Robust Design of Power Distribution Systems Using an Enhanced Multi-Objective Genetic Algorithm

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ABSTRACT
The growing importance of electric distribution systems justifies new investments in their expansion and evolution. It is well known in the literature that optimization techniques can provide better allocation of the financial resources available for such a task, reducing total installation costs and power losses. In this work, the NSGA-II algorithm is used for obtaining a set of efficient solutions with regard to three objective functions, that is cost, reliability, and robustness. Initially, a most likely load scenario is considered for simulation. Next, the performances of the solutions achieved by the NSGA-II are evaluated under different load scenarios, which are generated by means of Monte Carlo Simulations. A Multiobjective Sensitivity Analysis is performed for selecting the most robust solutions. Finally, those solutions are submitted to a local search algorithm to estimate a Pareto set composed of just robust solutions only.

Keywords: Distribution Network Project, Electric Distribution Systems, Load Uncertainties, Multiobjective Optimization, Sensitivity Analysis

INTRODUCTION
The investment in the continuous expansion and evolution of the electric distribution systems is widely justified by their social and economical importance: almost all Brazilian inhabitants are assisted by electrical energy and this kind of energy corresponds to 40% of the total energy consumed in the country (Soares, 2001). Besides, the distribution systems are the held responsible for the losses and failures occurred in the electrical systems (Čurčić et al., 2001; Soares et al., 1999). Therefore, these systems should receive special attention of the utilities in order to improve the quality and reliability of the supplied energy.

The use of adequate optimization techniques for designing power distribution networks is crucial for obtaining such efficient
systems. However, several difficulties are related to the problem of designing electrical distribution systems:

- The problem is usually formulated as a discrete and strongly nonlinear optimization problem. The parameter space is composed of disjoint feasible points and there is no obvious paths connecting them. These features make the search task considerably difficult.
- The load connected to the system is continuously changing within time: new loads are being connected to the system and the existing ones are frequently increasing. Therefore, the distribution network should be designed considering an estimative of the system load within a design time horizon, instead of considering only the load which is connected to the system at the project time. Hence, the problem is then endowed with uncertainties, which can affect the solution provided by the optimization scheme (Carrano et al., 2007a).
- The final resources available for system installing, expansion and re-formulation are often restricted. It implies the need of adequate solutions provided by the design method, taking into account the budget which is available for such a task.

Due to the mentioned characteristics of the electrical distribution systems design, the problem described here precludes the use of most part of the traditional optimization methods. For instance, deterministic continuous methods for non-linear optimization are not applicable to this class of problems since they rely on the derivative calculus, which is not defined in the discrete spaces. Greedy algorithms, which iteratively build a solution, are also ineffective on power system designs, since these methods are not able to consider several important aspects of those systems such as power flow, voltage level on the load buses and branch capacity constraints.

Evolutionary algorithms arise as suitable methods for dealing with electric network problems, especially because these methods are not built on strong premises such as linearity, differentiability or convexity. Two examples of applicable methods in power systems are Genetic Algorithms (Goldberg, 1989; Holland, 1975) and Ant Colony Optimization (Dorigo, 1992; Dorigo et al., 1996). Some applications of these algorithms listed are listed below:

- **Genetic Algorithms (GA):**
  - Design of power transmission networks (Duan & Yu, 2002; Chung et al., 2003).
  - Location of substations associated to the network design (Carrano et al., 2005; Carano et al., 2007b).
  - Optimal planning of the dynamic expansion of power distribution system (Carrano et al., 2005).
- **Ant Colony Optimization (ACO):**
  - Design of distribution systems (Gómez et al., 2004).

The uncertainties associated to the loads which should be installed after some time horizon make difficult the mid/long term design of the distribution systems. Some variables which define the problem become stochastic and may assume any value within a huge set: a combinatorial set of possible load scenarios. Most of the approaches in the literature address this issue by considering the most likely load scenario for optimization. However a network which is well suited for the most likely scenario may be low effective on other possible load conditions. This frequently happens for non-robust solutions.

The approaches presented in Carrano et al. (2007a) and Souza (2007) handle with load uncertainties by including an additional step just after the optimization, which is the sensitivity analysis of the solutions. Each one of the previous references employs a different Immune Inspired Algorithm (IIA) for optimizing the system considering the most likely load...