



# Adaptive Load Management<sup>1</sup>

From the End User, through the Aggregator,  
to the Wholesale Market and Back

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    - ❖ Load aggregators → end-users

# Motivation

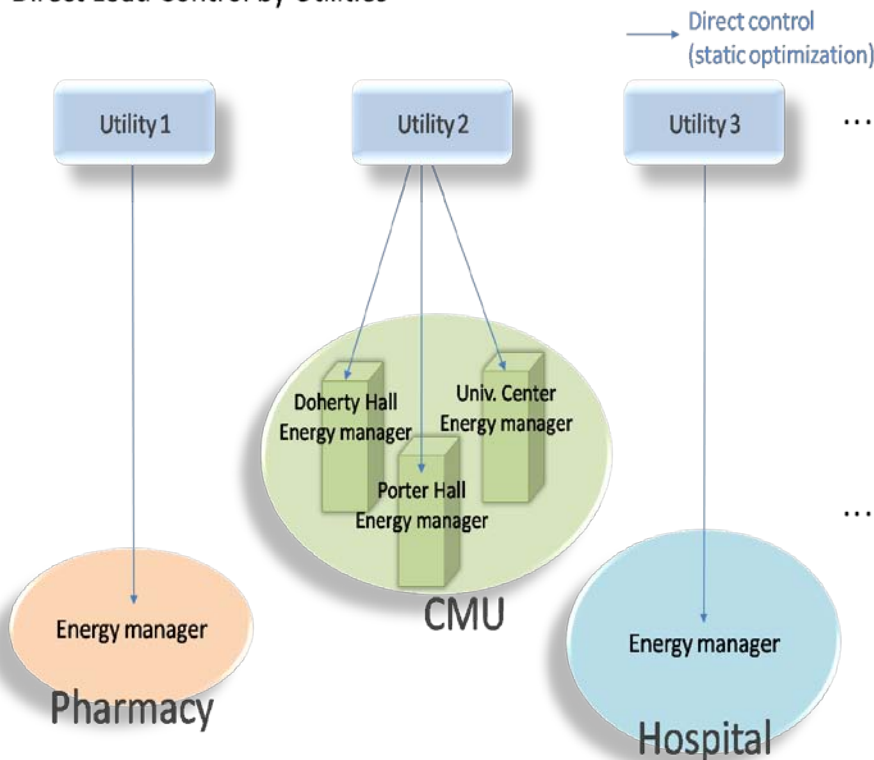
- ❖ Higher needs for load management resources
  - More uncertainty supply side due to increasing portion of renewable energy sources such as wind power
  - Building generation/transmission capacity becoming more burdensome
- ❖ Traditional load management
  - Top-down control from higher level (system operators)
  - Little transparent incentive to end-users to participate
  - No consideration of end-users' different preferences e.g. school and hospital energy needs different

# The main ideas

- ❖ Incorporate different **end-users' needs and preferences** into load management scheme
  - At some time point, some users are willing to pay a certain price while others are not.
- ❖ Mapping preferences into economic preferences
  - Different people have different willingness-to-pay (WTP)'s.
  - WTP  
: maximum monetary amount that an individual would pay to obtain a good
- ❖ Top-down control of loads → two-way communicative and adaptive control

# Previous load management systems: Direct load control

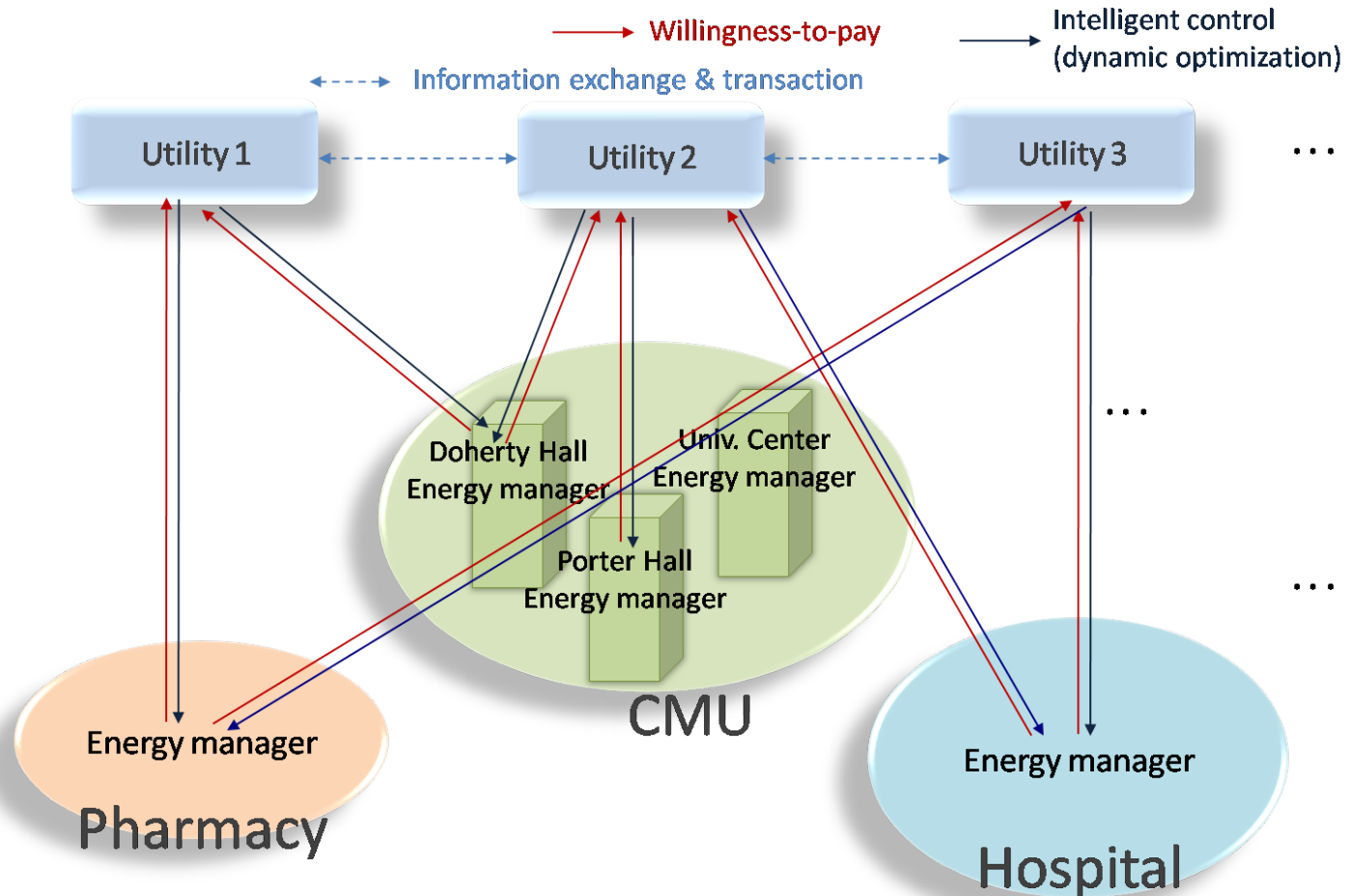
Direct Load Control by Utilities



- ❖ One-way flow of information
  - Load management conducted by utilities
  - Top-down control
- ❖ Exclusive contracts between supply and demand
- ❖ Direct load control
  - Regardless of end-users' preferences
  - No access to market information for end-users/energy managers

# Adaptive Load Management

DYMONDS-Based Adaptive Load Management  
– Interactive Method of Utilities & Energy Managers



# Adaptive Load Management

## (cont'd)

- ❖ Two-way flow of information
  - Information of end-users' economic preferences (willingness-to-pay; WTP) sent to higher control level
  - Utility having more information on the lower/demand level to make
  
- ❖ Multiple contracts (allowed) between supply and demand
  - Competition between utilities for better service
  - Local optimization for more economic transactions on demand side

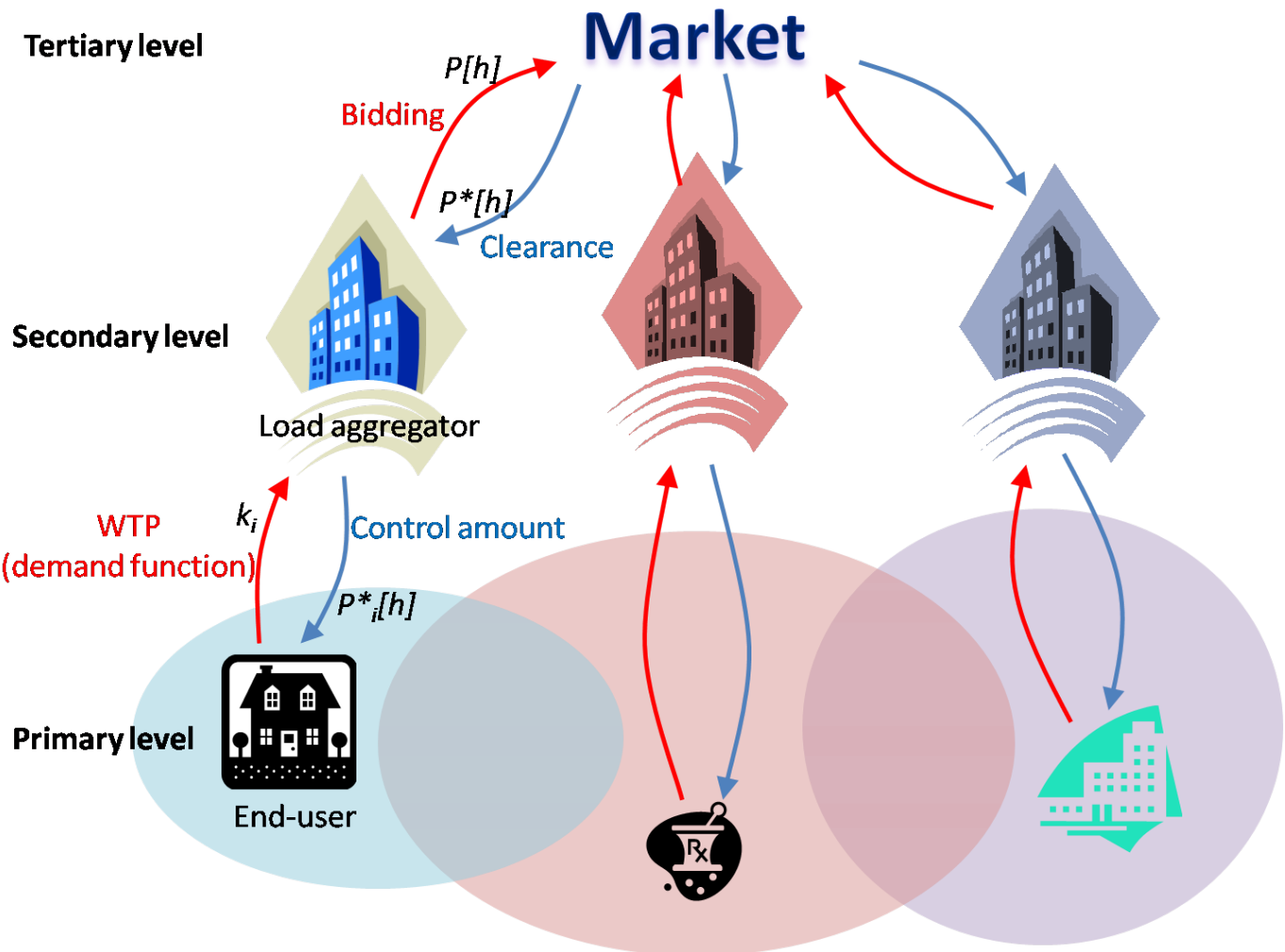
# Adaptive Load Management

## (cont'd)

- ❖ Intelligent load management with more end-users' information
  - Multiple levels of decision-making criteria
  - $\max$  {system efficiency},  $\max$  {utilities' profits},  $\min$  {energy costs of end-users},  $\max$  {end-users' benefits}



# Information flow of Adaptive Load Management

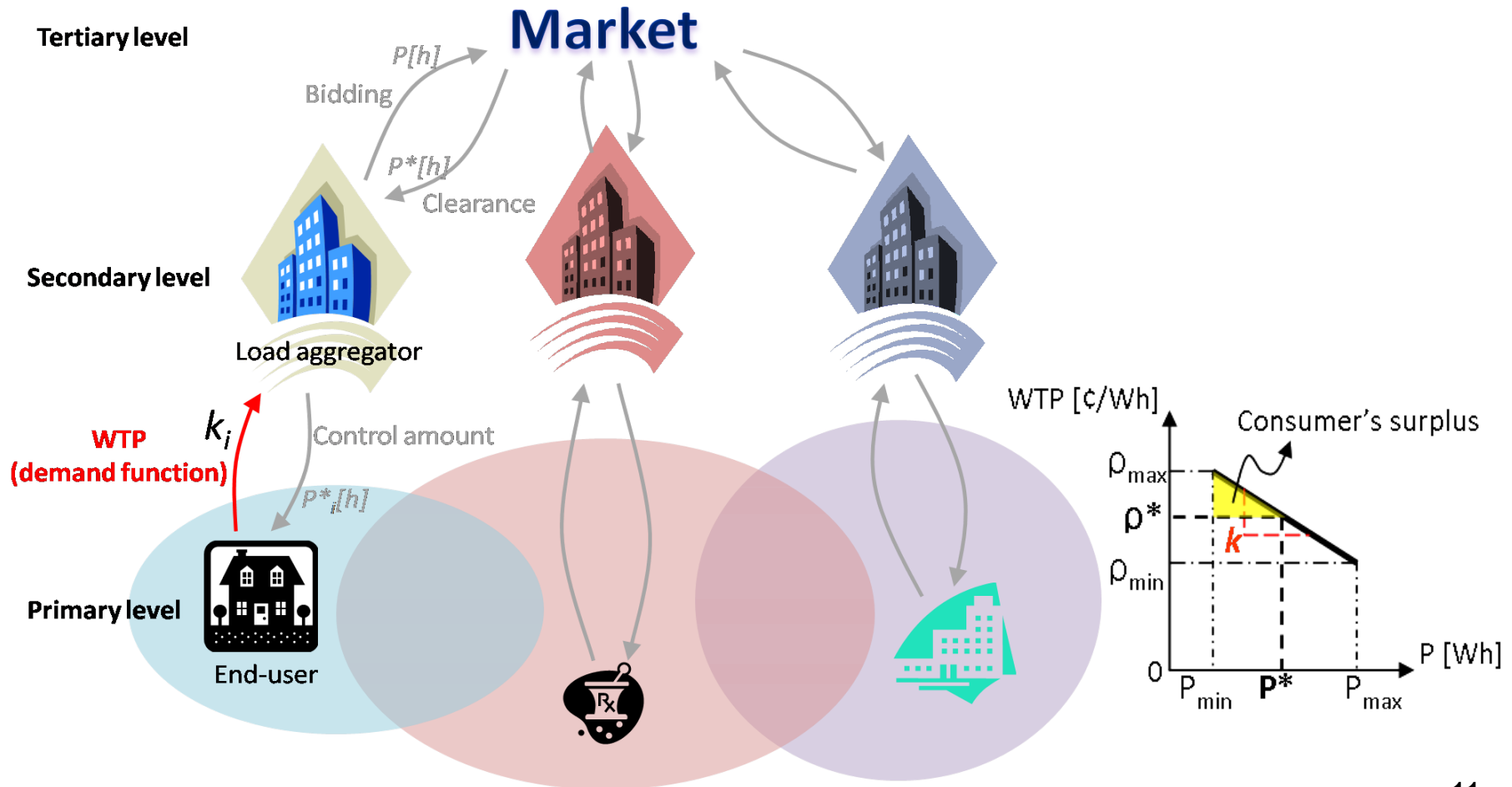


# Information flow of Adaptive Load Management

## (cont'd)

- ❖ Primary level (from end-users to load aggregators)
  - Physical preference → economic preference
  - Optimal energy usage
- ❖ Secondary level (from load aggregators to market)
  - Optimizing producers' + consumers' surplus
  - Optimal energy usage / market transaction
- ❖ Back to primary level (from load aggregators to end-users)
  - Energy usage adapted: allocated by hours
  - Optimal energy usage in a shorter-time interval

# Multi-layered adaptive load management – end-users to LAs



# Multi-layered adaptive load management – end-users to LAs

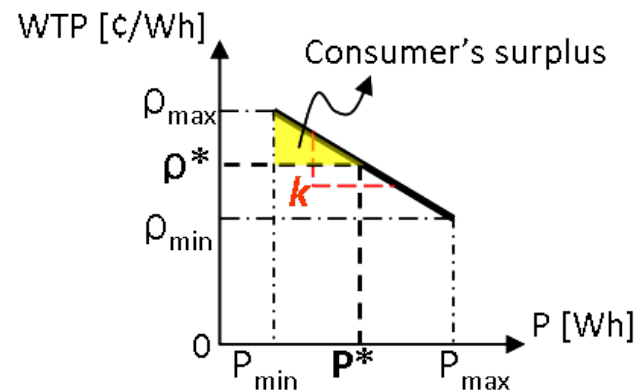
- ❖ Obtaining individual demand function subject to temperature comfort level

$$\min_{P_i[h]} J_i = \sum_{h=h_0}^{h_0+N} \left[ \hat{\rho}[h] \cdot P_i[h] + \left\{ (T_i[h] - T_i^{\max})^2 + (T_i[h] - T_i^{\min})^2 \right\} \right]$$

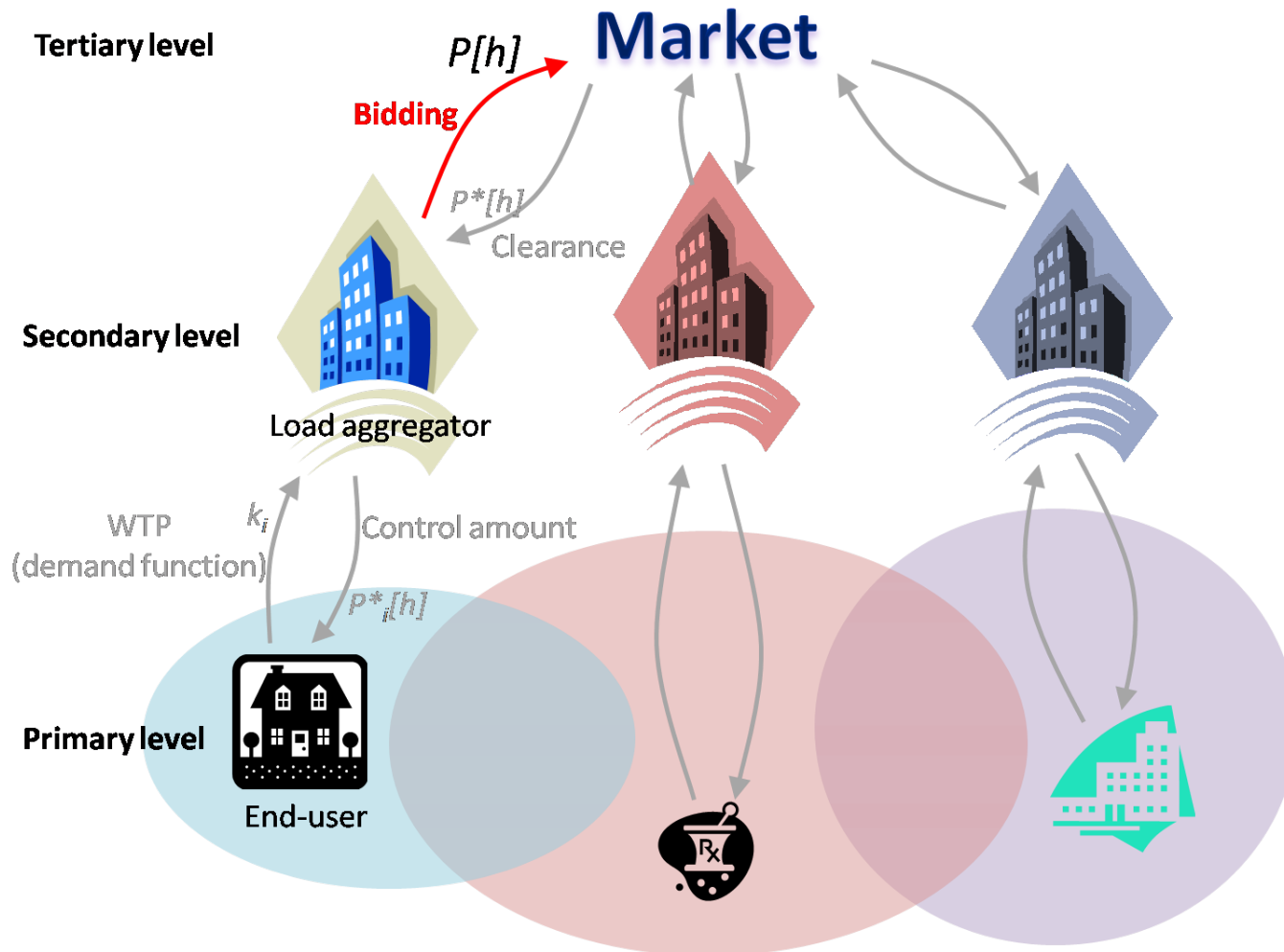
where  $T_i[h+1] = A_i T_i[h] + B_i P_i[h]$

subject to  $T_i^{\min} \leq T_i[h] \leq T_i^{\max}$  for all  $h$

- ❖ Obtain different  $P_i[h]$  s for different  $\hat{\rho}[h]$ s to infer  $k_i$   
 → Analogous to sensitivity analysis



# Multi-layered adaptive load management – LAs to market



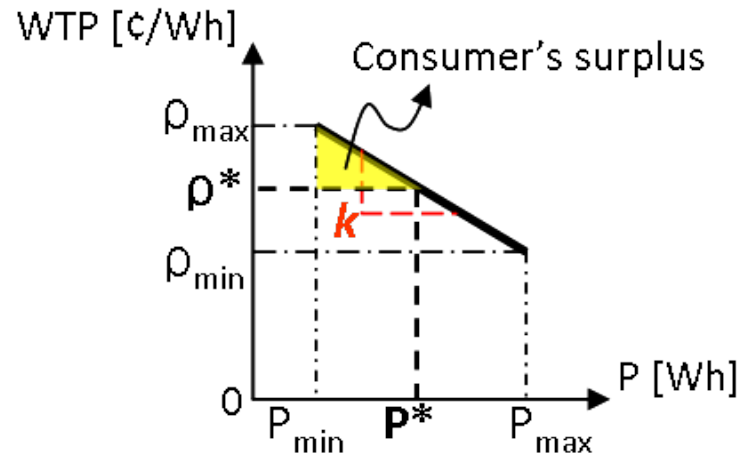
# Multi-layered adaptive load management– **LAs to market**

- ❖ Optimizing individual power usage based on end-user's WTP

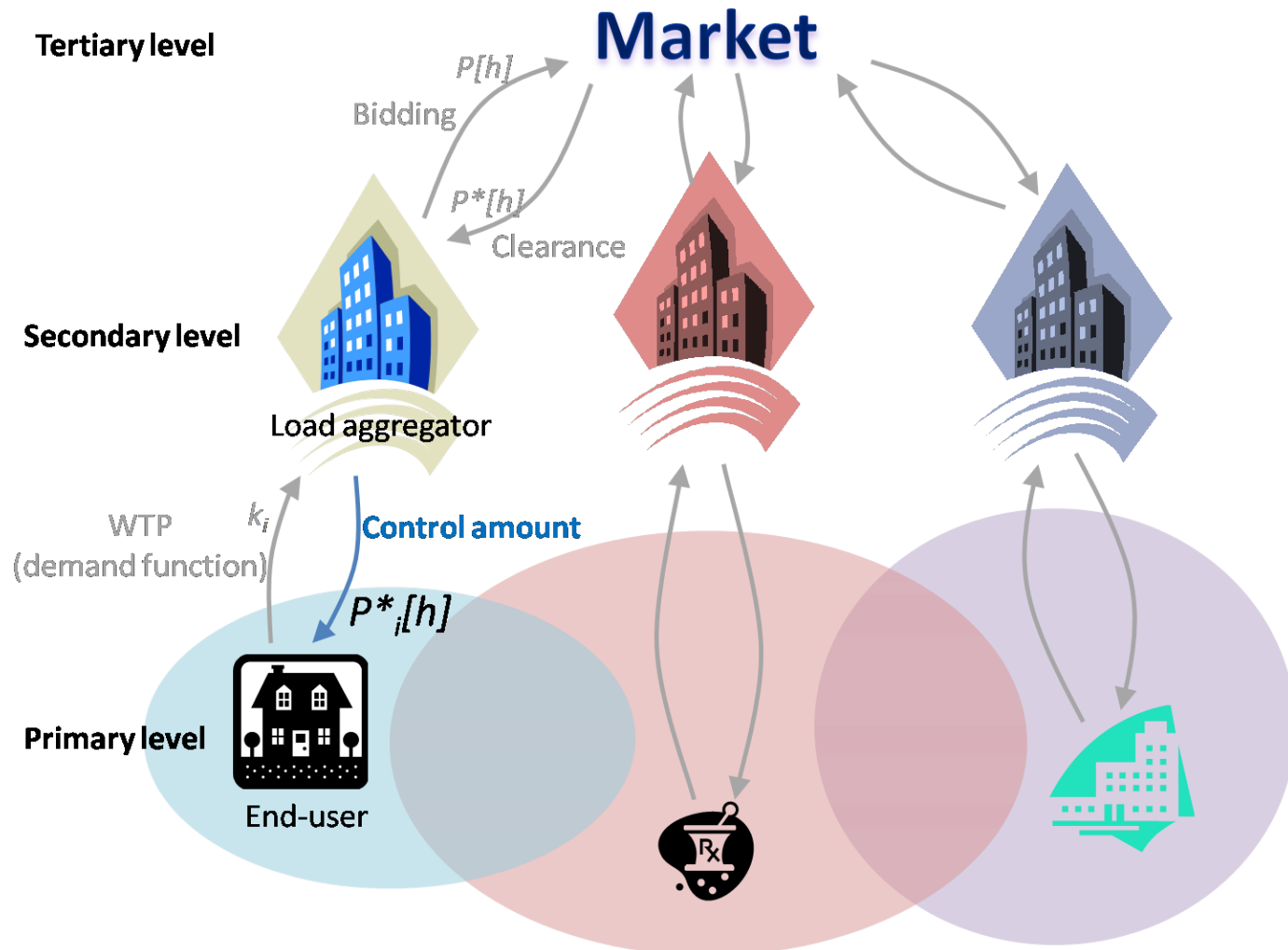
$$\min_{P_i(t)} \sum_{i=1}^N \sum_{t=t_0}^{t_f} \left\{ (\rho(t) - r_n(t)) P_i(t) - (P_i(t) + P_{i,\min}) (\rho_{i,\max} - \rho(t)) \right\}$$

subject to  $P_{i,\min} \leq P_i(t) \leq P_{i,\max}$  for all  $i, t$

- ❖ Variations possible depending on different end-user rates/pricings



# Multi-layered adaptive load management – LAs to end-users



# Multi-layered adaptive load management– **LAs to end-users**

- ❖ Optimizing real-time power consumption subject to energy control amount over an hour-interval given from load aggregator

$$\min_{P_i(t)} \sum_{t=t_0}^{t_0+12} \left[ r_n(t) \sum_{i=1}^N P_i(t) - \sum_{i=1}^N (P_i(t) + P_{i,\min}) (\rho_{i,\max} - \rho(t)) \right]$$

$$\text{subject to } \sum_{t=t_0}^{t_0+12} P_i(t) \leq P_i^* \text{ for all } i, t$$



# Conclusion

- ❖ Load adaptive management
  - Two-way demand-side management
  - Multi-layered decision making process
  - Including end-users' individual economic preferences

# Thank you!

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