# Dynamic Power Management based on variations in Workloads and Hardware

# Roadmap

- Motivation
- System-level DPM
- 2-State PSM
- Oracle power policy
  - Break even time (policy parameter)
- Power Management Policies
  - TimeOut
  - Predictive
  - Stochastic
- Adapting to process variations

#### Motivation

- Longer operation of battery operated and performance constrained portable devices.
- Reduce operation cost of stationary systems.
- Minimize the impact on environment heat dissipation and cooling-induced noise.
- Avoid performance deterioration due to uncontrolled rise in temperature.

# System Level DPM

- Power Manageable Components (PMC)
  - Multiple modes of operations that span power/performance trade-off.
    Modeled as Power State Machine (PSM)
  - Transition overheads
- Power Manageable System
  - Set of interacting PMC's and non-PMC's
- Power Manageable Network
  - Actively communicating systems
  - Predict communication patterns
  - Decentralized power management



PSM

# System Level DPM

- Task of system level power manager
  - If a PMC is idle and it saves power and thus, cost, to be in a low-power state, then switch the state.
  - This requires, for every PCM
  - Knowledge of the idle periods i.e. workload model
  - Power/performance characteristics of each state i.e. power state machine



#### 2-State PSM

#### • We shall be using 2 state PSM



# **Oracle Power Policy**

- Assumptions
  - Workload is known a priori
  - Power characteristics of states are known and fixed
- Break Even Time  $(T_{be})$ 
  - $T_{idle}$  that is long enough to compensate for transition power overheads. So, in case, transition happens at the beginning of  $T_{idle}$  and  $T_{idle}=T_{be}$  then, net power consumed in transitions and low power state (OFF) would be equal to the power consumed in high power state (ON), if transition won't have happened.
  - Policy parameter
- Policy says if  $T_{idle} > T_{be}$ , then transition will happen.
- Ideal policy

#### **Power Management Policies**

- Classified based on the prediction method whether  $T_{idle} > T_{be}$ .
  - Time Out
  - Predictive
  - Stochastic

Each one can be adaptive or non-adaptive

### Time Out

- If,  $T_{idle} > \tau \Rightarrow T_{idle} > \tau + T_{be}$ , where  $\tau$  is the time out value.
- Disadvantage: Power wasted during the time out period

Types of time out policies:

- Fixed Time Out (non-adaptive)
- Adaptive Time Out (ATO)
  - $\tau_{\rm new}$  is updated depending upon ratio of  $\tau_{\rm old}$  and previous idle period.
  - Ratio too small, increase  $\tau$ , else if too large, decrease  $\tau$ .
- Device Dependent Time Out (DDT)
  - $-\tau$  is set to  $T_{be}$
  - Atmost twice the energy of 'oracle' policy is consumed

### Predictive

- Predict the length of idle period before it begins, thus eliminating the time out period.
- Predictions based on previous busy, predicted idle periods and/or actual idle period(s)
- Adaptive learning tree
  - Similar to multi-bit branch prediction in  $\mu P$
  - Based on history of the node and confidence level
- Exponential Average policy  $\rho[n+1] = a * I[n] + (1-a) * \rho[n], a < 1$

### Stochastic

• Models arrival of requests and device power state changes as controlled Markov processes.



 Optimal probability for the device to sleep is obtained from solving stochastic optimization problem

# Stochastic

#### Static Approach

- *A priori* knowledge of Markov model for Service Provider (system states) and Service Requester (workload)
- Adaptive Approach
  - Accounts for non-stationary nature of the workloads. Uses policy pre-characterization, parameter learning and policy interpolation.

# Stochastic

#### Can account for

- Multiple low power states
- Uncertainty in system power consumption and transition times
- Compute globally optimum solution
- Explore trade-offs between power and performance in a controlled fashion
- Disadvantage: Performance and power obtained by this policy are expected values

# Hardware Variations Aware

### Methodology

- Mean value based policy is sub-optimal
- Policy parameter value, T<sub>be</sub> needs to derived to optimize power consumption distribution instead of deterministic measure of power.
- Two approaches to
  - Design specific: A set of parameter values are derived to be used across all instances, in order to optimize a specific metric of power consumption distribution.
  - Chip specific: Specific to an instance of a chip, set of optimal parameter values is derived depending on its power characteristics