# Designing the Next Generation of Real-Time Control, Communication and Computations for Large Power Systems

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Abstract—The power grid is not only a network interconnecting generators and loads through a transmission and distribution system, but is overlaid with a communication and control system that enables economic and secure operation. This multi-layered infrastructure has evolved over many decades utilizing new technologies as they have appeared. This evolution has been slow and incremental, as the operation of the power system consisting of vertically integrated utilities has, until recently, changed very little. The monitoring of the grid is still done by a hierarchical design with polling for data at scanning rates in seconds that reflects the conceptual design of the 1960s. This design was appropriate for vertically integrated utilities with limited feedback and wide area controls; however, the thesis of this paper is that the changing environment, in both policy and technology, requires a new look at the operation of the power grid and a complete redesign of the control, communication and computation infrastructure. We provide several example novel control and communication regimes for such a new infrastructure.

*Index Terms*— Distributed control, SCADA, power systems, QoS, wide area control.

#### I. INTRODUCTION

The power system networks in developed countries are extremely large and complex interconnected systems. The Eastern interconnection in North America is the largest in geographic area, stretching from the east coast to almost the Rocky Mountains, total installed generation capacity and total miles of transmission lines. In these networks, all the generators, with the exception of a small number of renewable units, rotate synchronously in dynamic equilibrium, precisely matching generation to demand. This balance must be maintained as loads fluctuate and as disturbances such as equipment outages arise. The multi-layered infrastructure to enable economic and reliable operation of such systems has evolved over many decades utilizing new technologies as they have appeared. This evolution has been slow and incremental, partly due to the great capital expense of making changes to such a large system but also since the operation of the power system stemming from vertically integrated utilities has, until recently, changed very little.

Large power systems exhibit a variety of dynamical behaviors ranging from very slow, minutes to hours, to extremely fast phenomena, on the order of milliseconds. Separate controllers, generally designed independently, have been developed to address the various phenomena. Control actions include both the discrete, such as, the opening of a circuit breaker, and the continuous, such as, the excitation control in synchronous generators. Still, except for the very slowest of controllers and a few specialized schemes, engineers have designed systems largely through local decisions based on local measurements. On the other hand, as is all too apparent during blackouts, power system disturbances may have system wide impacts. At present during extreme events, the burden falls on operators but, as transcripts from recent blackouts show, they do not have "situation awareness" outside their own company [1].

The tremendous cost and performance breakthroughs in the last decade in terms of computers, their networking infrastructure, and middleware technologies have created new opportunities for designing wider area controls to help overcome these limitations. If the only motivation were to take advantage of new communication technology to improve controls, then perhaps there would be no urgency to redesign the system and power control could continue to evolve slowly as it has in the past; however, in addition to the new technology concerns, the evolving regulatory environment is fundamentally altering the operation of the system. These factors include:

- the increasing number of participants whose different goals in the operation of the power grid require access to different sets of real-time (or historical) data,
- the emerging power markets which produce a completely new set of real-time data,
- the increase, by several orders of magnitude, in transactions between buyers and sellers that not only

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requires the tracking of more data but also produces completely unanticipated loading of the grid,

- the operation of the power grid in unanticipated operating conditions that requires more sophisticated monitoring by the RTO/ISO (Regional Transmission Operator/ Independent System Operator) to guarantee secure operation, where the RTO/ISO has to not only guarantee operational security but fair transmission access rules that are transparent,
- the recent blackouts and concerns with terrorism that have made it clear that security must be guaranteed against both natural (acts of God) contingencies and malicious acts,
- the new generation technologies that are changing the generation mix to one with a large number of smaller units (such as, wind units and microturbines) operating in concert with the traditional large generation plants.

In this paper, we propose a new communication and control infrastructure to address these concerns. We develop a comprehensive system that is flexible enough to manage new requirements as they evolve. The system described here not only takes advantage of new broadband, faster communication but also emerging middleware systems that use distributed computation to make such systems flexible, efficient and secure. We demonstrate how such a system can allow the implementation of improved controls that will allow the grid to be operated closer to its limits. For example, we show how the next generation of fast, system-wide controls can be added to the slow, system-wide controls (like AGC) or fast, local controls (like protection). Further, this new conceptual design is not dependent on future technology but can be implemented with available technology, such as, satellite and optical communications, substation automation, voltage and transient stability computation, and microprocessor protection systems.

# II. EXISTING POWER CONTROL SYSTEMS

Given the complexity of the power system and its long history, one may not be surprised that a patchwork of controls has developed over time. This section surveys these controls and identifies the technology or regulatory environment that led to the engineering decision. A more detailed discussion of this can be found in [2].

## A. Local Controls

Local controls are those that use inputs from within the same substation in which the control outputs are applied (i.e. no distance communication connection is required). The inputs are usually analog values (voltage, current, power, reactive power) and the control can be digital (opening/closing circuit breakers) or settings that are either discrete like transformer taps or continuous like the voltage regulator of a generator.

### 1) Power System Protection

The most fundamental control that is needed to operate the power system stems from safety concerns and the practical necessity of protecting electrical equipment from high currents that arise from faults. The simple fuse has evolved to today's sophisticated microprocessor based relays that control circuit breakers. Even the isolation of equipment from faults requires sophisticated equipment to sense the currents, recognize the faulted conditions and coordinate the different protective devices. Relays may operate for a number of other reasons beyond simply high currents, including excessive frequency deviation, low or high voltages or indications of instability. Thus, although not traditionally thought of in this way, protection is the front line of control. Modern protective systems have the ability to respond to a fault within two or three cycles (about 50 milliseconds in a 60 Hz system) using microprocessor based relays that perform sophisticated computations. Protection is the fastest control but accordingly has been the most localized of the controls.

## 2) Generator Governor Control

The power output of a generator is controlled by a governor that senses the mechanical shaft speed and adjusts the mechanical power input to the generator so that the generator can maintain the desired electrical output.

# 3) Voltage Control

Voltage control has traditionally been a local feedback control. Generator excitation can be controlled to maintain a set terminal voltage by producing or absorb reactive power. Within the transmission network, voltage can also be maintained by the use of tap changing transformers or switched capacitors/reactors to provide/absorb reactive power. These are generally slower controls that either follow fixed time schedules or are switched at preset levels. More recently power electronics have been used as a fast control of the production/absorption of reactive power.

4) Power Flow Control

Traditionally, the only way to control the power flow on an AC transmission line was with a phase shifting transformer. This was a slow control with the same speed as tap changing transformer control of voltage. Power flow on DC transmission lines could, however, be controlled very fast by changing the inverter/converter settings. More recently, power electronics have been used to develop fast controllers for AC transmission lines.

#### 5) Power System Stabilizers (PSS)

Power systems exhibit undamped oscillations under certain operating conditions. Adding a PSS to a generator can damp help such oscillations (these oscillations typically range from 0.7-1.4 Hz.). The PSS uses local measurements to provide a supplement to the generator voltage control system.

#### B. Wide Area Controls

In this section wide area controls have included any control that requires some communication link to either gather the input or to send out the control signal. Obviously some wide area controls require more communications than others.

# 1) Frequency Control

Perhaps the earliest example of wide-area feedback control in the power system is frequency control. Frequency will deviate from the nominal setting whenever there is any imbalance between generation and load as the imbalance will



Fig. 1. Existing SCADA infrastructure

be drawn from the kinetic energy stored in the rotating masses of the generators. The primary control loop to ensure balance is the local governor control (II.A.2). In order to maintain system frequency at the nominal value and schedules between control areas, a secondary control loop, AGC (automatic generation control), coordinates the individual raise and lower signals to the generators. The control center gathers the relevant frequency and power flow information and sends the appropriate set point adjustments for each of the units on AGC. This control varies widely throughout the world with some regions employing a tightly regulated control, e.g., North America with commands sent typically every 2-4 seconds, while other regions allow much greater deviations in frequency and prefer less frequent adjustments, e.g., Scandinavia.

# 2) Secondary (Regional) Voltage Control

Some countries have implemented, or begun to implement, secondary voltage control schemes that are analogous to AGC control for frequency. These secondary schemes typically monitor voltage at key buses and then schedule voltage over a wider region to maintain the key bus voltage. These voltage setpoints are then sent to the local voltage controllers (II.A.3). This type of voltage can also be supplemented by a tertiary scheme of scheduling voltages throughout the system, typically to optimize security or minimize losses.

# 3) Special Protection Schemes (SPS)/ Remedial Action Schemes (RAS)

The one exception to local protection schemes has been highly specialized schemes, called RAS (remote action schemes) or SPS (special protective schemes), which respond by tripping equipment that are remote to some fault or other event. Such a scheme can be as simple as just a pilot-wire trip but are increasingly becoming elaborate schemes that trip generators, loads or even transmission lines when a combination of events occur. The use of SPS/RAS is increasing in stability limited systems where the availability of such schemes allow power transfers that would engender instability for certain faults unless such a scheme exists. These schemes are generally hardwired and inflexible, relying on dedicated communication links and extensive off-line calculations of settings.

#### C. Communications for Wide Area Controls

As the above discussion indicates, most of the power system controls are local and this is particularly so for the faster controls. The only common wide area feedback control system is AGC, which resides at the control center. The regional voltage control (used in Europe) and the SPS/RAS control have dedicated communication and computer systems for each scheme.

## 1) Control Centers

The predominant function of the control center is an interface between the operators and the power system. Data acquisition allows the operators to monitor the condition of the system and implement supervisory (manual) controls, such as, the opening and closing of circuit breakers, switching in and out capacitors, and so on. Such a SCADA system gathers system-wide data using a communication system shown in Fig. 1. Such a 'star' network gathers data sequentially from each substation and generating station with a scan rate in the 2-10 second range. The fastest scan rates (2-4 secs.) are used to collect the data needed for AGC (tie-line power flows and generator outputs) and the control signals to the generators are sent out at that rate. As mentioned before, this is the main wide area control in use today and is a relatively slow control.

The control center also does other tasks like that of scheduling power transactions that is managed by the operators. The EMS (energy management system) software in the control center provides a number of computational tools to assist the operators in reaching their decisions but very little, if any, of this is implemented as a closed loop control.

The SCADA software communicates directly to the remote terminal units (RTU) in each substation. Each RTU gathers this data from the various sensors in the substations that measure voltage, current, power, reactive power, as well as circuit breaker positions (open/close). The gathering of data within a substation has in recent years become more sophisticated especially at the higher voltages. Each substation has its own SCADA system and some of the local controls like transformer tap control, switching shunt capacitors/reactors, etc. - are managed by it. These newer substation automation systems, shown in Fig. 2, gather data at much faster rates (msecs) and can record very fast sequence of events, e.g. the openings and reclosures of breakers during a fault.

It should be noted here that although data is often collected at these very fast rates at substations the present communication architecture between the RTUs and control center cannot support the gathering of all this fast data at the control center. Thus the control center communication system cannot support fast wide area controls unless the architecture is upgraded to handle faster communications.

#### 2) SPS/RAS

Each special protection scheme today uses dedicated fast communication lines and a dedicated computer (microprocessor), as shown in Fig. 3. Once installed, these are quite inflexible except for changing the settings like trip times. Also, as SPS/RAS proliferate – the Western US grid now has over a hundred such schemes – their coordination becomes very difficult and the burden of off-line studies to coordinate the settings becomes onerous and error-prone.

# D. Communications Architecture of the Future

Data is being gathered at high scan rates within substations and fast local controls using digital (microprocessor) methods are commonplace. Some limited but fast wide area controls are



Fig. 2. Substation automation system

already being used in the form of special protection schemes. However, they use dedicated communication lines rather than a network and are then inflexible as far as their control scheme is concerned.

The obvious evolution of this communication system is the high speed network that will connect all the fast scanned data from all substations (Fig. 4). This data can then be made available to the control center to do the traditional control center functions. It also makes feasible distributed controls like that of SPS/RAS or regional controls like secondary voltage control. Moreover, these controls can be reconfigured through software rather than the installation or reconfiguration of hardware. Finally, such an architecture lends itself to levels of software management (middleware) that can be used to handle contingencies, quality of service and cybersecurity. A particular instantiation of this is proposed in [3] but the one proposed here and elaborated in Section IV is more general.

## **III. EXAMPLE APPLICATIONS**

We provide some varied examples of power system controls that illustrate the design of wider area controls with a distributed communication system that allows for decentralized coordination and flexibility. For convenience, we have chosen these examples from work done by the authors and this section is by no means an attempt to capture the range of wide-area controls research being conducted worldwide.



Fig. 3. SPS/RAS communication links



Fig. 4. A conceptual network for communication of all power grid data

# A. Decentralized Load Frequency Control

AGC is a system wide centralized control that has served vertically integrated utilities well. The recent debate to adapt this control to a decentralized ancillary service, i.e., third party, market continues. We have shown that such decentralized control is technically feasible provided that the present hierarchical communication system is replaced by a flexible networked communication system that can be modified in real time to adapt to ancillary service contracts [4-5]. Similarly, we have shown that an ancillary service market for reactive power or voltage control is feasible; however, because of high reactive power losses in transmission lines, voltage support is geographically limited to smaller regions than AGC and developing competition in such reactive power markets is more difficult [6].

One of the challenges in a decentralized scheme is for robust controls. Traditionally, AGC signals are sent via communication channels, which dedicated are the responsibility of the large utilities. Using the traditional dedicated communication links, there was little need to be concerned with problems associated with the communication network; however, the use of an open network increases the likelihood of delays and other problems that may arise in the communication system. Bhowmik et. al [7] analyzed the effect of two major communication delays: constant delays, which denote a heavily congested network with packets being dropped, or a denial of service type attack, at either sender or receiver side; and random delays, which denote Byzantine failures as well as malicious attacks. Assuming no new control approaches, simulations on a simple system showed that a small fixed delay of three packets in all units or two packets in any unit with third party contracts led to unacceptable performance. Small random delays also lead to poor response.

Conventional AGC functions by responding to the deviations in Area Control Error (ACE) signals computed for each area. Such deviations indicate a mismatch between load and generation within a certain area. The regulation is to

increase or decrease the generation, and eventually, the mismatch, should return to zero (Fig. 5). The ACE is formulated by the following equation [8,9]:

$$ACE = (NI_A - NI_S) - 10 B(F_A - F_S)$$
(1)

There are two parts to this equation. The first term accounts for deviations from the scheduled tie-line flow interchange with all neighboring areas, with  $NI_A$  the actual flows across the boundary of the control area and  $NI_S$  the scheduled tie line flows of the control area. The second term accounts for the change in total power generation in an area needed to correct an offset in the (local) average frequency from a predetermined frequency set point. The frequency bias parameter, B, is the frequency bias of a control area,  $F_s$  is the scheduled frequency, normally 60 Hz in North America but possibly offset to effect manual time error corrections, and  $F_A$ the actual frequency. Note that, if the frequency measurement or tie-flow measurement is not available at a certain AGC cycle, say due to a measurement failure, then one cannot calculate ACE. A practical industry approach is to pause AGC, and if this continues for too long, AGC is suspended, and alarms are issued. During the pause or suspension period, the set points remain unchanged.

To understand the impact of distributed communications on AGC, consider the problem of time-delays in a closed loop control. Assuming a linear *time-delay system* [10], let:

$$\dot{x}(t) = Ax(t) + \sum_{i=1}^{n_d} A_{di} x(t - \tau_i)$$
(2)

where x(t) is the state at time t,  $\tau_i$  is some fixed delay, and A and  $A_{di}$  represent the dynamics of the current and previous states, respectively. A one area linearized AGC model could

be expressed as:

$$x(t) = Ax(t) + Bu(t) + F\Delta P_d$$
(3)

$$y = Cx(t) \tag{4}$$

Here, u(t) is the control at the governor terminal, without this control, (3) is the same as the standard models in [8] and  $\Delta P_d$  is the load deviation. Also note the structure of *C*, the output simply tracks the frequency deviation and integral control deviation. Considering delay, the linearized model of the governor valve position would be:

$$\Delta P_{\nu}(t) = -\frac{\Delta f(t)}{RT_{e}} - \frac{\Delta P_{\nu}(t)}{T_{e}} - \frac{\Delta E(t-\tau)}{T_{e}}$$
(5)

Notations are standard and can be found, for example, in [8]. The governor receives a delayed ACE signal, and the third term represents the impact of the former state Thus, (3) becomes:

$$x(t) = Ax(t) + A_d x(t - \tau) + Bu(t) + F\Delta P_d$$
(5)

with F and  $A_d$  as defined in [11]. Notice, the proposed framework is particularly appropriate for the deregulated environment where control services may be provided through bilateral contracts. With the previous states included in the controller:

$$u(t) = Kx(t) + K_d x(t - \tau)$$
(6)

One approach to controlling time delay systems is the use of linear matrix inequalities (LMI) techniques. The stability criteria can be either delay-independent or delay-dependent (i.e., stability is only assured below a particular threshold) [12-13]. In practice, delay-independent systems are not particularly meaningful as alternative strategies will apply when



Fig. 5. Block diagram for AGC with communication delays and bilateral contracts



Fig. 7. Response using time sensitive controls

communication fails or delays exceed some time threshold, e.g., use of the pause counter in AGC or simple voice communications. Still, they do provide some guideline for control design. Control gains can be chosen so as to satisfy a set of arithmetic Riccatti equations [14-15].

In the following, the control method is demonstrated on a three area model with standard simplified models for the prime mover and governor are used. For brevity, the modeling details are left to [11]. Both fixed and random communication delays of up to 50 seconds are simulated with different delays in each control area.

Fig. 6 illustrates the response for a conventional AGC control. The result is a loss of power balance as the delayed signals are received. The frequency would continue to deviate if AGC was continued. This result is within expectations since the set point is not updated with the correct and timely data. All units suffer from the delays. The point here is that, if a critical channel is out of service for a certain time, it will degrade the conventional AGC system performance seriously. In this case, it is assumed that complete state information for all generators is available at each unit and this is used in the LMI design. While it is not a practical design for such state information to be known globally, this case demonstrates an extreme example of the proposed control and communication methodology. The system performance with the LMI control is shown in Fig. 7. The control works satisfactorily and when the slowest of the delayed signals begin to arrive at 60 seconds, only minor adjustments are needed.

The point in this example is not necessarily that this is the methodology one must follow to design the controller but that new approaches for bilateral and multi-lateral load following (balancing) services are feasible if a flexible and reliable communication network, as in Fig.4, is available.

## B. Closed Loop Voltage Control

There exists a rich history of research on automatic scheduling and coordination of voltage control devices [16-21]. In some European countries including France, voltage control is



Fig. 6. Response with conventional AGC

organized as a hierarchical three level regional structure, which was briefly discussed in Section II.B.2. The automated secondary voltage control has been implemented in the French electric grid for more than a decade and the approach is based on dividing the large power system into several voltage control areas. This approach is generally not suited to North American electric power grids where the network tends to be tightly coupled. As the system loads increase, the interactions between power system components also become more significant. Therefore, it is difficult to divide a modern power system into decoupled voltage control areas. We have proposed a new approach for automatic voltage control in [22-23] that was motivated towards implementation in the transmission network operated by Bonneville Power Administration (BPA) in Pacific Northwest.

The controller coordinates the switching of discrete devices such as capacitor banks, reactor banks, and tap changing transformers as well as continuous control of generator high side voltage settings. The objectives of the controller are a) to maintain the bus voltages across the network within specified voltage limits, b) to minimize the number of switchings, c) to increase the voltage control reserves by keeping maximum number of devices off-line, d) to mitigate circular reactive power flows, and e) to monitor and to improve voltage security. At present, the commands for switching the voltage devices are issued by the system operators manually through the EMS supervisory control system. The proposed controller aims to automate the switching commands. By supervising and managing the reactive power resources continuously, it would be especially effective in preventing large scale events such as the July 2, 1996 western blackout and the August 14, 2003 blackout which are related to reactive power deficiencies in some parts of the power network.

The overall structure of the controller is shown in Fig. 8. It uses the power-flow model of the system from the state estimator as the internal computational engine. The effects of the switching of voltage control devices are computed by solving the power-flow problem adaptively in local areas around each device. The switching decision is formulated as a nonlinear discrete optimization problem that can be solved very fast, and is aimed towards online implementation. Shortterm load forecasting estimates from AGC are used for computing "look-ahead" power-flow scenarios at say 10 minutes and 30 minutes ahead of present time, and the switching decisions can thus be made predictive to minimize the control actions under load fluctuations.

The voltage controller has been developed in close collaboration with the BPA system operators and engineers. A prototype version of the controller, described below, is at present being implemented by National Systems Research Co. (NSR) in the BPA grid [24]. The prototype implementation has established the feasibility of the algorithm computations for online implementation in the large electric power system.

The controller as shown in Fig. 8 is essentially a feedback control that uses the state estimation model together with the current values of bus voltages from SCADA to compute the recommended control actions. In the closed loop implementation, it is aimed towards operating say once every minute or so, and hence is denoted as a "slow voltage controller". The current prototype of the controller at BPA is a open loop implementation that only recommends the control switching actions to an operator who makes the actual decision on the switching commands through SCADA. It is intended for verifying the validity and reliability of the automatic controller.

In the next few paragraphs we describe the structure of the optimization problem resulting in equation (7) and the flow of the voltage controller (Fig.10).

Let us consider a single power-flow scenario first. In the following discussion, the index *i* denotes the index for the different control variables. We will associate a cost with each control device as a combination of three terms: i) switching costs  $C_i$  to reflect on the relative preference of the device and when it was last switched, ii) a voltage penalty term to quantify the remaining voltage violations after the device has been switched, and iii) other control objectives such as a penalty for circular VAR flow to mitigate the effects of loop reactive



Fig. 8. Structure of the automatic voltage controller

flows.

The switching costs  $C_i$  are set in such a way that it would increase significantly after each switching and it would decrease slowly afterwards during each control iteration. This is meant to prevent repeated switching of the same device that would be undesirable. Also, control preferences can be handled by adjusting the relative switching costs of  $C_i$  among the different types of devices. For instance, at BPA, the switching of capacitor/reactor banks is preferred over the tap changing of transformers since transformers are more expensive to maintain. Accordingly, the transformer tap changes have a higher  $C_i$  compared with capacitor/reactor banks. Moreover, it is better to switch out devices whenever possible rather than switching in devices to correct a problem. For instance, it is better to switch out reactor banks first to address low voltages before switching in capacitor banks. Therefore, a switching in action has a higher penalty  $C_i$ compared with a switching out action.

Next, we will discuss the computation of the voltage penalty term. The switching effects of each control action are calculated from the large scale state estimation model by local power flow computations around each control device. It has been long known in power system computations [25-26] that switching effects of line outages and reactive power devices have a limited effect in a geographical sense. The localized echelon approach in [20] is also based on this assumption. We use a similar approach in the controller by i) constructing a local area around each control device using the concept of electrical distance developed by EDF in [21], and ii) by carrying out full nonlinear power-flow solutions within the local areas of each device. We want to emphasize that the local areas are constructed around each device purely for computing the switching effects and they will be overlapping among many devices. The optimization itself is carried out for the large system. The local area approach enables the computation to be very fast even for large scale models as demonstrated by the feasibility of the prototype controller at BPA.

The objective of the optimization would be to find a switching action that corrects all the voltage violation alarms. However, typically, not all of them can be corrected by a single switching action, and there would be no feasible solution for the optimization. Therefore, we define a voltage penalty function as shown in Fig. 9, and the voltage penalty term for any device is the summation of voltage penalties for each bus in its local area.



Fig. 9. Voltage penalty function



Fig. 10. Flow diagram for the automatic voltage controller

The third term in the cost function involves the circular VAR penalty. We have proposed fast computational procedures for evaluating the existence of any circular VAR loops in a large power system model in [22-23], and the algorithms have also been successfully implemented in the prototype controller at BPA. It is a graph theory based depth first search algorithm [22].

Summarizing the discussion so far (see Fig. 10), the optimization can be formulated as follows:

$$\begin{array}{l}
\text{Min} \\
\sum_{i=1}^{n} |k_{i}| C_{i} + \sum_{m=1}^{M} p_{m} [F_{m} (k_{1}, \cdots, k_{n}) + \dots \\
+ \lambda g_{cir,m} (k_{1}, \cdots, k_{n})] \\
\text{s.t.} \quad \sum_{i=1}^{n} |k_{i}| \leq N_{sw} \\
k_{i} \in \{-1, 0, 1\}
\end{array}$$
(7)

Here, the optimization control variables are  $k_i$ , which represent a switching out ( $k_i$ =-1), switching in ( $k_i$ =1), or no change ( $k_i$ =-0), respectively. For tap changing transformers, these actions correspond to switching up ( $k_i$ =-1), switching down ( $k_i$ =1), or no change ( $k_i$ =-0), respectively.  $N_{sw}$  denotes the maximum number of simultaneous switching actions permissible per control iteration, and it is assumed to be one for fast implementation in the BPA prototype. The variable  $C_i$ represents the switching costs of device *i* as discussed above.

As formulated here, the optimization is carried out in a robust sense over M different power-flow scenarios from the load forecasting computations, which are assigned relative probabilities  $p_m$ . The term  $F_m$  is for the voltage penalty calculated after the switching actions  $k_1$  through  $k_n$  for the *m*-th power flow scenario. The final term  $g_{cir,m}$  denotes the circular VAR penalty that is calculated after the switching actions  $k_1$  through  $k_n$  for the *m*-th power flow scenario.

Generators can also be included by formulating the generator high side bus voltage set points in the form of certain discrete settings. The details can be seen in [22]. The controller as proposed was tested extensively on the western Oregon subsystem in the Pacific Northwest in [22]. In the

prototype implementation in progress at BPA at present, the controller has been implemented on the entire BPA transmission grid [24], which establishes the feasibility of the controller for the large scale power system.

## C. Small-signal stabilization controller

When all the eigenvalues of the linearized system Jacobian evaluated at the current system equilibrium point have negative real parts, the system is said to be small-signal stable [8]. That is, all the modes of the linearized system must have positive damping for small-signal stability. Under stressed power system operating conditions, if any of the eigenvalues cross over into the right half complex plane, a small-signal instability results, typically leading to diverging or sustained oscillations. A classical example of the small-signal instability was the August 10, 1996 western blackout when the 0.25 Hz WSCC inter-area mode became unstable, leading to diverging oscillations and the large scale black-out. Such oscillatory instabilities typically develop over several minutes before resulting in the eventual serious consequences such as the system separation. Therefore, with the existing technology of wide-area measurements and the emerging technology of wide-area control architectures, it is possible to develop smallsignal stabilization controllers, which can detect the evolution of the small-signal instability and take counteractions to stabilize the unstable modes.

We are working on the design of such a wide-area smallsignal controller at WSU, and the proposed configuration is shown in Fig. 11. The controller as shown includes two sets of components: 1) a central controller and 2) fast control devices such as Static VAR compensators (SVC's) and Thyristor Controlled Series Compensation (TCSC) devices.

The central controller monitors the measurements from across the system continuously for the emergence of oscillatory signatures. We use multi-input Prony signal processing algorithm tools [27] and Fast Fourier transform (FFT) methods for estimating the damping and phase characteristics of the oscillatory modes from the wide area measurements. The two methods Prony and FFT are used to crosscheck the results for reliability purposes. The algorithms



Fig. 11. Wide-area small-signal stabilization controller

wait for at least three swings of the oscillations for reliable extraction of the modal information. When a problematic mode is detected in the measurements with sufficiently large magnitudes, the controller issues triggers to specific stability control devices for taking suitable corrective actions. The triggers can also be accompanied by a remote input to the devices from the central controller that will serve as the stabilizing input for the mode of relevance. Otherwise, the distributed controllers can use the local measurements to damp the oscillatory mode after receiving the external trigger from the central controller.

After receiving the external trigger, the specific devices switch to an aggressive damping control mode, wherein the outputs of the respective devices are varied to provide positive damping to the problematic mode in the system. An example of the controller is demonstrated in the simulation below, wherein the controller is applied to a realistic large-scale model of the western electric grid. Specifically, an existing SVC at Maple Valley near Seattle, WA is used as the stabilizing control [28], and the simulation is carried out on a validated computer model of the August 10, 1996 WSCC black-out [29]. The first simulation in Fig.12 shows a duplication of the actual system behavior during the blackout that resulted in slowly growing negatively damped oscillations when the Maple Valley SVC is used as a normal voltage control. As the McNary generator trippings progress, the damping of the 0.25 inter-area mode becomes more and more negative, and the growing oscillations eventually lead to the tripping of the California-Oregon Intertie (COI) lines and the system break-up.

In the second simulation in Fig.13, a central controller detects the emergence of growing oscillations and when the oscillations become larger than a certain threshold, the controller switches the operating mode of the SVC from the local voltage control mode to a small-signal stabilizing mode with the Malin bus voltage (on the COI lines) as a remote input for the Maple Valley SVC. In Fig. 13, even as the rest of the trippings occur as was during the August 10, 1996 black-out,



Fig. 12. Simulation of the August 10, 1996 oscillatory instability event



Fig. 13. August 10, 1996 simulation with the small-signal stability controller

the oscillations are damped out by the Maple Valley SVC, and the system returns to its normal operating condition.

## D. Other stability controls

The first two examples for frequency and voltage control are relatively slow in that control actions are required in the range of several seconds. In the case of the third example on small signal stability, a few seconds are available for control intervention. For such oscillatory stability we are also developing control methods that can

- adjust parameters on PSS based on local and wider area measurements [30],
- switch capacitors, shed load or trip generation to improve system damping.

The availability of fast communication and computations also allows more sophisticated control schemes for power systems, especially for systems that are transient stability or voltage stability limited. The fast control needed to stabilize power systems today is limited to local controls (protection) or the hard-wired RAS/SPS. Although the fast calculation of needed controls to stabilize a transient instability case within the milliseconds required for intervention remains a difficult task, a coordinated design of stability control can remove the limitations of hard-wiring these SPS/RAS and the need for large off-line studies to fix their parameters. We are developing schemes that can in real-time:

- quickly determine the amount and location for generator rejection and load tripping to stabilize the system when the dynamic security analysis detects instability for a particular contingency,
- determine which available RAS/SPS scheme ought to be activated to stabilize such an instability.

A more exciting possibility brought about by the availability of fast data acquisition by a wide-area communication network is the elimination of the hard-wired RAS/SPS schemes that are proliferating to take care of various operating conditions. If such a flexible communication network is available a new RAS/SPS scheme can be implemented by software alone. Such a soft-wired RAS/SPS scheme will make it possible to easily bring into play new controllers and phase out old controllers without having to do physical installations or removals. Finally, the objective for all of these schemes is to allow the operation closer to stability limits without sacrificing reliability.

# IV. PROPOSED COMMUNICATION INFRASTRUCTURE

We have designed and built a prototype of a new communications framework called GridStat for delivering status information, data representing dynamic operational phenomena, such as, voltage, current, breaker status, and command decisions to be delivered [31]. It provides the communication services depicted in Fig. 4. GridStat allows status variables, named program language variables with status information, to be programmed at a high-level that is easy for programmers not expert in network or distributed computing to use and re-use. It then delivers the status variables with the required timeliness, redundancy, and security. GridStat is implemented as *middleware*, a high-level software functioning above the operating system that makes distributed computing systems much easier to program by providing higher-level abstractions for programmers to use. Middleware also allows for interoperability across different operating systems, network technologies, programming languages, computer architectures, and even across different vendors' middleware frameworks. GridStat is a specialization of a middleware architecture called publish-subscribe, with a management plane and with optimizations to take advantage of the semantics of status variables.

## A. GridStat Overview

Fig. 14 gives a high-level overview of GridStat. *Subscribers* are programs that receive status variables. *Publishers* are programs or intelligent devices that create status variables, and

then call a GridStat API to create the status variable and then each time an update needs to be delivered. Publishers do not need to be aware of particular subscribers, and vice versa. Still, publishers and subscribers can be aware of each other indirectly if they require. Ongoing research is developing a trust management framework, which allows constraints on what entities may receive or forward a particular status variable. The cloud in Fig. 14 depicts an opaque network that the status variables are routed through.

Status variables need to be delivered with specified *quality* of service (QoS) requirements, including timeliness, redundant paths, and computer security. To facilitate this, above the publisher-subscriber data plane is a *QoS Management* plane. This takes QoS parameters both when a publisher creates a status variable and when a subscriber subscribes to it. It then exerts control over the network to ensure that status variables are delivered with the requested QoS.

GridStat is designed to be easy for subscribers to program. For example, subscribers are provided with a local object that caches the latest value of the status variable, so programmers do not have to deal with callbacks or interrupts (though they have the option of getting a callback if their timeliness or redundancy requirements are violated). GridStat also provides its interfaces using CORBA, a widely-utilized middleware standard.

#### B. Detailed Architecture

Fig. 15 provides more detail of GridStat's architecture. For GridStat, the network consists of a series of status routers, computer nodes that forward status events, much like IP routers in today's computer networks. Status routers filter status updates based on the rate and priority of subscribers that are "downstream". Status routers today are in software, just like initial IP routers were, but one goal of the GridStat research is to fully understand the complete functionality of what a status router can and should do, and then to move it into hardware. It is unnecessary for the QoS management plane to be put in hardware, because it is not on the critical path for fast delivery of status data. It is also undesirable to put it into hardware, since its functionality would very likely be augmented on a regular basis. The data path is much simpler and would likely change more slowly, hence its suitability to hardware implementation once more fully researched and defined.

GridStat's QoS management plane is not a single, centralized module. Rather, it is a hierarchy of modules called *QoS Brokers*. A QoS broker contains and enforces policies on the entities that should be allowed to subscribe to status variables within its domain of control. QoS brokers are arranged in a hierarchy: the lowest one, called a *leaf broker*, will typically be a substation; say, a particular utility's control center might be at the third or fourth level; and the ISO or RTO would be at the top. A non-leaf broker must approve subscriptions between its children's domains. GridStat has domains and sub-domains, for reasons similar to the Internet's Doman Name System, to allow for local automomy, but in GridStat's



Fig. 14. Overview of GridStat

case via local policies. Additionally, this supports a divideand-conquer approach to the routing task.

## C. Routing in GridStat

Fig. 16 details the routing process within GridStat's architecture. Most status routers connect only to other status routers in the same domain. An *edge status router* has additional functionality to allow programs to publish and subscribe to status variables. A *border status router* interfaces with a status router outside its own domain, namely another border status router. The QoS broker that is the lowest common ancestor up the broker hierarchy controls its allocation.

When a subscriber subscribes to a status variable, a route is chosen from the publisher to the subscriber through status routers, using information on node and link delays. This route does not change during normal operation, unlike IP routing, for performance reasons. If a subscriber requests redundant paths, then one or more disjoint paths are also selected. Status variables are then delivered in parallel over these disjoint routes. This compensates for permanent and transient network and QoS router failures and also can provide for lower delivery latency (i.e., for the first copy of the status update to arrive) in the face of overload or cyber-attack.

## D. Implementation Status

GridStat has been under development for almost 3 years. An initial prototype was demonstrated at NIST in 2002, and a pilot demonstration project is underway at Avista, an electricity and gas utility in 5 Western US states, to evaluate GridStat's capabilities. The current GridStat prototype provides mechanisms to create and deliver status information, filter it at status routers based on the rates of "downstream" subscribers, and many optimizations. It includes a QoS management hierarchy where policies on allocation and security can be programmed. GridStat also includes a visualization subsystem which projects onto maps and stripcharts dynamic information about status variables, status routers, link delays, etc



Fig. 15. Status routers and QoS broker hierarchy





### E. Summary of Related Computer Science Work

A closely related communications infrastructure, namely a status dissemination framework, is PASS [32]. PASS provides information about the status of communication network resources, namely their availability (i.e., one-bit status variables). It is intended for military operations, where it has been fielded repeatedly, but optimizes heavily based on onebit variables because bandwidth is typically very scarce in its intended environment. PASS has low-level status delivery mechanisms, but only for one-bit data, not floating point or It also does not have a management integer data. infrastructure or any adaptation, and all subscribers must have the same QoS parameters such as rate or maximum latency. It also does not support redundant paths or other capabilities necessary for a large critical infrastructure such as an electric power grid.

Sienna is an Internet-scale publish-subscribe event notification framework [33]. It has flexibility in the way publisher-subscriber graphs are organized, but does not provide any QoS properties or management infrastructure. It also only delivers generic events, not status variables, and thus cannot perform any of the optimizations and management that GridStat does on status variables.

## F. Summary of Related Power Engineering Work

A number of distantly related efforts have come from the electric power research community and industry, but none are a useable framework with the scale and management needed for the electric power grid and other critical infrastructures. The work in [3] points out the major deficiencies in the current communication and information systems and propose a new information architecture tailored to the electric power grid, including different kinds of redundancy. GridStat provides most or all of the mechanisms and management systems that are seen as required by their analysis.

EPRI has also started the Infrastructure Security Initiative (ISI), which focuses in part on how to develop a secure private communication network for the power industry as an alternative to Internet-based systems [34]. It is not a deployable framework that can provide QoS guarantees, such as GridStat, or even an architecture for such a framework. NERCnet is a new communication infrastructure being developed by NERC. There is relatively little published about its details, but it seems to be a network infrastructure with no communication services such as GridStat to make it programmable and QoS controls or management infrastructure (at least not at the middleware or application layer).

EPRI has created the Utility Communications Architecture (UCA<sup>TM</sup>), version 2 [35]. It offers interconnectivity between devices and interoperability between databases. Still, UCA is only designed to operate within a single substation, does not guarantees, and has no management support QoS infrastructure. As such, it is unsuitable to be deployed beyond the substation level. Further, it is a standard, and not a technology. Still, the creation of a translation layer from UCA to GridStat could combine the best of both infrastructures and be of practical use. Indeed, the UCA standard [35] notes one of its benefits is the ability to incorporate future communications innovations, and discusses possible future expansion of the UCA protocol suite to other application protocols such as CORBA. This indicates that hybrid configurations with UCA being used within a substation and GridStat managing flows of packed UCA streams between substations and above them would likely being a feasible and pragmatic combination of the two technologies.

# V. DISCUSSION AND CONCLUSIONS

While the potential for improved control afforded by the new communication systems is great, the basic principles of designing a large complex system with high reliability requirements, such as, the power system, will force a conservative design. A system with great flexibility and functionality as proposed here may not lend itself to analysis and performance guarantees. The overriding concern in power systems engineering has been safety and reliability of the system. With or without deregulation, that is not expected to change. An extreme implementation of the proposed approach could easily create more problems than it solves. For example, the fundamental function of relays must remain protection though in this new framework it can take on a secondary role.

In the past, transient stability analysis and control methods have been based on differential-algebraic representation of the quasi-stationary power system dynamics. In the proposed realtime control framework, wherein the measurements and control signals travel over the communication network, the mathematical representation of the future power system must include the transmission and communication networks operating in parallel, serving the respective purposes of electrical power exchange and information exchange. A comprehensive model is needed to provide a platform for developing simulation, analysis and design tools. For example in transient simulation studies, there will be a need for including a rudimentary model of the protection, a representation of the delays in receiving measurement signals and a data flow model that shows the data available to each controller. The development of appropriate simulation tools is part of our on-going research.

The system we are proposing may also require system operators to have a very different feel for the system. Today, operators working in the control center rely on experience to sense when the system is becoming over stressed and can take appropriate remedial actions. With a more distributed structure, important control decisions could be made completely outside the view of the operators and at speeds far faster then the cognitive ability to track changes as already happens today with the SCADA alarms systems. Again, new tools for operator training will be needed.

The ultimate goal for the real time control, communication and computation schemes proposed here, is to control the dynamics directly without having to set special protection parameters. Although the available communication today is fast enough, the computation needed for such real time control is still very complex and poorly understood. This paper has discussed the various issues for real time stability control and the advances needed to make this feasible given the appropriate communication infrastructure.

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