve this problem, the estimation of the parameters is done piecewise. In this way, the matrices are created with the information of each of the processes in a piecewise fashion so that the parameters, $\phi$ and $\lambda$, are optimally adjusted to the actual trajectory. Fig. 3 shows the piecewise estimation of the parameters of the NPV curves.

![Fig. 3. Piecewise estimation of the NPV curve parameters.](image)

On the other hand, due to the stochasticity of the model and, in order to obtain estimators as accurate as possible, many paths are needed to calculate representative values of the estimated parameters. This is done by means of Monte Carlo simulation.

5.3. Risk profile characterization

To compare the risk involved in a wind plant investment with the yield derived from a risk-free asset, a new parameter $r$ is introduced. This parameter, that expresses the return that can be obtained investing in an risk-free asset (Treasury bonds), is now included in the model combined with the average long-term parameter $\phi$. In this way, the evolution trend of the estimated value of the NPV curve is corrected as a function of the risk aversion of the investor. This means that the more averse the investor, the more he will choose risk-free assets with lower yield; because of that, the correction to the model will be greater to achieve risk neutrality. Assuming that the risk-free asset yield is given by $\eta$ and that the expected yield is given by $\alpha = \lambda(\phi - \ln(x))$. Therefore, the
expected value of a risk-neutral investor is equal to $\delta = \eta - \alpha$. To evaluate the risk aversion of an investor, the difference between a risk-free yield and the expected value is obtained: $\tau - \delta$. As a consequence, the estimated average long-term parameter $\hat{\phi}$ becomes $\hat{\phi} = \frac{\eta - \tau}{\lambda}$.

6. Calculation of the value of a Real Option and its probabilities

To calculate the value of an option from a tree (binomial, trinomial, etc.) that is already built for a specific process, it is necessary to subtract the project investment cost from the NPV of the project once the last period is reached.

Once the investment costs are discounted from the NPV in the last period, the real option tree is built backwards up to the initial node. Mathematically this can be modelled by dynamic programming.

The possibility to exercise an American option is available at any time at each node, unlike the European option, that only depends on the values of previous nodes and their associated probabilities. The value of the option is the maximum of three possible choices: invest now (a), wait (b), or abandon (c), as shown in Fig. 4.

$V_{node(i,j)} = \max(a; b; c)$

a) $NPV_{(i,j)} - Investment_{(i)}$

b) $NPV_{(i+1,j+1)} \cdot P_{u(i,j)} + NPV_{(i+1,j)} \cdot P_{m(i,j)} + NPV_{(i+1,j-1)} \cdot P_{d(i,j)}$

c) 0

Fig. 4. Valuation of an American option to invest.

Fig. 5 shows graphically the three different alternatives: exercise the option, wait, and abandon. It also depicts the probability distribution of each alternative throughout the life of the real option. The probability to exercise the option is marked in red, the waiting option in green, and the abandoning option in black. The visual check corresponding to the sum of the three probabilities is marked in blue.

In parallel to the construction of the real options decision tree there must be an estimation of the probability of each possible investment situation. Due to the probability distribution of the nodes, the central zone of the tree has the highest weight in the estimation.
7. Case Studies

This section contains several case studies where the investment model described before is applied. A sensitivity analysis is applied with respect to key parameters of the model. The base case assumes a wind farm of 10 MW, composed of 5 generators of 2 MW each. The parameters are as follows:

**General parameters:**
- NPV calculation period: 20 years.
- Estimation period for the cash flows: 40 years.
- Duration of the steps of the models: For the wind the step is 1 h and for the energy produced, cash flows and NPV curves is 1 month.
- NPV discount rate: 7%.
- Number of trajectories of the Monte Carlo simulation: 200.

**Wind parameters:**
- Shape factor: $k_w = 1.8$, indicates the dispersion with respect to the average value of the wind speed.
- Scale factor: $\lambda_w = 5.3$, indicates the average value of the wind speed in a certain location.

**Production parameters:**
- Maximum power: 10 MW.
Minimum, Rotor and Maximum rotor speed: 4, 11 and 25 m/s.

**Electricity price parameters:**
- Initial price: €60 MWh, based upon OMEL data [17].
- Volatility: $\sigma = 0.05$.
- Adjustment speed: $\lambda = 0.05$.
- Annual increase of the price trend: 7% annual.
- Trend: with $\phi = \ln\left(c_0 \cdot (1 + s)^{\alpha \cdot t}\right)$, the base value is 16.95.

**Risk parameters:**
- Estimated expected yield: 10%.
- Risk-free asset yield: 5%, i.e., Treasury bonds.

**Investment parameters:**
- Price of the kW installed: €1,000 kW.
- Price increase: 7% annual.

### 7.1. Case study 1: Parameterization of the project financing percentage

This first case study studies the effect produced in the model by changing the external financing % of the required investment. The base value of the financing parameter is 80% to mimic what is already in use in Spain (see [18]). The parameter values oscillate between 0 and 100% of external financing, applying a 10% increase for each of the 11 scenarios analyzed. To solve this case study there are 4 steps to follow:

**Step 1:** Construction of the NPV curves: Fig. 6 shows the evolution of the NPV curves for each of the scenarios for a period of 20 years. It can be observed that the curves that represent the evolution of the shareholders’ equity increase linearly. In the NPV curve of scenario 1 the percentage is 100%, so there is no need for equity, but at the other extreme, scenario 11, the percentage is 0%, where the investment and the equity are the same.

![NPV curves for each scenario.](image)

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Step 2: Estimation of the GBM-MR parameters: From the different NPV curves the parameters of their piecewise GBM-MR associated parameters are obtained. According to the speed of change of the NPV curves, the optimal number of blocks whose parameters remain constant is found. See Fig. 3.

Step 3: Construction of the trinomial trees for the real options: Once tested that the parameters fit with the original data the different values of the American option to invest are calculated. Fig. 7 shows their values for a specific NPV curve: wait, execute or abandon. In the figure, the first scenarios, in which the % of external financing is high, the “invest now” alternative is present throughout the entire lifetime (20 years). When the external financing decreases, there is more need of equity and the “wait” alternative has more weight. Finally, the “abandon” alternative only shows up in scenarios with more equity and in the latest moments of the lifetime.

Fig. 7. Probabilities of the alternatives for each scenario.

Step 4: Calculation of the option to invest: As a result of the above calculations, the value of the real option is attained. As observed in Fig. 8, more equity implies that the “invest now” alternative loses value, up to scenarios where the value of the option is zero, therefore, an investment is not advised.

Fig. 8. Real option values to invest for each scenario.

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These results can be easily compared to the ones resulting from a more traditional analysis. In particular, a classic investment valuation method would estimate the value of the NPV at the beginning of the lifetime (year 0) and depending on its value would decide to invest or not. Fig. 9 shows how these NPV values correspond to the first point of the NPV curves. For this case, it’s observed that in the initial scenarios, up to the seventh, the NPV is above the equity and, little by little, the difference is diminishing until it becomes negative in scenario 8.

![Fig. 9. Initial NPV vs. equity.](image)

As a conclusion for this case, the “invest now” alternative is present from the beginning of the option in all scenarios except the last ones.
Table 1 presents the descriptions of all the cases developed in this work.

<table>
<thead>
<tr>
<th>CASE</th>
<th>PARAMETERS</th>
<th>RANGE (STEP)</th>
</tr>
</thead>
<tbody>
<tr>
<td>1</td>
<td>Project Financing</td>
<td>0 to 100% (10)</td>
</tr>
<tr>
<td>2</td>
<td>Investment Cost (100% of Equity)</td>
<td>750 to 1250 €/kW (50)</td>
</tr>
<tr>
<td>3</td>
<td>Investment Cost (50% of Equity)</td>
<td>750 to 1250 €/kW (50)</td>
</tr>
<tr>
<td>4</td>
<td>Annual Investment Cost Rise</td>
<td>5 to 10% (0,5)</td>
</tr>
<tr>
<td>5</td>
<td>Risk Aversion</td>
<td>0 to 10% (1)</td>
</tr>
<tr>
<td>6</td>
<td>Spot Price Volatility</td>
<td>0 to 0,01 (0,001)</td>
</tr>
<tr>
<td>7</td>
<td>Spot Price Trend (annual increase)</td>
<td>5 to 10% (0,5)</td>
</tr>
<tr>
<td>8</td>
<td>Spot Prices’ Strength of Reversion</td>
<td>0,025 to 0,075 (0,005)</td>
</tr>
<tr>
<td>9</td>
<td>Wind Speed’s Shape Parameter</td>
<td>1,5 to 2,5 (0,1)</td>
</tr>
<tr>
<td>10</td>
<td>Wind Speed’s Scale Parameter</td>
<td>5 to 6 (0,1)</td>
</tr>
</tbody>
</table>

Table 1 Case Studies Results

8. Conclusions

This paper has developed a model to evaluate wind energy investments based on two concepts: a stochastic model of the parameters that affect the NPV, such as wind production and electricity prices, and a real options model derived from a trinomial tree that evaluates numerically the probabilities to invest now, wait or abandon. The hypothesis of GBM-MR model that is applied to the prices is valid for the NPV, as long as the parameters are estimated piecewise.

A new concept, the NPV curve, which is made up of points that correspond to the values of the NPV at different successive times, is introduced and compared to the traditional NPV method. Several case studies, where the most important parameters have a variable range, are analyzed to illustrate the applicability of the method proposed.

As regards the risk valuation, the model does not explicitly produce a specific risk associated with the investment, but adapts the results as a function of the risk aversion profile of the investor.

With regard to the real options model used, it’s a versatile tool that allows:

- Numerical valuation of the alternatives to undertake a project.
- Estimation of the best time within the project’s lifetime to execute the investment seeking the maximum profit.
- Estimation of the probability that a specific future scenario takes place.

In relation to the results of the cases, the following conclusions can be extracted:

- It’s necessary to have at least a 40% project financing. Below this value, the project lacks interest, i.e., profitability.
As long as the minimum project financing requirement is fulfilled, the project will be possible if the price of the kW installed is less than € 1100.

Due to the integration that takes place in the calculation of the NPV curves, the annual investment cost rise has a small effect for parameter values close to the base value, 7%. From this value onwards the increments are clearly reflected on the result reaching the option value of M€ 3.5.

The variation in the option price is almost linear with respect to the risk aversion. For high risk aversion values (risk-free parameter between 0 and 3%) the "abandon" alternative is shifted to the middle of the option lifetime (10 years). For low risk aversion values (risk-free parameter between 7 and 10%) the "abandon" alternative does not take place until the end of the option lifetime.

In relation to the spot price, its volatility does not affect the results significantly, due to the aforementioned integration effect. However, an increase in the spot price trend or the strength of reversion has considerable effects reaching the option value higher than M€ 8. On the contrary, due to the great sensibility of the model to these two parameters, for increases in the spot price trend below 6% or strength of reversion below 0.04, the project is not profitable.

Finally, referring to the wind speed, the shape and scale parameters have opposite effects. When the shape parameter increases, the dispersion of the wind speed decreases, and the value of the option decreases up to zero for parameter values higher than 2.2. If the scale parameter increases, the profitability of the project increases. In spite of this, due to the extreme sensitivity to this parameter, for parameter values below the base value, 5.3, the profitability is highly reduced.

References


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