



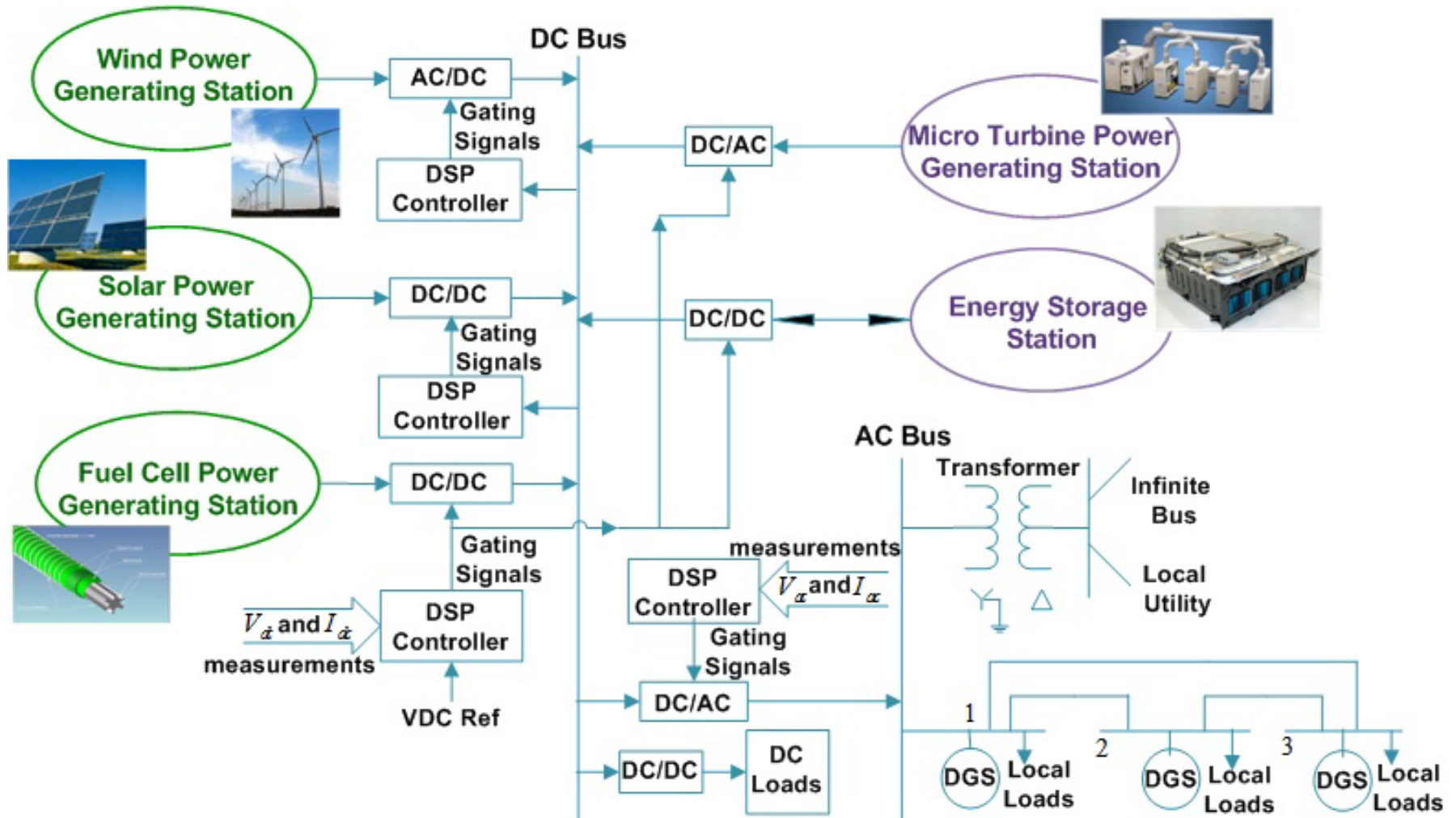
Adaptive Fault-Tolerant Control for Smart Grid Applications

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Smart Grid Distributed Generation System (DGS)



Smart Grid: Power Grid + Local Generation + Cyber (Internet) + Intelligent Fault-Tolerant Distributed Control + Real-Time Pricing

Sustainable Energy Technology



Benefits of DGS: Installation near to local loads; increased efficiency and reliability; peak load shaving; on-site standby power systems during grid outages; modular structure to facilitate system expansion; combined heat and power applications.

Key Research Areas

- Smart Grid Architecture
- Cyber Security
- Modeling and Control
- Smart Metering and Pricing
- Pervasive Monitoring

Challenges

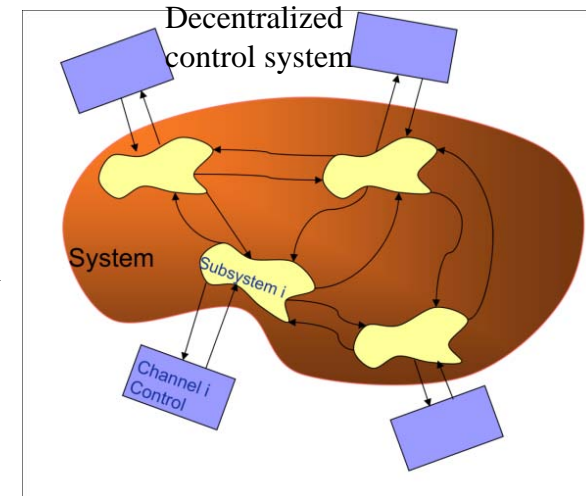
- Highly variable supply patterns ... stochastic problemstorage
- Efficient distributed algorithms required to process massive amounts of data for real-time control
- Adaptive and self-healing control algorithms required for attaining high efficiency, reliability, and security of the large-scale distributed system
- Secure protocols, firewall mechanisms, intrusion prevention

Control Problems

- Control of individual renewable energy, storage, and switching components in microgrid systems
 - Island mode:
 - Microgrid control system should ensure that real and reactive power are matched between local generation and load.
 - Control system should also provide voltage and frequency stability.
 - Load scheduling/shifting and load shedding.
 - Adapting to load changes that could be large relative to total load.
 - Grid-connected mode:
 - Performance principally determined by grid. Microgrid appears as single dispatchable unit.
 - Microgrid control system should ensure that the impact of the distributed generation and any islanding events do not adversely affect grid.
 - Specifically, voltage and current fluctuations, total harmonic distortion. Phase synchronization with the grid should be addressed while transitioning from island to grid-connected mode.
 - Local control mechanisms can improve power quality for loads within microgrid.

Control Problems (Contd.)

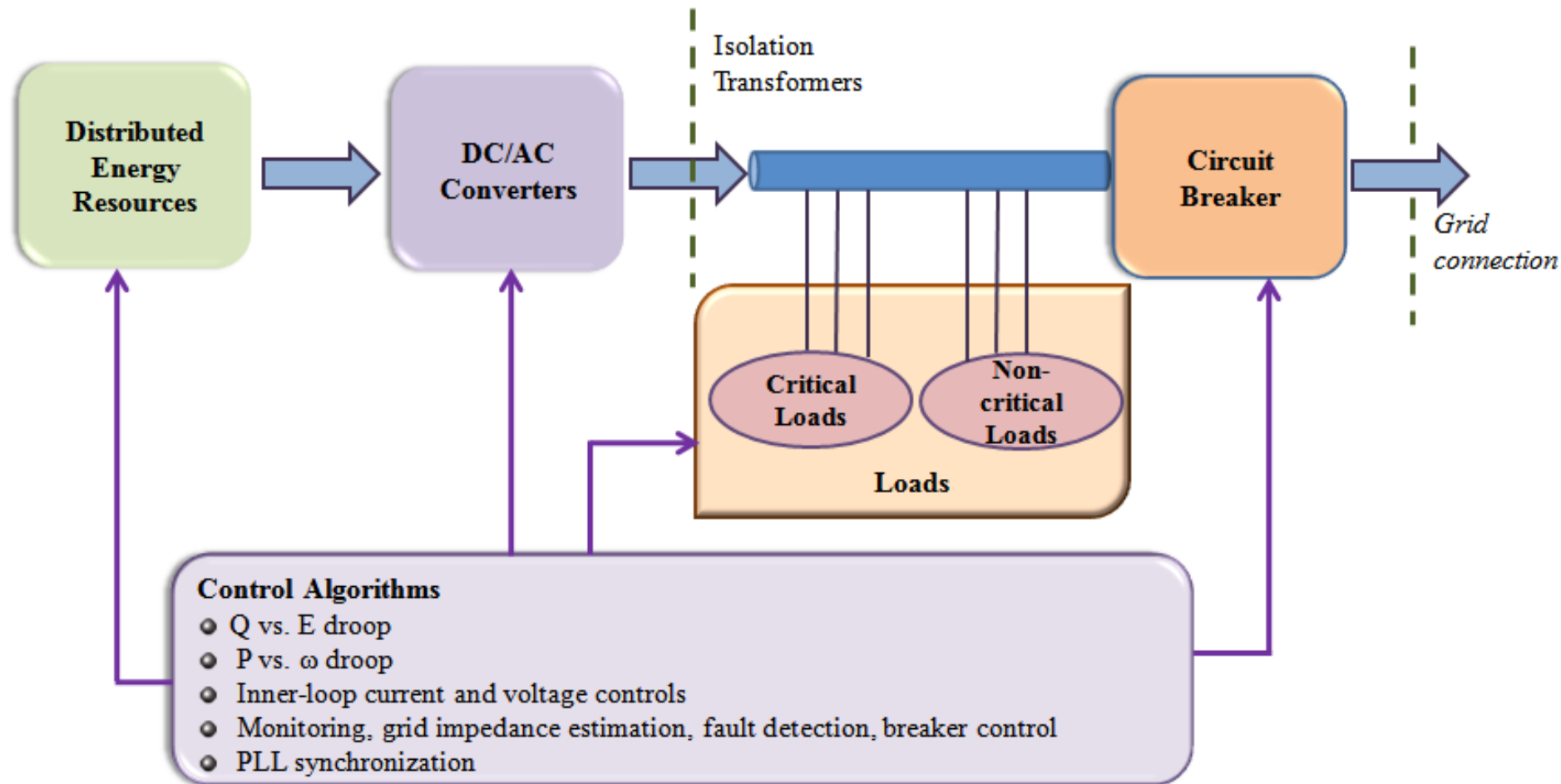
- Transitioning between island and connected modes
 - Monitoring grid conditions and detecting faults
 - Deciding when to disconnect
 - Preserving stability during transients
- Control aspects of the decentralized interconnected system
 - Multi-agent systems
 - Communication requirements and mechanisms
 - Distributed control



Control Objectives and Performance Metrics

- Frequency control ... deviation (in Hz) from nominal value
 - Performance expressed as combination of multiple factors such as maximum frequency deviation, interval within which frequency is contained for some percentage of total time, etc. – e.g., within 1 Hz of nominal value 95% of time and within 3 Hz of nominal value always.
- Voltage magnitude control ... deviation (as percentage) from nominal value
 - Performance expressed as combination of maximum deviation of voltage magnitude, maximum RMS deviation of sliding-window voltage magnitude signal during some percentage of total time, etc. – e.g. within 10% of nominal value always and RMS deviation of 5 min sliding-window within 15% during 5% of the total time.
- Control of total harmonic distortion (THD) ... performance expressed as THD measured over a sliding window of time (e.g., 0.2 s).
- Control of short-term transients (flickers) – response to fast-varying loads; performance expressed as maximum short-term transient voltage deviations, number of deviations in a sliding window of time, and response time for correction. Voltage magnitude and frequency control while switching from grid-connected to island operation.

Microgrid Control Structure



Multi-agent approach with plug-and-play framework and uniform communication protocol: DER control agents, User-side configuration agents, Monitoring and data recording agents, Island/connected transition control agents, Load scheduling agents, etc.

Microgrid Control Aspects

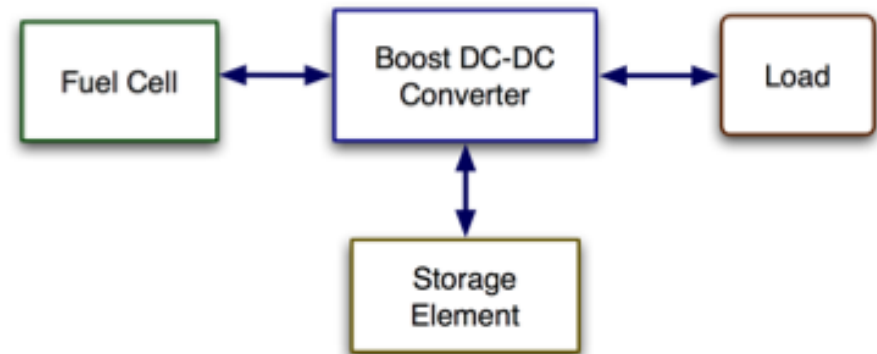
- Adaptive droop control:
 - ▶ Real power P :
 - ▶ Frequency droop (P vs. ω) : $\omega = \omega^* - \hat{\chi}_\omega (P - P^*)$
 - ▶ Angle droop (P vs. δ) : $\delta = \delta^* - \hat{\chi}_\delta (P - P^*)$
 - ▶ Reactive power Q :
 - ▶ Amplitude droop (Q vs. E) : $E = E^* - \hat{\chi}_E (Q - Q^*)$
 - ▶ Grid impedance estimation; $\hat{\chi}_\delta, \hat{\chi}_\omega, \hat{\chi}_E$ functions of online adaptation parameters
- Layered control hierarchy:
 - ▶ Primary control: P, Q droop
 - ▶ Secondary control: ω, E restoration and synchronization
 - ▶ Tertiary control: P, Q buy/sell decisions --- economic optimization
- Power sharing among DER microsources and storage elements in microgrid by appropriate droop control and synchronization; agent-based control structure

PEM Fuel Cell Based DG System

- Attractive features of PEM Fuel Cell : high power density, solid electrolyte, low operating temperature (50-1000C), fast start-up, low sensitivity to orientation, favorable power-to-weight ratio, long cell and stack life, and low corrosion
- Analysis of performance and the operating characteristics of stand-alone PEM fuel cell based DG system feeding to time-varying loads.
- Development of dynamic models for PEM fuel cell and its power conditioning unit (dc/dc boost converter, three-phase dc/ac inverter with L-C filter and transformer).
- Development of control techniques to achieve desired performance of the system.
- Determination of energy capacity of storage device that needs to be connected at DC bus

Desired Performance Characteristics of Stand-Alone PEM Fuel Cell Based DG System

- Provide output voltage to loads at magnitude 208 V(L-L)/120 V (L-N) and at 60 Hz frequency up to its rated value.
- Provide power during peak load demand and during load transients.
- Output voltage of the system must have low load regulation ($< 5\%$) - system must be able to maintain steady-state output voltage independent of load conditions up to its rated value.
- Provide output voltages with low total harmonic distortion (THD) – (Reduction in 5th and 7th harmonic)
- Protect itself from overload conditions such as short circuit faults.
- Maximize life of fuel cell and battery.



Modeling and System Identification of Fuel Cell Based DGS Unit

- Equations of operation based on physical principles; State space description of the system dynamics. System description contains:
 - Parametric uncertainties -- *estimated via Maximum Likelihood Estimation (MLE)*
 - Functional uncertainties --- *estimated via Neural Network (NN) modeling*

Reaction at anode: $2H_2 \longrightarrow 4H^+ + 4e^-$

Reaction at cathode: $O_2 + 4e^- + 4H^+ \longrightarrow 2H_2O$

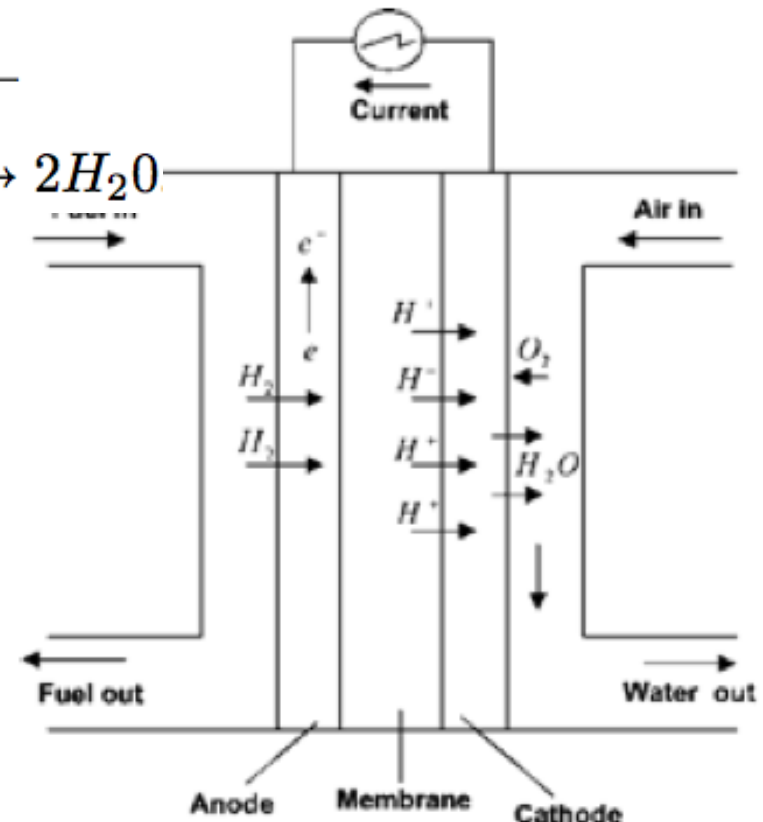
Open-circuit output voltage:

$$V_{O,FC} = n_s E_0^{Cell} + \frac{n_s RT}{2F} \ln \left[\frac{P_{H_2} (P_{O_2})^{0.5}}{P_{H_2O}} \right]$$

Output voltage:

$$V_{fc} = V_{O,FC} - n_S (V_{loss}^{Act} + V_{loss}^O + V_{loss}^{Conc})$$

$$\Rightarrow V_{fc} = n_s E_0^{cell} + \frac{n_s RT}{2F} \ln \left(\frac{x_5 \sqrt{x_6}}{x_7} \right) - n_S (a_0 + aT) - n_S x_{11} - n_S R^0 I$$



PEM Fuel Cell Modeling: State Space

$$\dot{x}(t) = A(\theta)x(t) + B(\theta)u(t) + G(\theta)w(t)$$

$$x = [(m_{O_2})_{net}, (m_{H_2})_{net}, (m_{H_2O})_{net}, T, P_{H_2}, P_{O_2}, P_{H_2O}, Q_C, Q_E, Q_L, V_C]^T$$

$$u = [u_{PA}, u_{PC}, u_{TR}]^T ; \quad w = [I] \quad y = \theta_7(x_4, x_5, x_6, x_7)$$

$$\theta = [\theta_1(x_4), \theta_2(x_4), \theta_3(x_4), \theta_4(x_4), \theta_5(x_7), \theta_6(x_4, x_5, x_6, x_7), \theta_7(x_4, x_5, x_6, x_7), \theta_8(x_4, x_5, x_6, x_7)]^T$$

$$A = \begin{bmatrix} -\frac{1}{\lambda_C} & 0 & 0 & 0 & 0 & 0 & 0_{1 \times 4} & 0 \\ 0 & -\frac{1}{\lambda_A} & 0 & 0 & 0 & 0 & 0_{1 \times 4} & 0 \\ 0 & 0 & -\frac{1}{\lambda_C} & 0 & 0 & 0 & 0_{1 \times 4} & 0 \\ 0 & 0 & 0 & \frac{-h_S n_S A_S}{M_{fc} C_{fc}} & 0 & 0 & 0_{1 \times 4} & 0 \\ 0 & 0 & 0 & 0 & -2\theta_1(x_4) & 0 & 0_{1 \times 4} & 0 \\ 0 & 0 & 0 & 0 & 0 & -2\theta_3(x_4) & 0_{1 \times 4} & 0 \\ 0 & 0 & 0 & 2\theta_5(x_7) & 0 & 0 & 0_{1 \times 4} & 0 \\ 0_{2 \times 1} & 0_{2 \times 1} & 0_{2 \times 1} & 0_{2 \times 1} & 0_{2 \times 1} & 0_{2 \times 1} & 0_{2 \times 4} & 0_{2 \times 1} \\ 0 & 0 & 0 & h_S n_S A_S & 0 & 0 & 0_{1 \times 4} & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0_{1 \times 4} & \frac{-1}{C(R^{Act} + R^{Conc})} \end{bmatrix}$$

$$B = \begin{bmatrix} 0_{3 \times 1} & 0_{3 \times 1} & 0_{3 \times 1} \\ 0 & 0 & \frac{h_S n_S A_S}{M_{fc} C_{fc}} \\ 2\theta_1(x_4) & 0 & 0 \\ 0 & 2\theta_3(x_4) & 0 \\ 0_{3 \times 1} & 0_{3 \times 1} & 0_{3 \times 1} \\ 0 & 0 & -h_S n_S A_S \\ 0 & 0 & 0 \end{bmatrix}$$

$$G = \left[\left(\frac{1}{4\lambda_C F} \right), \left(\frac{1}{2\lambda_A F} \right), \left(\frac{1}{2\lambda_C F} \right), -\theta_8, -\theta_2, -\theta_4, 2\theta_4, \theta_6, \theta_7, 0, \frac{1}{C} \right]^T$$

Modeling of Storage Element and DC-DC Boost Converter

Storage Element: Lead-Acid Battery

$$\dot{b} = i_b$$

$$v_b = E_b - i_b R_b$$

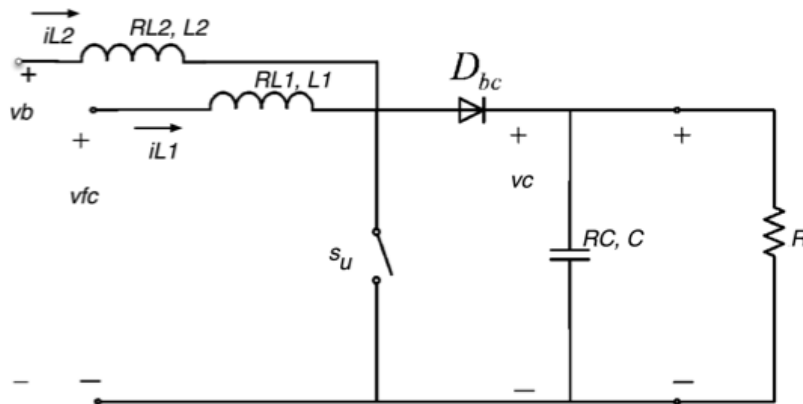
$$E_b = E_{b0} - K_b \frac{Q_b}{Q_b - b} + A_b \exp(-B_b * b)$$

v_b : output voltage at the battery terminals

i_b : current supplied by the battery

E_b : no-load (open-circuit) voltage of the battery

Boost DC-DC Converter: Time-averaging to capture dynamic models for switch-closed and switch-open conditions



$$\dot{i}_{L1} = \frac{1}{L1} v_{fc} - \frac{R_{L1}}{L1} i_{L1} + (1 - D_s) \left[-\frac{R}{(R + R_C)L1} v_C - \frac{RR_C}{(R + R_C)L1} (i_{L1} + i_{L2}) \right]$$

$$\dot{i}_{L2} = \frac{1}{L2} v_b - \frac{R_{L2}}{L2} i_{L2} + (1 - D_s) \left[-\frac{R}{(R + R_C)L2} v_C - \frac{RR_C}{(R + R_C)L2} (i_{L1} + i_{L2}) \right]$$

$$\dot{v}_C = -\frac{1}{(R + R_C)C} v_C + (1 - D_s) \frac{R}{(R + R_C)C} (i_{L1} + i_{L2})$$

D_s : duty cycle of the switching input s_u

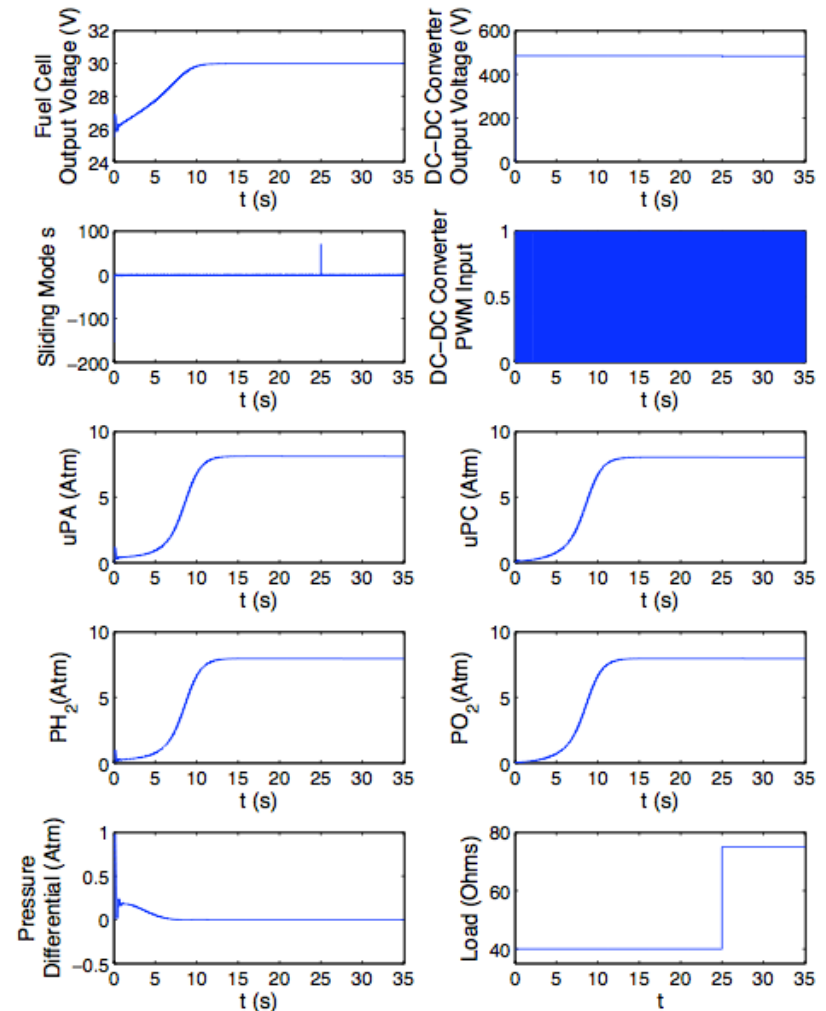
Control Objectives for PEM Fuel Cell Based DG System

- *DC-DC voltage tracking objective*: Given a desired output voltage trajectory $V_{DC,des}(t)$, the output of the DC-DC converter should track $V_{DC,des}(t)$.
- *Fuel cell voltage tracking objective*: The output of the PEM fuel cell should track a (nominally constant) desired voltage V_{des} — typically chosen to be equal to the constant nominal voltage of the storage element.
- *Pressure differential minimization objective*: The signal $|P_{H_2}(t) - P_{O_2}(t)|$ should be minimized. This helps in reducing membrane degradation effects.

Available Control Inputs: Switching command signal to the DC-DC converter and the channel pressures of hydrogen and oxygen being supplied to the fuel cell

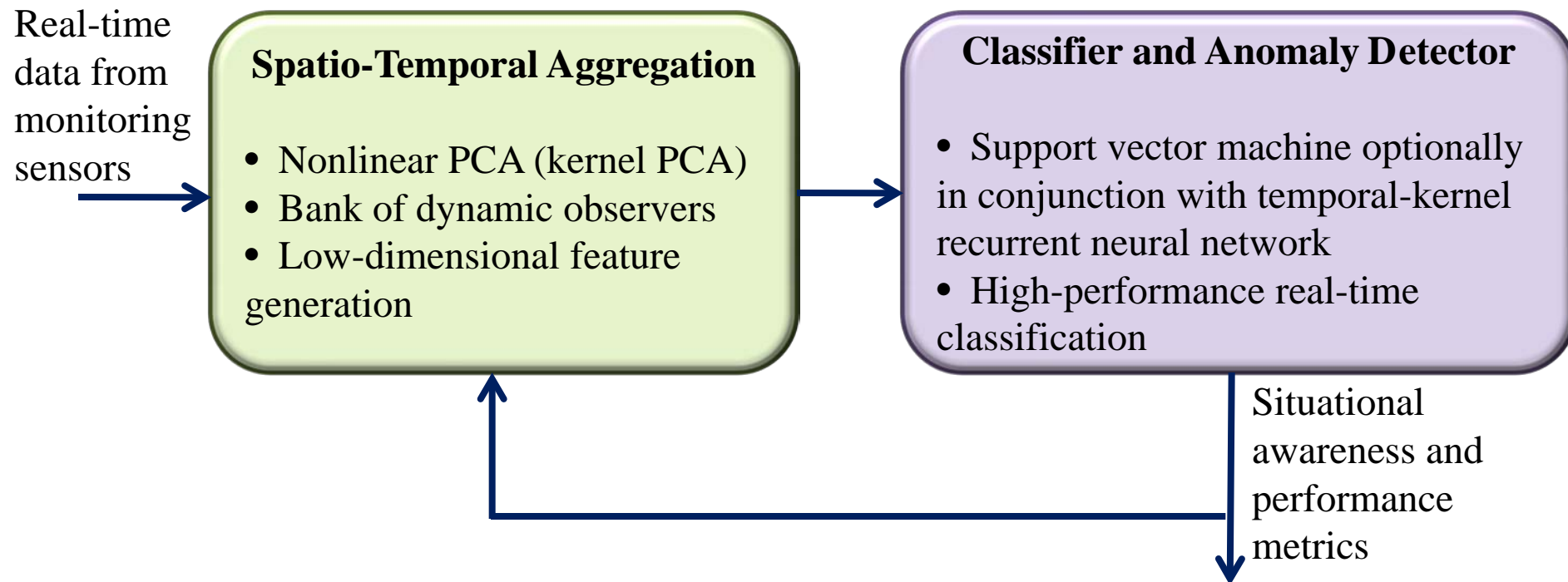
Control Design for PEM Fuel Cell Based DG System

- Lyapunov-based adaptive control design technique for fuel cell
 - Robust to parametric and functional uncertainties in system dynamics
- 9 x 1 parameter vector for adaptation
- Simultaneously addresses voltage tracking and pressure differential minimization
- Sliding mode control design for DC/DC boost converter ... alternatively, PI controller + PWM switching



- 48 stack PEM fuel cell
- Desired output voltage of fuel cell and DC-DC converter = 30 V and 480 V, respectively
- Step load change at $t = 25$ s

Smart Grid Monitoring and Anomaly Detection



Cyber-Controlled Smart Grid

