

## Investment in Wind Power & Pumped Storage in a Real Options Model – A Policy Analysis

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**Abstract:** Promoting renewable energy has been a key ingredient in energy policy seeking to de-carbonize the energy mix and will continue to do so in the future given the European Union's high ambitions to further curb carbon emissions. A wide range of instruments has been suggested and implemented in various countries of the EU. A prominent policy promoting investment in renewable technologies is the use of feed-in tariffs, which has worked well at large scale in e.g. Germany, but which has only been implemented in a very limited way in countries such as the UK. Being subject to environmental uncertainties, however, renewables cannot be seen in isolation: while renewables-based technologies such as wind and solar energy, for example, suffer from uncertain loads depending on environmental conditions, hydropower allows for the storage of water for release at peak prices, which can be treated as a premium (partially) offsetting higher upfront investment costs. In addition, electricity prices will respond to changes in electric capacity in the market, which is often neglected in standard investment models of the electricity sector. This paper contributes to the existing literature of real options approaches to electricity investment by investigating the specific characteristics of renewables and their associated uncertainties in a stylized setting taking explicitly into account market effects of investment decisions. The prices of the model are determined endogenously by the supply of electricity in the market and by exogenous electricity price uncertainty. The inclusion of market effects allows us to capture the full impact of public incentives for companies to invest into particular technologies.

**Keywords:** Real Options, Energy policy, Renewables, Market effects.

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### 1. Introduction

According to the International Energy Agency (e.g. [1]), Norway's electricity production is almost exclusively based on hydropower. However, the potentials for large-scale hydropower has been almost exhausted over the past and in the pursuit of meeting emission reduction goals without compromising the security of energy supply, the Norwegian government has been promoting other renewable energy sources such as hydro- and wind power. The latter is particularly attractive for Norway, as it enjoys both high wind speeds and a long coast line.

Within the European Union the most common policy to encourage the installation of renewable capacity has been feed-in tariffs to date. This works such that producers receive a fixed price for the supplied electricity, which exceeds expected market prices. Often these tariffs decrease over time. The policy for the promotion of Norwegian wind power has been an investment subsidy before the project has started. Even though it had been planned to – jointly with Sweden - introduce a market arrangement for electricity certificates to substitute for these investment subsidies from 2007 on, these plans had to be postponed until after 2010. Under this arrangement, as outlined in [2] consumers will have to buy a certain amount of certificates for their electricity bought and eligible power plants will yield certificates for the electricity producers which can be sold. Policymakers then decide upon the type of electricity production, which should be eligible, and on the respective amount of certificates. This way the countries can exploit the renewable resources and distribute the burden on the producers in the most efficient way and the aggregate quota will thus be attained at a lower total cost compared to feed-in tariffs or quotas.

[3] use a real options approach taking into account the uncertainty from certificate price fluctuations to estimate the amount of new renewable capacity coming online under such a joint Swedish-Norwegian electricity certificate scheme. In this study, we want to focus on the current policy of investment subsidies. In addition to the policy context, another factor that we want to take into account in our analysis is the intermittency of wind power, which has tended to make it an unattractive option next to fossil-fuel-fired generation options [4]. In a related study, [5] explored how the integration of energy storage with individual wind turbines could smooth out the wind speed fluctuations. Their results for different types of wind conditions illustrated that short-term wind power fluctuations could be substantially reduced.

Several studies over the past few years have further looked into technologies to realize such benefits and pumped-storage wind-hydro plants, which use reservoirs to store water previously pumped up with wind power, have been found to be profitable under particular circumstances [6]. Especially on islands, where wind potentials are high, pumped-storage wind-hydro plants have been found to be a promising option, with larger islands offering potential for even more profitable investments, where wind-hydro could even serve as base-load (e.g. [7], [8]).<sup>1</sup> Finally, a number of ancillary benefits add to the attractiveness of the technology. These include, inter alia, that the stored water can in emergency cases be used for consumption, irrigation, and to fight fires, etc. Also, wind-hydro plants are almost carbon-free in terms of emissions. Finally, the wind-hydro plant can contribute substantially to grid stabilization by acting as a swing producer (consuming in off-peak times to pump up the water and generating during peak times). Most of the studies reviewed above have found that pumped-storage wind-hydro plants generally only become profitable at high electricity prices or significantly improved design and efficiency combined with high wind speeds. In this paper we want to explore the profitability of such a system both in Norway, but also in Germany considering the impact of uncertainty on investment decisions. Uncertainty emanates from two sources in our study: the development of the electricity price, which can additionally also be influenced by new capacity additions, and the intermittency of wind, which leads to a fluctuating load and thus uncertainty in profits. We therefore want to explore pumped-storage wind-hydro plants to stabilize profits from wind. While this might appear like an attractive solution for particular demonstration cases, it has to be kept in mind that such equipment is extremely costly and it is questionable whether the premium from profit stabilization would make up for this deficiency and whether therefore public funding should rather be directed at R&D targeted at cost reductions in the first place.

We adapt the real options model presented in [9] in order to capture all these elements to answer the research questions outlined above and apply it to the German and Norwegian market situations to get a picture of the profitability of pumped-storage wind-hydro plants in the respective countries. The model focuses on the plant and its operation and abstracts from problems of integrating wind power into the grid, which is why the results have to be interpreted with caution.

## **2. A Real Options Model for Wind Power Investment with Pumped Storage**

### **2.1. Model formulation**

In this section we formulate the model that will be used for the analysis in section 3. We study the profitability of the wind technology combined with pumped storage when compared

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<sup>1</sup> This is attractive for small and isolated electricity production systems, which does not apply to Norway.

to the standard wind farms. The investor tries to find the investment strategy that maximizes expected profits during the planning period. He can decide whether and when to construct new electricity generating capacities. There are two possible technologies available: a standard wind farm (referred to as wind) and wind combined with pumped storage (referred to as wind + hydro). The assumptions underlying the model formulation can be summarized as follows:

1. The decisions can be made only once a year, the planning period is finite ( $T$  years).
2. The total number of power plants that can be built is limited to  $n$ , where only one power plant can be built during one year.
3. The load factor of both technologies is assumed to be uncertain, which leads to the annual electricity production being uncertain. Therefore, the annual electricity supply of both technologies is assumed to be equal and is denoted by  $q_t^w$ , which is modeled in each year as an independent random variable with known distribution.
4. The supply of the investor is given by the maximum quantity as  $q_t^w(n_t^w + n_t^h)$ , where  $n_t^w, n_t^h$  denote the number of wind and wind + hydro power plants built by the investor prior to year  $t$  respectively. The aggregate supply  $Q_t$  in year  $t$  is given by

$$Q_t = Q_0 + Nq_t^w(n_t^w + n_t^h), \quad (1)$$

where  $Q_0$  is the quantity supplied by firms that do not invest during the planning period and the quantity produced by plants outside the planning period, i.e. which already existed in  $t=0$ .  $N$  is the multiplier of the new investment. This represents the assumption that the new investment in the market is of the same structure as the one chosen by the investor.

5. The electricity price in year  $t$  ( $P_t^e$ ) is assumed to depend both on income and demand in the current year and is subject to exogenous shocks, i.e.

$$P_t^e(Q_t, X_t) = Y_t^{-\varepsilon_i/\varepsilon_p} Q_t^{1/\varepsilon_p} X_t \quad (2)$$

where  $Y_t$  is the disposable income in year  $t$  and  $\varepsilon_i, \varepsilon_p$  denotes the income and price elasticity respectively.  $X_t$  is the exogenous shock, which is assumed to be an independent random variable with known distribution for each  $t$ .

6. As has been already explained in section 2.1, wind when combined with pumped storage is able to affect the timing of supply and thus to benefit from the price fluctuations within a year. Thus the average price of electricity per kWh sold by a wind + hydro combination is higher than that of a standard wind. This is represented in the model by the price premium  $p$ , which denotes the price increment in percentage of the yearly electricity average price at the market.
7. The capital costs are annualized, representing a situation where the overnight construction costs are covered by a loan with the annualized capital costs being the yearly installments of such a loan. The O&M costs depend not only on the number of the power plants of the individual technologies, but also on the electricity supply in the given year, Therefore the yearly costs  $c(n_t^w, n_t^h, q_t^w)$  of the investor are a function of  $n_t^w, n_t^h$  and  $q_t^w$ . The yearly income of the investor can be calculated as

$$\pi(n_t^w, n_t^h, q_t^w, X_t) = P_t^e(Q_t, X_t)q_t^w(n_t^w + (1+p)n_t^h) - c(n_t^h, n_t^w, q_t^w). \quad (4)$$

Under these assumptions the investor's problem can be formulated as

$$\begin{aligned}
 \max_{u_t^w, u_t^h} & E\left[\sum_{t=0}^{T-1} \frac{1}{(1+r)^t} \pi(n_t^w, n_t^h, q_t^w, X_t)\right] \\
 n_{t+1}^w &= n_t^w + u_t^w & t = 0, \dots, T-1 \\
 n_{t+1}^h &= n_t^h + u_t^h & t = 0, \dots, T-1 \\
 n_0^w &= 0, \quad n_0^h = 0 & \\
 n_t^w + n_t^h &\leq n, \quad u_t^w + u_t^h \leq 1, & t = 0, \dots, T-1 \\
 u_t^w &\in \{0,1\}, \quad u_t^h \in \{0,1\} & t = 0, \dots, T-1 \\
 q_t^w, X_t &- \text{random variables with known distribution} & t = 0, \dots, T-1
 \end{aligned} \tag{5}$$

where  $r$  is the subjective discount rate,  $n_t^w, n_t^h$  are the state variables,  $u_t^w, u_t^h$  the control variables that are binary and represent the decision of the investor to invest in year  $t$  into a wind/wind + hydro power plant respectively.

The resulting problem is a stochastic optimal control problem in discrete time with all the underlying variables being discrete in each time step. Thus it can be solved by recursive dynamic programming. The solution is then the optimal control in terms of feedback control telling the investor the optimal action for each time step and each possible state in that time.

To analyze the impact of the individual features of the model (impact of climate policy, wind load uncertainty), this output is further processed. In the results section, two indicators of the optimal control are usually reported: the mean amount of wind + hydro farms that are built within the planning period, and the value of the firm. The mean value of the firm is directly given by the value function in the first year that is derived by the dynamic programming. For the average number of wind + hydro plants, Monte Carlo simulations are used. Future load and price shocks are simulated and for each simulation the feedback optimal control is used to extract the decision realized in that simulation. These decisions are then used for the calculation of the average investment into wind. In addition, these can be used to calculate the sum of the discounted profits over the planning period in each simulation, which gives us a distribution of the value of the firm as well. For the application, the values of the individual parameters have to be estimated, the functional forms and the remaining data still have to be specified. This is explained more in detail in section 2.3.

## 2.2. Data

In our paper the investment decisions of the producers are exemplarily surveyed in the countries Germany and Norway. The producers can choose between a farm of wind power plants and a farm of wind power plants in combination with a hydro pump storage plant. Both investment opportunities are adjusted so that the maximum output per year is the same. Furthermore the ratio of the size of the wind farm respectively the combination of wind farm and hydro pump storage in Norway and Germany is equal to the ratio of the size of the two electricity markets ( $Q_0$ ). [9] calculate the optimal size of the pump storage plant in relation to the wind farm and derive the ratio of 1:3. We use this ratio together with their estimate for the electricity loss caused by the pump process in the hydro pump storage plant of 0.1128 to calculate the setting of the combination. The cost estimates we use are taken from the 2010 [10] and summarized in Table 2. To derive the costs in € rather than US\$, we used the exchange rate given in the IEA report [10] of 0.68 and the same measure (average exchange rate of 2008) for the translation of € into Norwegian Kroner at 8.22 (OECD, 2010 [11]).

Table 1 Cost Data

		Yearly production	Ann. Capital Costs / Plant	Variable Costs (O&M + Fuel + Permit expenses)
Wind	Germany	25,916.9 GWh/a	275.9 Mio. €a	24.90 €a
	Norway	6,120.5 GWh/a	535.8 Mio. NK/a	204.78 NK/a
Wind + Hydro	Germany	25,916.9 GWh/a	543.1 Mio. €a	32.08 €a
Pump Storage	Norway	6,120.5 GWh/a	1,054 Mio. NK/a	263.78 NK/a

Source: calculated from [10] IEA, 2010.

The load factor of the wind plants is assumed to be normally distributed around a mean of 23% (according to [11]) with a standard deviation of 6% (as estimated for Europe in [12]). There is a huge amount of literature estimating the demand and its elasticity for electricity. Two often cited survey articles in this stream are Dahl (1993, [13]) and Espey and Espey (2004, [14]). Together they analyze some 84 articles with estimations of the elasticity for electricity. For modelling our price process, we rely on the basic model to keep the analysis transparent. The elasticities are thus estimated as follows:

$$\ln Q_t = \varepsilon_p \ln P_t^e + \varepsilon_i \ln Y_t + x_t \quad (6)$$

with  $x_t$  denoting the error term. The articles also calculate mean values of the estimates found in the analyzed articles for equation (6). The authors report an interval with the mean price elasticity of demand  $\varepsilon_p$  at -0.80 and the mean income elasticity  $\varepsilon_i$  at 0.93. The estimations using the form in (6) exactly estimate the price process used in our model described given by equation (2). For the stochastic shock (error term in (6)) we assume a normal distribution with mean 1 and standard deviation of 0.2 (which is approximately the size of the variance of the error term when estimating equation (6) with our underlying data). We model the disposable income using a starting value  $Y_0$  from 2009 and the average annual growth rate  $y$  of the last 20 years (1990 – 2009). As the firm has no investments at time  $t=0$  we take the actual total gross electricity generation of 2009 as the original supply in the market  $Q_0$  and assume that respectively the big electricity producers of a country simultaneously take the same decisions. The data is summarized in Table 2.

Table 2 Price Process Data

	$Y_0$	$y$	$Q_0$	$N$
Germany	2,445.5 Bio. €	0.0288	577,380 GWh	4
Norway	2,264.3 Bio. NK	0.0389	136,353 GWh	5

Source: EUROSTAT (2010), OECD (2010) [11].

The considered planning period  $T$  is chosen as 30 years and following the standard assumptions in this stream of literature, we assume a discount rate  $r$  of 0.05. Each firm is allowed to invest a maximum of four times. Note from the data that the difference between the “Germany case” and the “Norway case” lies in two characteristics: the size of the market and the electricity price process (and the underlying parameters).

### 3. Model Results and Policy Analysis

#### 3.1. Price Premium

An investment into the combination of a wind farm and a hydro pump storage plant conveys the following characteristics: a) the (uncertain) output of the wind farm is the same as without the hydro pump storage, but b) the producer now has the opportunity to save some output if

the prices are low and sell the output plus the saved electricity if prices are high. Thus c) on average the producer earns a higher price per unit of output, i.e. he receives a price premium for having the opportunity to postpone the selling of current production. This premium has to outweigh the d) investment costs for the hydro plant, the variable (O&M) costs of running the hydro pump storage plant and the (small) loss of output through the storage process. Figure 1 shows the average number of investments into the combination at the end of the planning period for different levels of price premia. One can see that only with a price premium as high as 70% in Germany and 75% in Norway the combination gets relatively profitable and the producers invest into it at least once. To get the maximum average number of investments a premium of at least 115% would be needed in Germany and 150% in Norway. Such high differences in the average price per output unit cannot be realistic. E.g. [15] calculated the optimal operation and size of a wind-hydro power plant combination. They found the yearly average per unit profits of the combination to be 20.12% higher than the per unit profits of an equally sized wind farm. Thus, we can conclude that today the investment into a combination of a wind farm and a hydro pump storage plant without public support is not profitable for a producer compared to only investing into a wind farm.

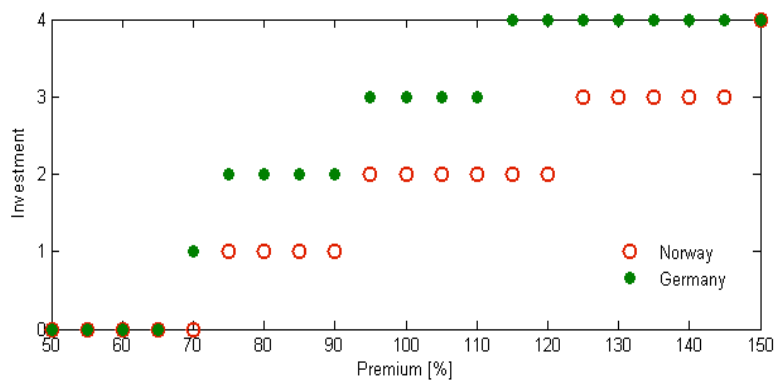


Figure 1: Average investments into wind-hydro at the end of the planning period for different levels of price premia

Two factors we do not consider in our study are grids and economies of scale. One can think of the additional costs surrounding the transmission of the electricity from the wind farm to the pump storage plant and back into the system as an increase in the variable costs of each produced unit. These costs are higher the farther the wind farm is away from the pump storage plant or in the periods (high-peak vs. low-peak) during which the electricity is transported. Thus, a large fraction of the literature shows that the combination is most profitable on small islands and could even serve as base-load on larger islands (see e.g. literature review in Anagnostopoulos and Papantonis (2007) [6]). In our framework, taking into account the costs grid adjustments would increase the threshold premium needed to make the combination relatively profitable. Economies of scale work in the other direction. So a bigger wind farm or e.g. an already existing bigger hydro pumped storage plant can produce the electricity at lower per unit costs, which will result in a lower threshold premium.

### 3.2. Investment Subsidy

Due to the positive externalities of the combination, i.e. for example stored water can in emergency cases be used for consumption and irrigation, etc, it makes sense for a country to support the investment into these combinations. E.g. Norway supports the investment into the combination by paying a subsidy on the investment costs before the project starts. This subsidy would need to be high enough to make up for the difference in the premium needed (as seen in the chapter before) and a realistic premium.

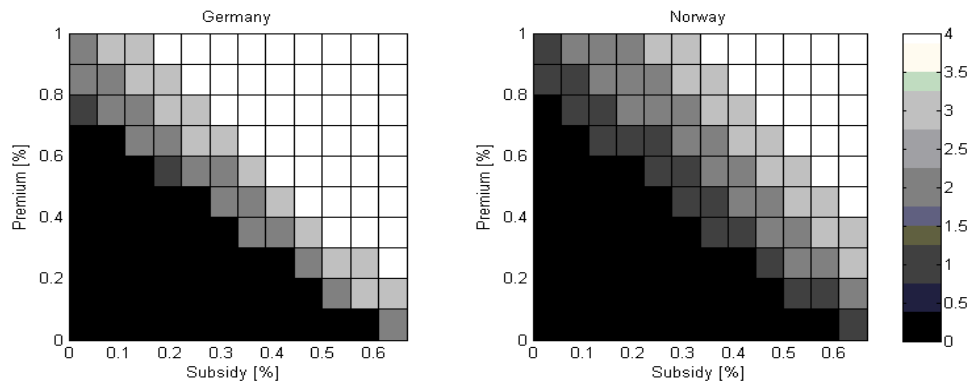


Figure 2: Average investments into wind-hydro at the end of the planning period for different levels of capital cost subsidies.

Figure 2 shows the average number of investments into the combination at the end of the planning period for different levels of capital cost subsidies. The different areas are shown for a variation of price premia between 0% and 100%. For realistic premia values (i.e. between 10% and 30%) the threshold subsidy to trigger at least one investment into the combination in Germany and Norway lies between 35% and 50%. To get the maximum average number of investments a subsidy of up to 70% in Germany and 90% in Norway would be needed. In general, one can see that the investment activity of the producers is much more sensitive to an increase in the subsidy in Germany than in Norway. This can be explained by the relatively higher threshold level needed to trigger investments in the Norwegian market, i.e. prices start relatively lower in Norway due to the relatively higher already installed capacity in  $t=0$  in Norway. Afterwards the follow-up investments happen later due to the higher number of big firms investing at the same time and the higher (in absolute terms) price level. Since in our framework we compared the investments into wind farms and the investments in a combination of wind power with hydro pump storage plants, the introduction of a likely Swedish-Norwegian tradable green certificates system, which would affect both types of plants symmetrically, would in general not change our results. The results would only change if policy makers would allocate different amounts of certificates to units of electricity produced by wind or water plants and categorize the electricity produced by the hydro pump storage plant as electricity generated by water rather than by wind. In that case the result in our framework would be a decreased (if the allocation is in favor of water; increased otherwise) threshold premia. Producers will earn an uncertain but positive additional amount per unit produced.

#### 4. Conclusion

This paper has presented a model for the economic evaluation of the adoption of a hybrid technology combining wind power and hydro pumped storage. We have chosen the market situation in Germany and Norway as case studies and explicitly accounted for uncertainty about the development of the electricity price and the market effects of new capacity additions, the intermittency of wind leading to a volatile load and the policy of an investment subsidy. While the stabilization of profits and its raise by a premium from being able to sell at peak prices might appear attractive, our study shows that without substantial public support the technology is not profitable and will not be adopted for realistic premia. If grid stabilization, CO<sub>2</sub> mitigation and other objectives than profit-maximization enter the objective, there is thus a case of intervention to promote this type of technology.

Apart from the conventional policy measures ranging from feed-in tariffs to investment subsidies, another important dimension recommended to policy makers for consideration is

the investment into R&D to decrease the costs and increase the efficiency of the technology in general. Rather than supporting investments today with relatively high costs compared to other green technologies, this can prove to lead to a faster diffusion of the technology at lower cost. Further research should also try and include factors that have not been considered explicitly in this analysis: grids, economies of scale and – in the case of Norway – the planned green certificate system.

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