

Online Optimization for the Smart (Micro) Grid

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Abstract: Growing environmental awareness and new government directives have set the stage for an increase in the fraction of energy supplied using renewable resources. The fast variation in renewable power, coupled with uncertainty in availability, emphasizes the need for algorithms for intelligent online generation scheduling. These algorithms should allow us to compensate for the renewable resource when it is not available and should also account for physical generator constraints. We apply and extend recent work in the field of online optimization to the scheduling of generators in smart (micro) grids and derive bounds on the performance of asymptotically good algorithms in terms of the generator parameters. We also design online algorithms that intelligently leverage available information about the future, such as predictions of wind intensity, and show that they can be used to guarantee near optimal performance under mild assumptions. This allows us to quantify the benefit of resources spent on prediction technologies and different generation sources in the smart grid. Finally, we empirically show how both classes of online algorithms, with or without the predictions of future availability, significantly outperform certain 'natural' algorithms.

Keywords: optimal, micro grids, algorithm, generation scheduling, optimization,

1. Introduction:

Growing environmental awareness and government directives have set the stage for an increase in the fraction of electricity supplied using renewable sources [1]. Distributed generation, especially solar and wind power, is gaining considerable importance and their deployment is perceived as vital in achieving carbon reduction goals [2]. Extracting the maximum value from a time-varying and intermittent renewable energy resource requires intelligent scheduling of both generation and loads. Intelligent

generation scheduling (involving unit commitment and economic dispatch), is the process of scheduling different generation sources to minimize cost while meeting physical constraints of the electricity system. It is a highly non-linear problem, and usually solved using genetic programming or other non-convex optimization techniques. Conventional economic dispatch, a very well-researched methodology, is typically conducted 24 hours in advance (of-line, day ahead) and uses the fact that the system load can be reasonably well predicted a day in advance. However, in a (micro) grid with high levels of wind penetration, this no longer holds due to the intermittent and unpredictable nature of wind power (which can only be reliably predicted a few minutes in advance). This introduces practical challenges such as the ramping constraints, which limit how fast a generation source can increase or decrease its output over successive steps. Thus, the need for designing techniques, with a firm theoretical basis and worst case guarantees, that enable

online generation scheduling subject to such physical constraints becomes very important, and our work is a major step in bridging this gap in literature. Recent advances in wind prediction further hope that a reduction in the uncertainty of wind availability will lead to an increase in its value. Online versions of generation scheduling have been studied recently. These algorithms, almost invariably, make assumptions regarding the stochastic nature of wind resources. For example, Xie and Ilic use Model Predictive Control (MPC) for economic dispatch, where a model is constructed that predicts future renewable availability (assuming that the availability arises from some stochastic process) and then this prediction is used for generator optimization. These methods are computationally complex but seem to be effective in practice. This raises some interesting questions that motivate this paper (i) Are there computationally simple algorithms that are still provably effective under non-stationary or arbitrary renewable availability? (ii) Can we build a theoretical basis for the success of these online and MPC based algorithms? (iii) Can we use the theory to design algorithms that optimally incorporate available information about the future? We address these issues in the context of intelligent online generator scheduling in microgrids with large, unpredictable.

1. We demonstrate how, even in the harsh scenario where no prediction of the future is available and wind availability is chosen in an arbitrary manner, recent advances in online convex optimization [3], can be fruitfully applied to generator scheduling in the next generation of smart (micro) grids. We also show how to exploit the special structure of the cost function for generator scheduling to obtain performance guarantees in terms of parameters governing the generation sources.
2. We describe online algorithms [4], that leverage information about the near future, such as prediction of wind availability and intensity more effectively. Interestingly, these algorithms use a strategy that discounts the future costs appropriately in order to prove guarantees on undiscounted future performance.
3. We extend the work in online optimization to prescribe computationally simple online algorithms that model practical constraints of the generation sources, such as ramping constraints and multiple generation sources.
4. We empirically show how both the classes of online algorithms, i.e. with or without lookahead, significantly outperform the existing 'natural' algorithms in the literature. For example, we show that discounting the future costs (perhaps counter-intuitively) can outperform algorithms with lookahead that do not discount the future. Thus, the theoretical techniques can be used to inform algorithm design. Our work conclusively establishes the value of the proposed online algorithms and their theoretical analysis for the smart grid. The results equip us with a

strong theoretical framework to quantify the benefits of resources spent on prediction technologies and multiple generation sources in the smart grid. While our algorithms can be used for both generator.

2. The experimental microgrid system:

The composition of the microgrid system is shown in Figure 1, along with a photo of the actual installation. It is a modular system, comprising a PV generator as the primary source of power. The addition of a small WT is also planned for the immediate future (it is expected to be connected and operating before the final paper is submitted). Both microsources are interfaced to the 1-phase AC bus via DC/AC PWM inverters. A battery bank is also included, interfaced to the AC system via a bi-directional PWM voltage source converter [5]. The microgrid is connected to the local LV grid, as shown in Figure 1.

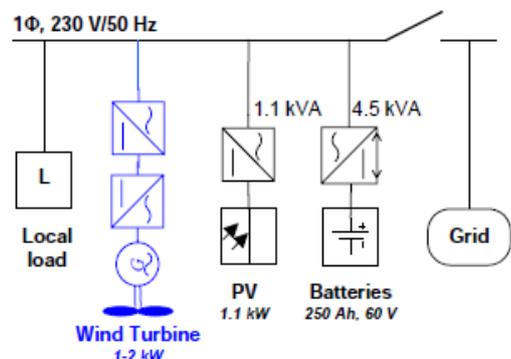


Figure 1: The laboratory microgrid system (WT extension planned for next semester)

The central component of the microgrid system is the battery inverter, which regulates the voltage and frequency when the system operates in island mode, taking over the control of active and reactive power. The battery unit power electronics interface, schematically illustrated in Figure 2, consists of a Cuk DC/DC converter and a voltage source PWM inverter, both bi-directional, permitting thus charging and discharging of the batteries. The DC/DC converter provides the constant 380 V DC voltage to the DC/AC converter input. The HF transformer, operating at 16.6 kHz, provides electrical isolation between the battery bank and the grid. The four-quadrant DC/AC converter comprises a single phase IGBT bridge, output filters and a grid-connection inductor [5].

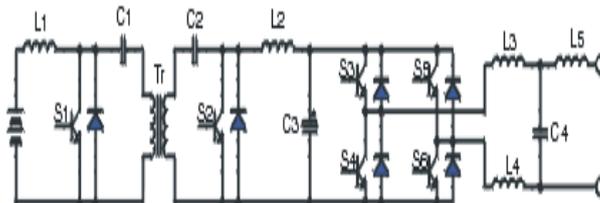


Figure 2: Power section of the battery inverter

The battery inverter operates in voltage control mode (regulating the magnitude and phase/frequency of its output voltage), acting as a “grid-forming” unit, when the microgrid operates in island mode, i.e. setting the voltage and frequency of the system. When the microgrid operates in parallel to the grid, in which case the latter defines the operating frequency and voltage, the inverter operates as a “grid-following” unit. The PV inverter performs the MPPT function of the photovoltaic generator and operates as a “grid-parallel” unit, responsible for maximizing the PV power output, but without any participation in the voltage or frequency regulation.

3. THE MICRO-GRID CONCEPT :

A microgrid can be simply defined as an aggregation of electrical generation, storages and loads. The generators in the microgrid may be microturbines, fuel cells, reciprocating engines, or any of a number of alternate power sources. A microgrid may take the form of shopping center, industrial park or college campus. To the utility, a microgrid is an electrical load that can be controlled in magnitude. The load could be constant, or the load could increase at night when electricity is cheaper, or the load could be held at zero during times of system stress. Distributed Generation (DG) refers to the numerous small, modular electricity generators, preferably new and renewable energy technologies which are located at LV lines, often close to the point of end use. Concept of MicroGrid supersedes all the advantages of single source DG and hybrid DG. Moreover, it also includes all the advantages of networking, at mini scale. A microgrid combined with power electronic interface is a completely self-sufficient network, with preferably autonomous control, communication and protection. It is capable of providing capacity support to the transmission grid while in grid-connected mode, and with capacity in excess of coincident peak demand. So, the Micro grids comprise low voltage LV distribution systems with integration of Diverse Energy Resources (DER) such as photovoltaic, wind, bio-mass, bio fuel and fuel cell together with Distributed storage (DS) like flywheels, energy capacitors and batteries and Controllable Loads that behave as a coordinated entity networked by employing advanced power electronic conversion and control capabilities. A schematic diagram is shown here for two types of microgrids: (i) Utility type microgrids which contain parts of the utility main grid and other one the (ii) industrial/commercial type microgrid which only include customer facilities [6].

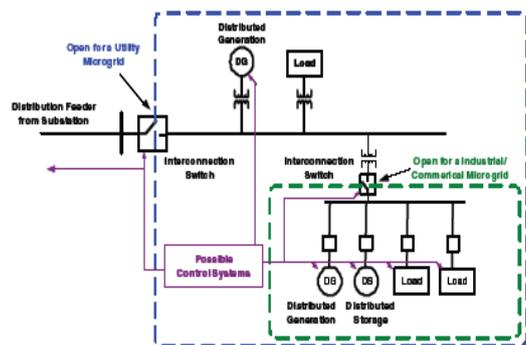


Figure 3: microgrid systems overall performance

There are many potential benefits to customers from the use of microgrids including improving reliability by providing power to the islanded portion of the electric power system (EPS) during a utility outage and resolving power-quality issues by reducing total harmonic distortion at the loads. Distributed storage (DS) technologies are essentially used in microgrid applications as the renewable generation and loads of the microgrid cannot be exactly matched. Distributed storage provides a bridge in meeting the power and energy requirements of the microgrid. Distributed storage enhances microgrid systems overall performance in three ways [6]. First, it stabilizes and permits DG units to run at a constant and stable output, despite load fluctuations. Second, it provides the ride through capability when there are dynamic variations of primary energy (such as those of sun, wind, and hydropower sources). Third, it permits DG to seamlessly operate as a dispatchable unit.

4. MICRO GRID RESEARCH PROJECTS :

A key feature of microgrids is that they can comprise of a variety of generation and loads. To accurately test these systems, a multifunction laboratory is needed that integrates generation, storage, and loads, as well as electrical and thermal capabilities [7]. There are a number of active Micro Grid projects around the world involved with testing and evaluation of these advanced operating concepts for electrical distribution systems. The Micro Grid research based on simulation study and hardware laboratory projects currently in progress to conduct field tests on Micro Grid applications are in Europe, the United State, Japan, Canada and India [8].

4.1. Microgrid project at the National Technical University of Athens (EU):

In the European Union (EU), the project was led by the National Technical University of Athens (NTUA) Greece together with research institutions and universities. The project was involved on simulation and demonstrates Micro Grid operation on laboratory scales. The laboratory-scale microgrid system, installed at the National Technical University of Athens, comprises two PV generators, one wind turbine, a battery energy storage, controllable loads and a controlled interconnection to the local LV grid. The battery unit, the PV generators and the wind turbine are connected to the AC grid via fast-acting DC/AC power converters. The battery converter in particular is suitably controlled to permit the operation of the system either interconnected to the LV network (grid-tied), or in stand-alone (island) mode, with a seamless transfer from one mode to the other. The configuration of the microgrid system installed at the National Technical

University of Athens is shown in Fig.

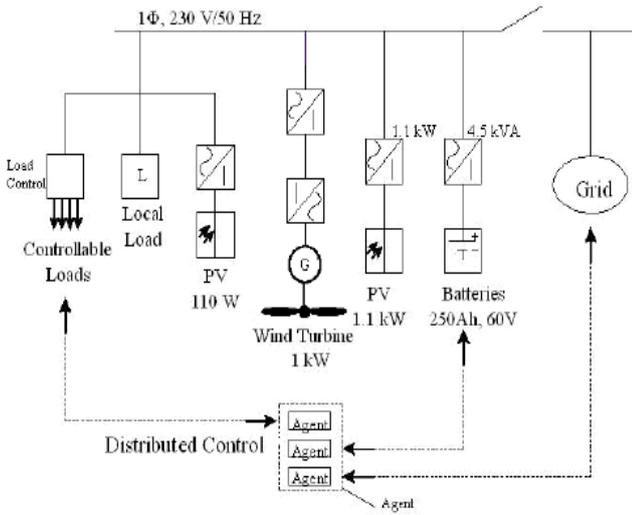


Figure 4: configuration of the microgrid system distributed control

The project was successfully completed providing several innovative technical solutions, which include the development of islanded and interconnected operating philosophies, local black-start strategies, and grounding and protection schemes, methods for quantification of reliability benefits. The other achievements of this project are to standardize the technical and commercial protocols and hardware to allow easy installation of distributed generation with plug and play capabilities. Other EU demonstration sites are taking place in Netherlands, Germany, Denmark and Spain.

4.2. Microgrid project CERTS by the US Department of Energy & California Energy Commission:

The R&D activities in the United State on Micro Grids research programme was supported both by the US Department of Energy & California Energy Commission[10]. The most well-known US Micro Grid R&D effort has been pursued under the Consortium for Electric Reliability Technology Solution CERTS which was established in 1999. The CERTS Micro Grid is intended to separate from normal utility service during a disruption and continue to serve its critical internal loads until acceptable utility service is restored. Actually, the function provided by the CERTS Micro Grid is purposely to save cost and no single device is essential for operation, creating a robust system. The reliability of the CERTS Micro Grid has been well demonstrated in terms of simulation and the bench testing of a laboratory scale test system at the University of Wisconsin, Madison. Full-scale testing on the CERTS Micro Grid concept has been installed at the Dolan Technology Center in Columbus Ohio, which is operated by American Electric Power. Figure below illustrates the CERTS microgrid design with protected critical load circuits and unprotected traditional load circuits.

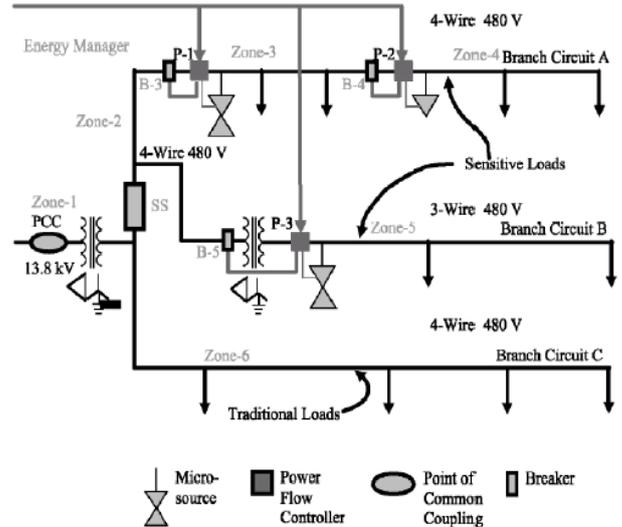


Figure 5: below illustrates the CERTS microgrid

The CERTS Micro Grid has presents unique electrical analysis challenges such as contain three phase, single phase and variety of sources interconnected by power electronic devices employing different control approaches. The modeling approach enables analysis of a variety of issue such as prediction and evaluation of imbalance, asymmetries, generation-load control and dynamic voltage.

5. Simulations:

We now consider some simulations to quantify the bene_tsof lookahead and also to highlight some interesting di_erencesbetween the future discounted analysed above and theundiscounted = 1 version. Recall that the undiscountedversion was suggested for generator scheduling in.For the purpose of the simulation we consider a simplewind power availability pattern shown in Figure 6. We consider the performance of 3 algorithms on this pattern (i) theOCO algorithm from Section 4 (ii) the future discountedalgorithm with lookahead from Section an algorithmthatconsiders theoptimal generationschedulewith

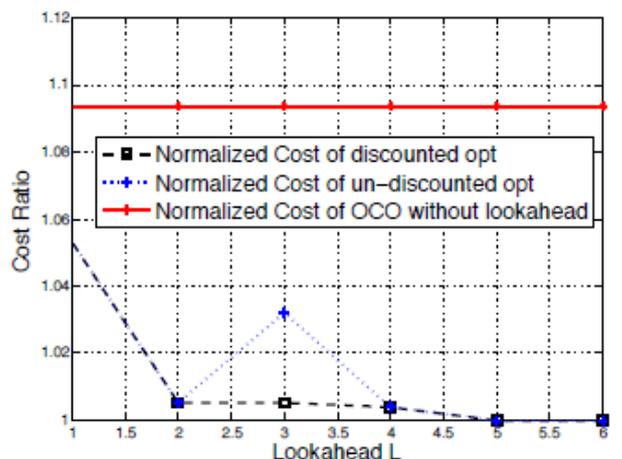


Figure 6: A comparison of the performance of (i) the OCO algorithm from Section

the same lookahead but without a discounting factor. The results of the simulation is in Figure 6. From we see that the performance of the OCO algorithm is reasonable even without any lookahead. One very interesting observation is that the performance of the 'default' scheduling with lookahead algorithm that does not discount future rewards is non-monotonic in the amount of lookahead. That is in some cases the performance of the algorithm may become worse with increasing lookahead [11]. In Figure 6 this corresponds to increasing the lookahead from 2 to 3. Here the performance degrades at lookahead 3 because of the particular periodicity inherent in the signal in Figure 3. However, the same degradation is observed at different lookahead with the wind patterns in Figure 6. However, the future discounted algorithm with optimal performs well across the different lookahead lengths.

7. CONCLUSION:

In this paper we have demonstrated that the theory and algorithms developed for online optimization are useful for generator scheduling problems in the smart grid, with suitable extensions to account for practical constraints such as generator parameters and ramping constraints. We designed simple algorithms, derived guarantees on their performance under mild assumptions and showed that they perform well even when no predictions of the future are available. We showed how to incorporate predictions of the future renewable availability effectively into online generator scheduling algorithms, and quantified the benefits of lookahead. Interestingly, we showed that discounting the future is useful both as a proof technique and as a strategy for generator scheduling with ramping constraints. In addition to load scheduling for cost minimization based on reviewer comments we are particularly interested in understanding online optimization algorithms for other applications including voltage support, distribution losses, and energy storage management that are particularly important in smart grids with a large penetration of renewable energy. Finally, on a theoretical side new online algorithms or time-varying discounting strategies that have better performance guarantees would be an interesting direction of future research.

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