

# cutting the electric bill for internet-scale systems

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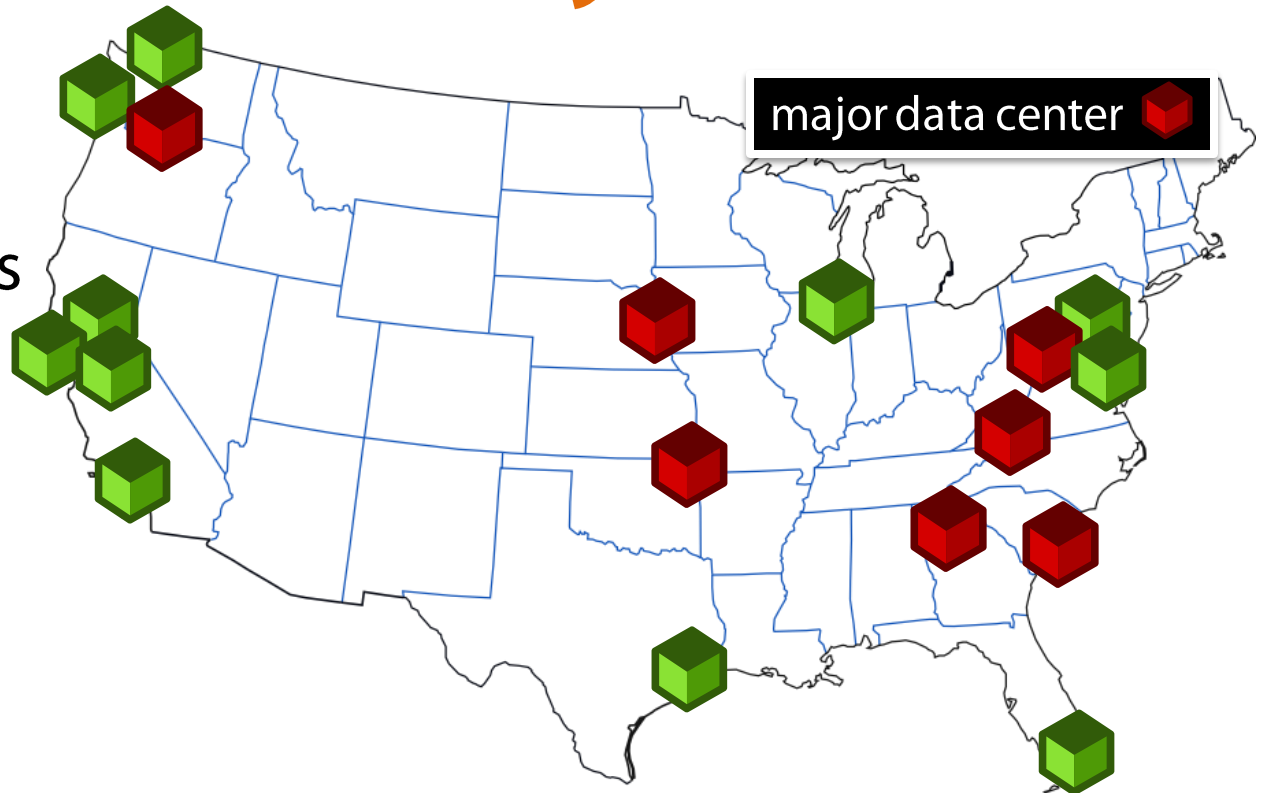
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# context: massive systems

## Google:

- ▶ estimated map
- ▶ tens of locations in the US
- ▶ >0.5M servers



## others

- ▶ thousands of servers / multiple locations
- ▶ Amazon, Yahoo!, Microsoft, Akamai
- ▶ Bank of America ( $\approx 50$  locations), Reuters

# electricity expenses

## millions spent annually on electricity

- ▶ Google ~ 500k custom servers ~ \$40 million/year
- ▶ Akamai ~ 40k off-the-rack servers ~ \$10 million/year

## electricity costs are growing

- ▶ systems are rapidly increasing in size
- ▶ outpacing energy efficiency gains

## relative cost of electricity is rising

- ▶ 3-year server total cost of ownership by 2012:
  - › **electricity**  $\approx 2 \times$  **hardware**
- ▶ bandwidth prices are falling

# what is being done

## reduce number of kWh

- energy efficient hardware
- virtualization and consolidation
- power off servers when possible
- cooling (air economizers instead of chillers, etc.)
- dc power distribution, etc.

## reduce cost per kWh

- build data-centers where average price is low

# our proposal

## **exploit electricity market dynamics**

- geographically uncorrelated price volatility
- monitor real-time market prices and adapt request routing

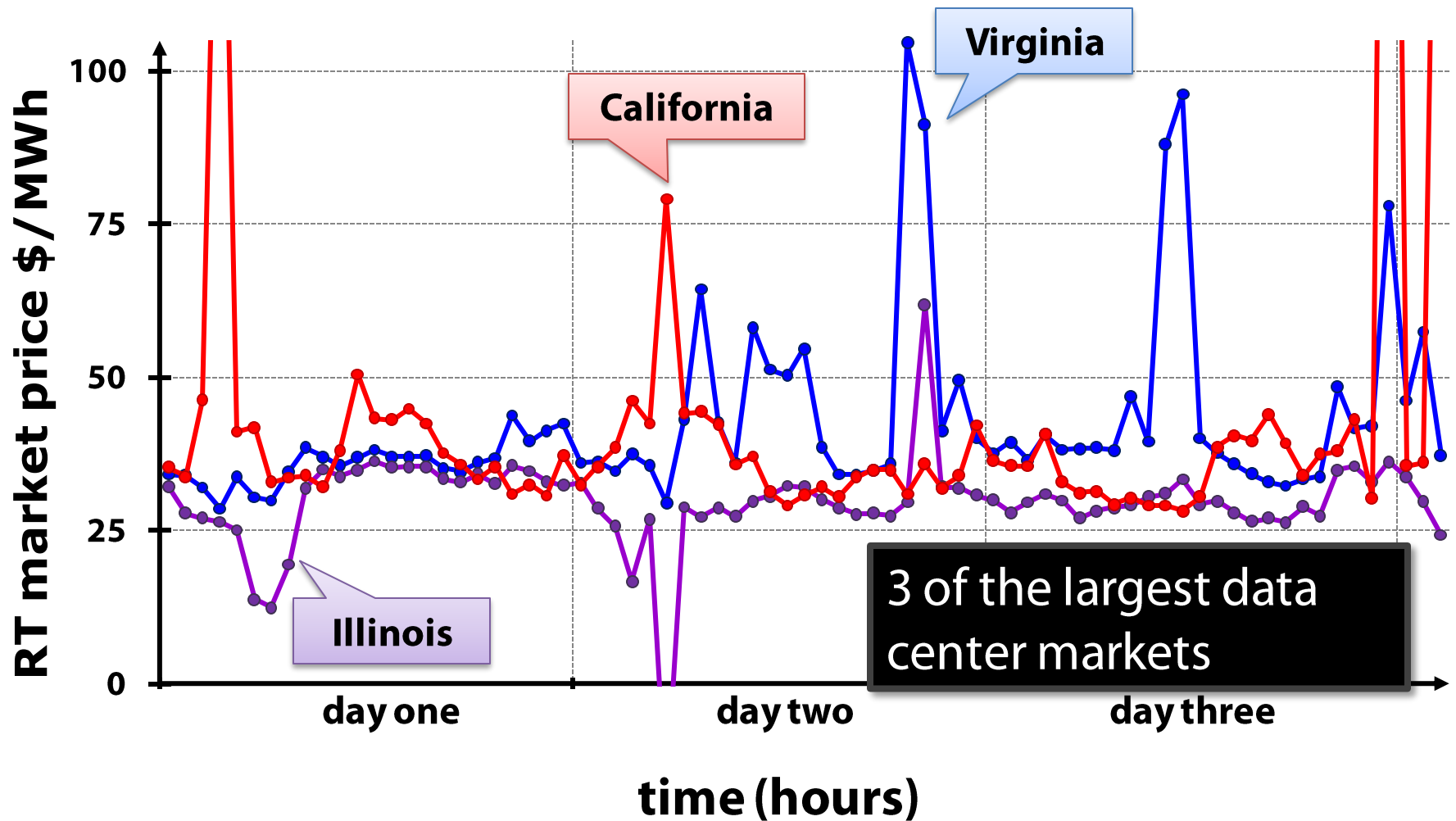
## **skew load across clusters based on prices**

- leverage service replication and spare capacity

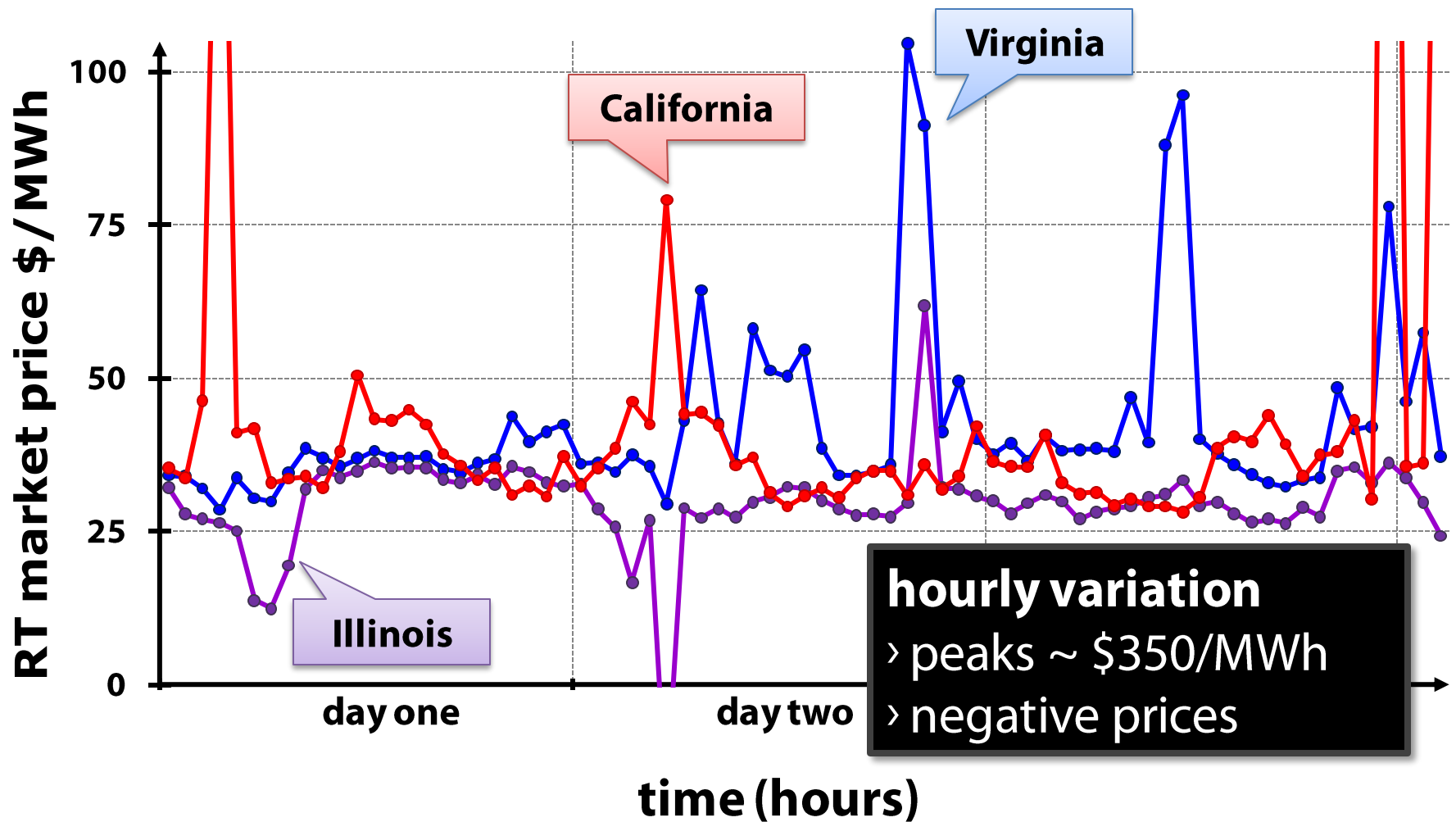
## **adapting to real-time prices is a new idea...**

- complementary to energy efficiency work

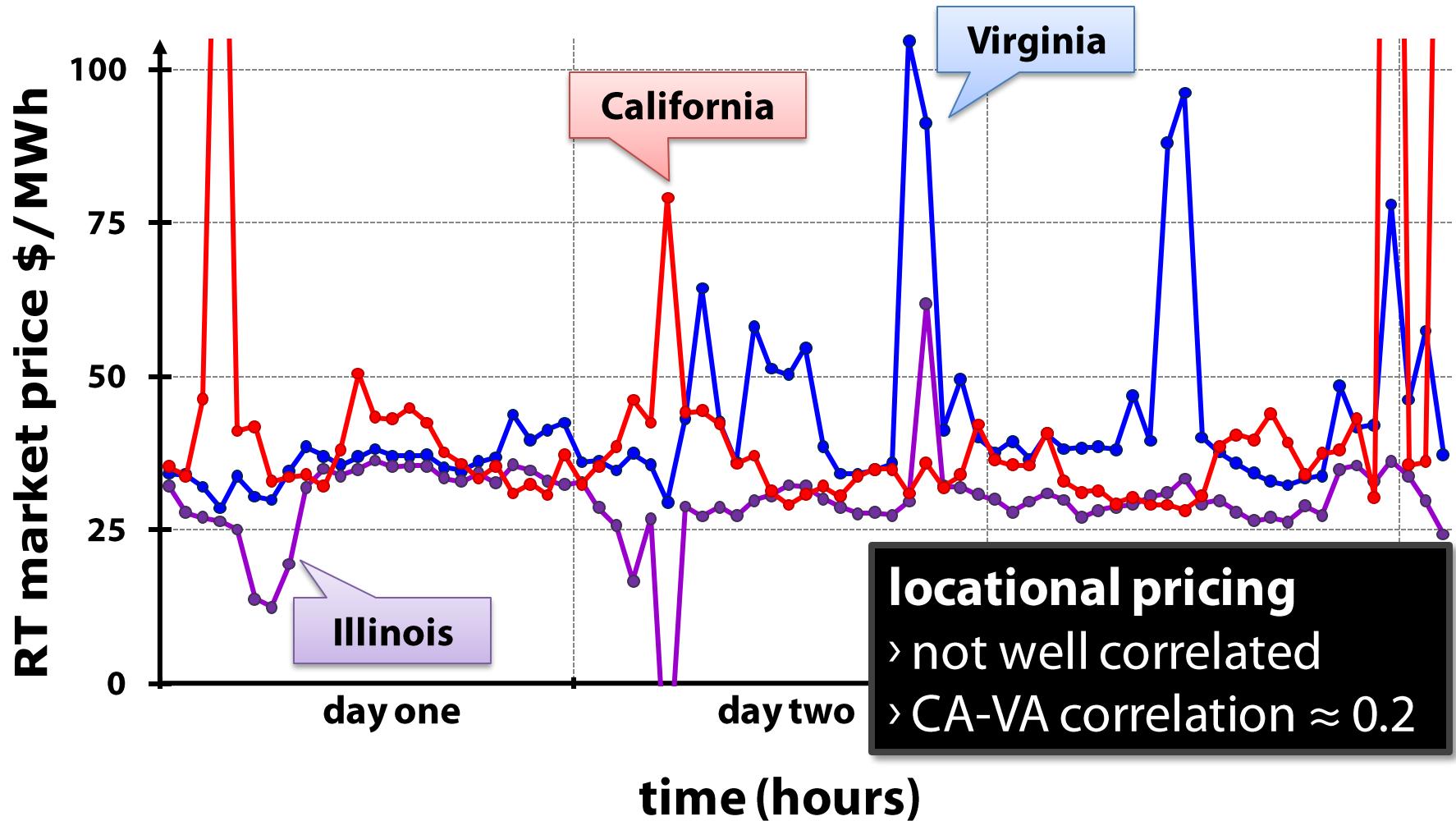
# exploiting price volatility



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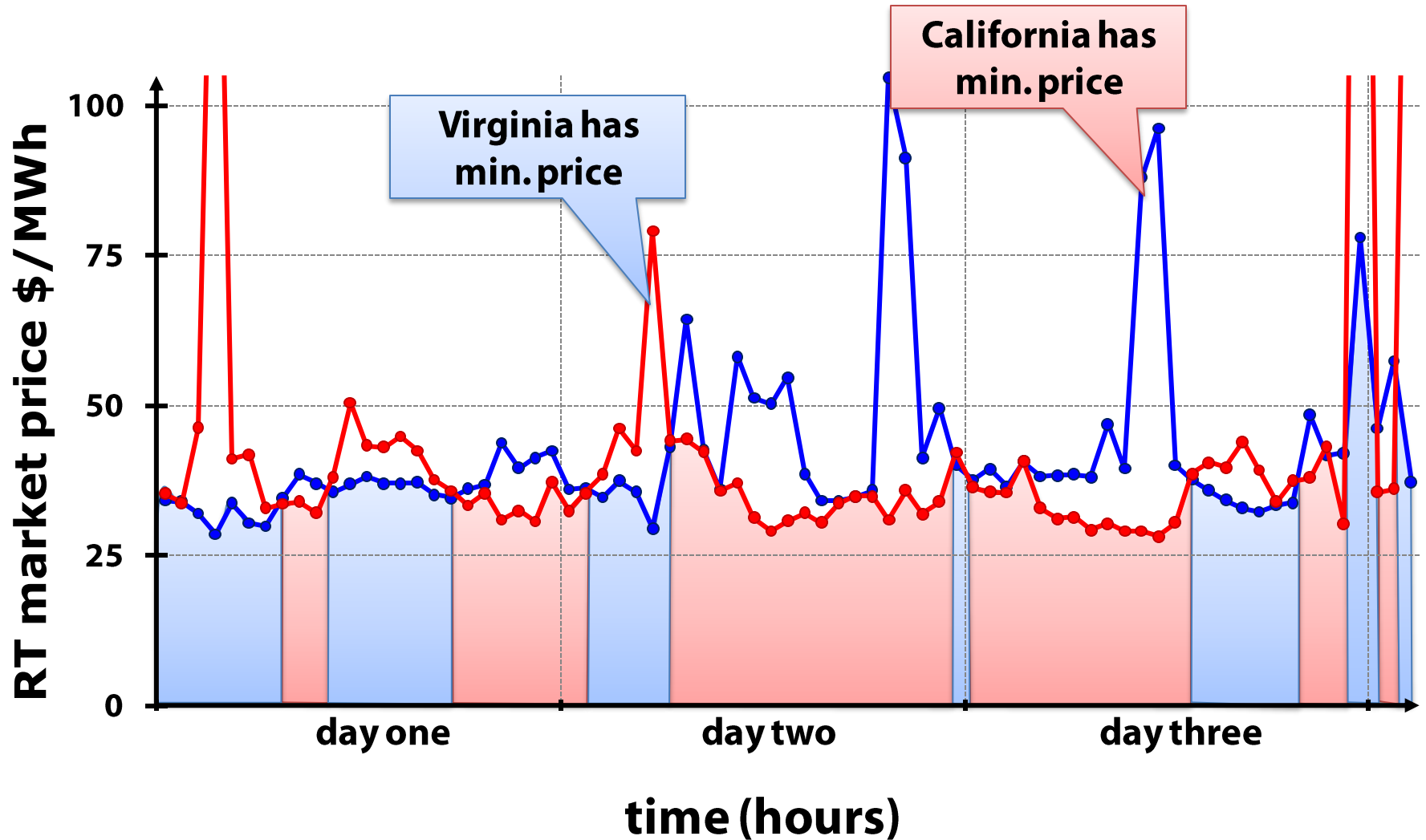


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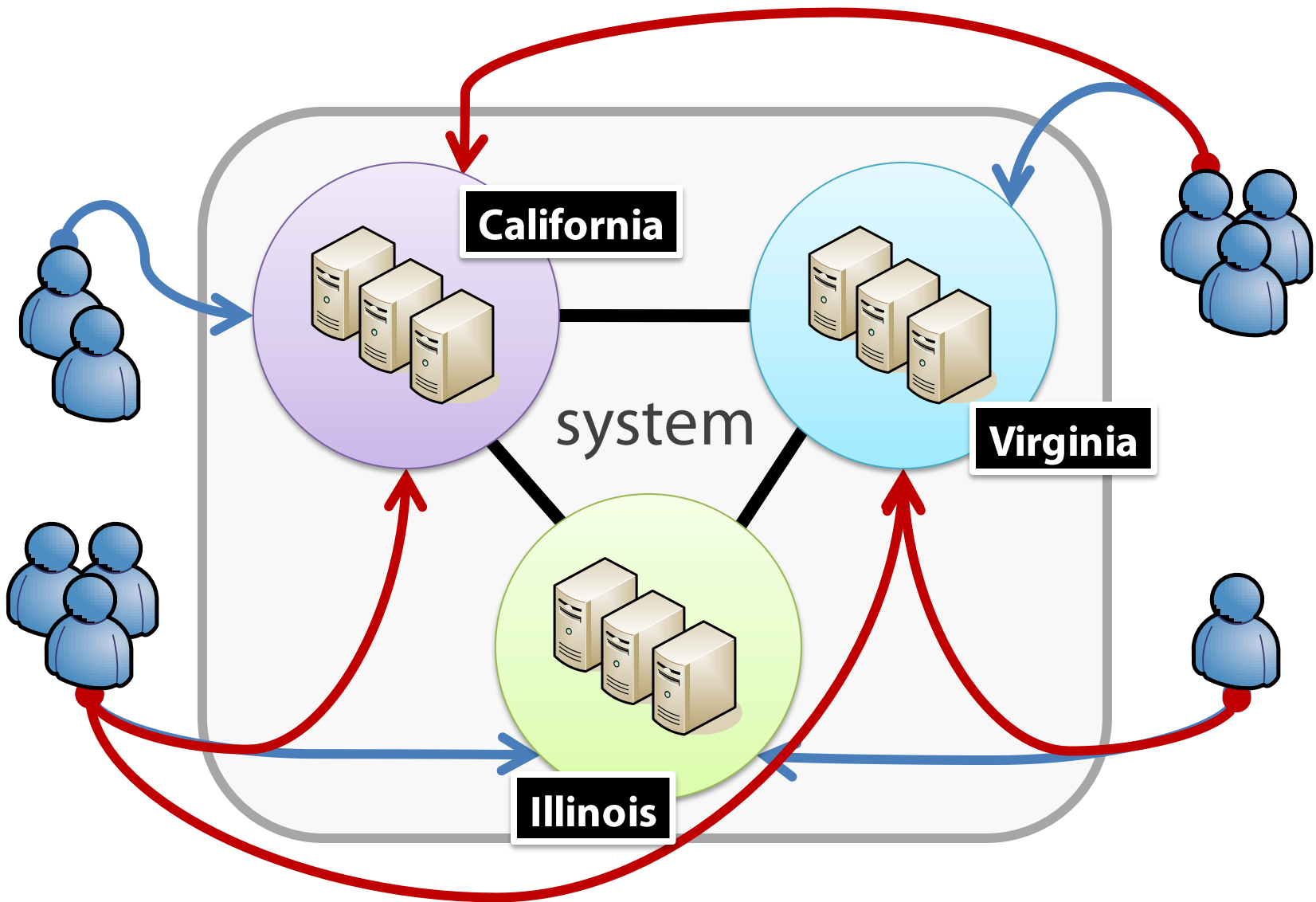




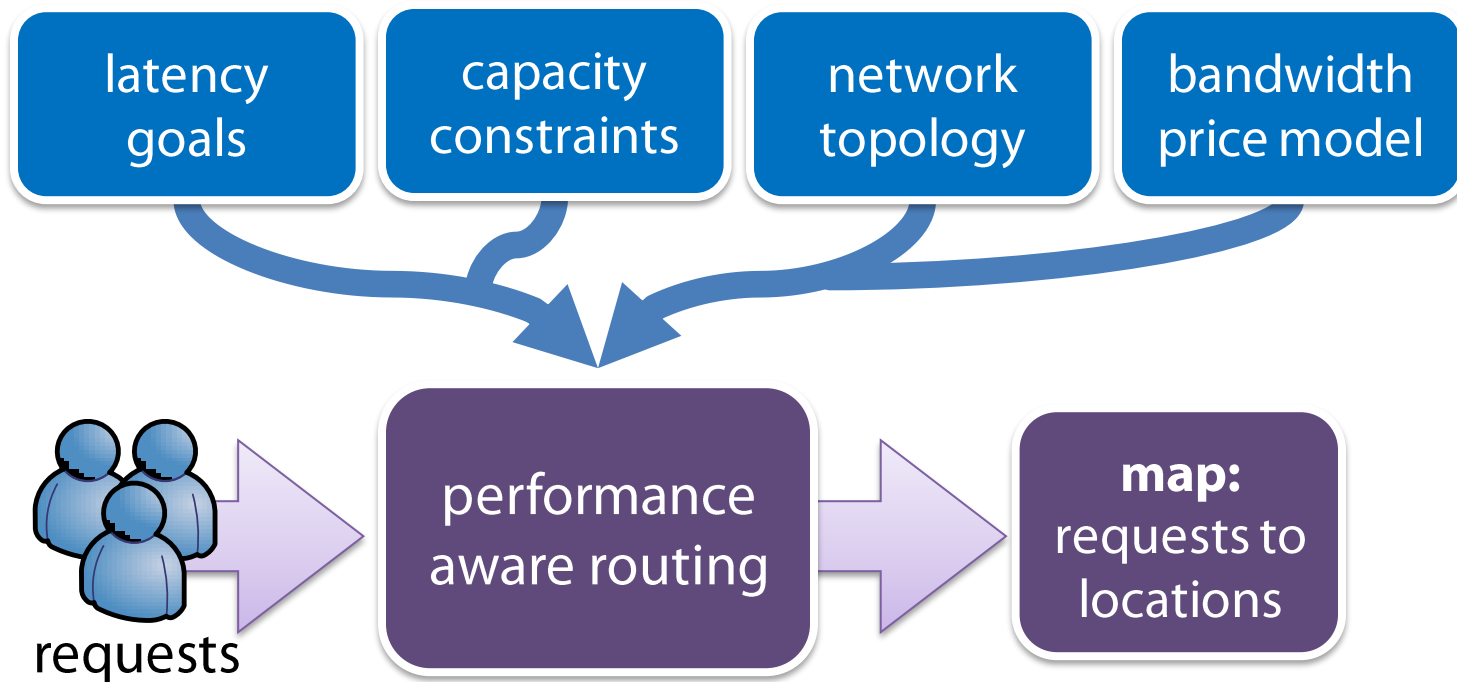
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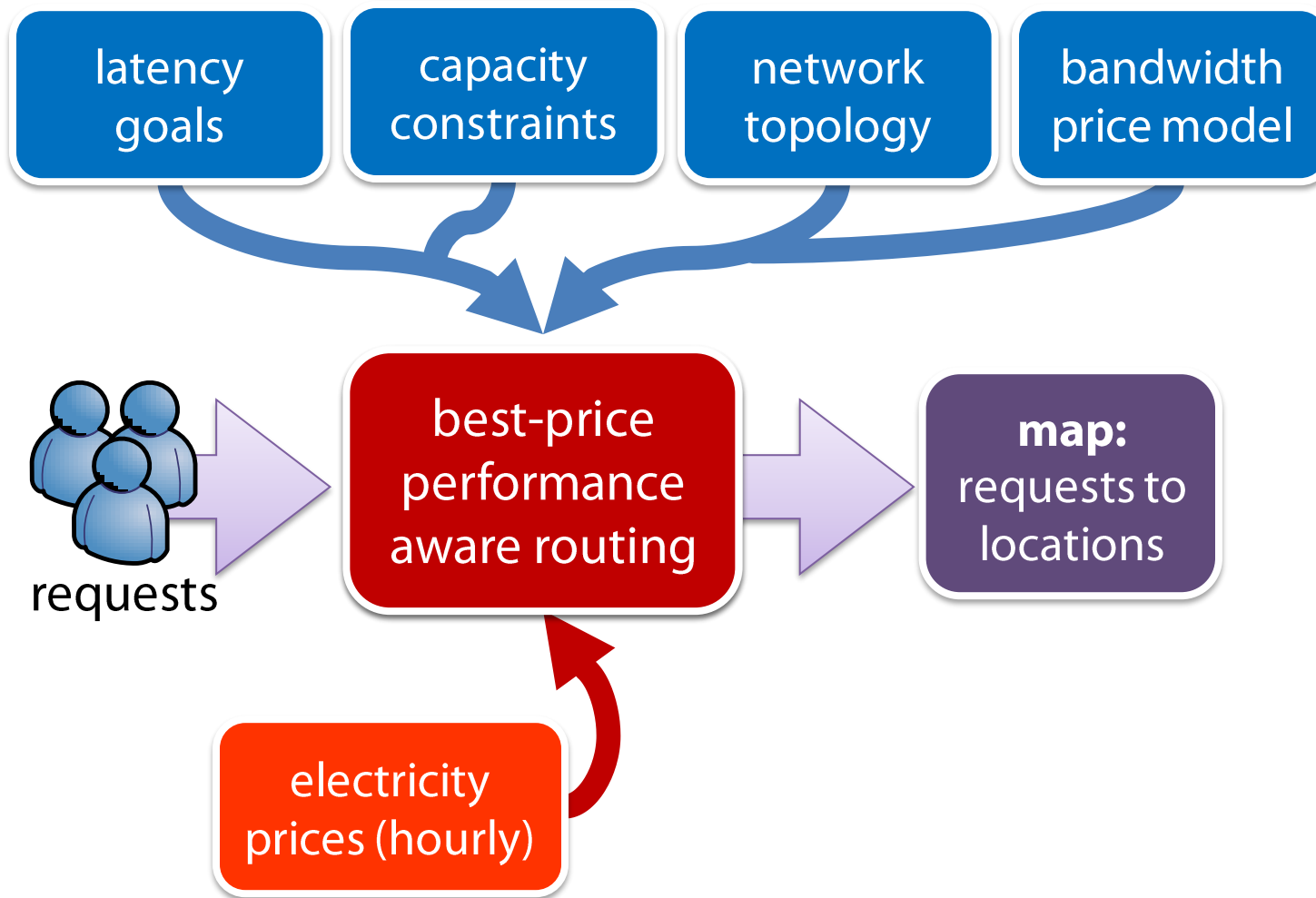
# system model (status quo)



# request routing framework



# request routing framework



**will our proposal work?**

# will our proposal work?

## **does electricity usage depend on server load?**

- how much can we reduce a location's electricity consumption by routing clients away from it?

# **will our proposal work?**

## **does electricity usage depend on server load?**

## **latency concerns**

- how far away from a client is the cheap energy?

# will our proposal work?

**does electricity usage depend on server load?**

**latency concerns**

**bandwidth costs could rise**

- cheaper electricity ~ more expensive bandwidth?



# **will our proposal work?**

**does electricity usage depend on server load?**

**latency concerns**

**bandwidth costs could rise**

**is there enough spare capacity?**

# how much can we save by exploiting price volatility?

- › **today: large companies more than \$1M/year**
- › **with better technology: more than \$10M/year**
- › **better than placing all servers in cheapest market**

# generality of results

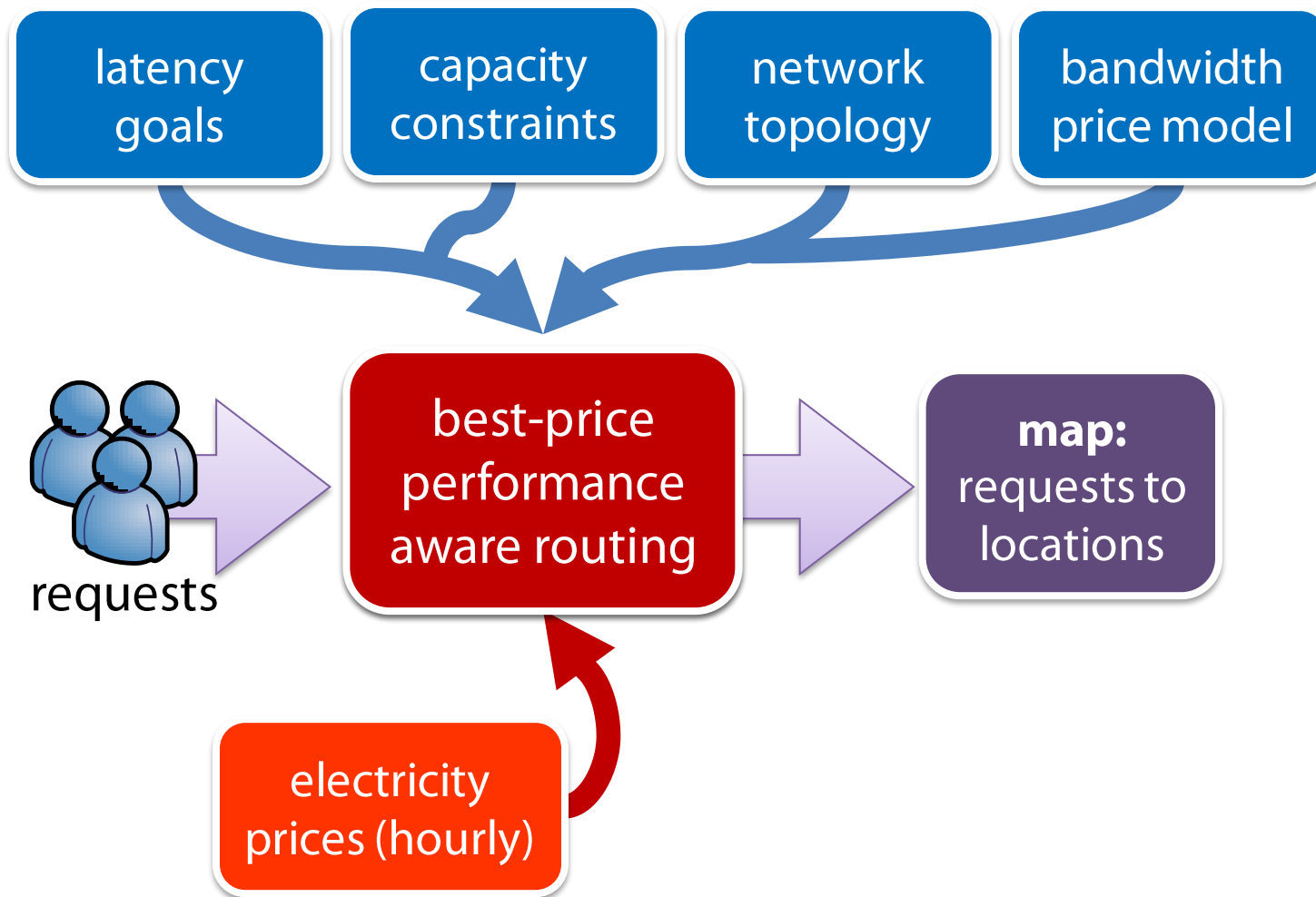
## Akamai-specific inputs

- client workload
- geographic server distribution (25 cities / non-uniform)
- capacity & bandwidth constraints

## results should apply to other systems

- realistic client workload
  - › 2000 content providers
  - › hundreds of billions of requests per day
- realistic server distribution
  - › better than speculating...

# request routing evaluation



# request routing scheme

## performance-aware price optimizer

- map client -> set of locations that meets latency goals
- rank locations based on electricity prices
- remove locations nearing capacity from set
- pick top-ranked location

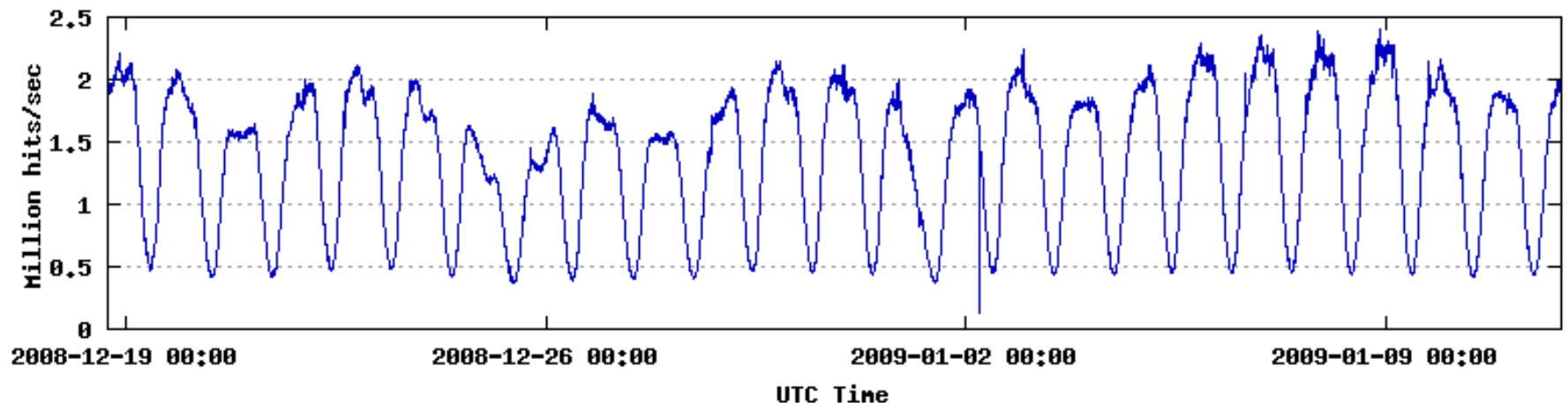
## assumptions

- complete replication
- hourly route updates preserve stability
- uniform bandwidth prices (we will relax this later...)

# Akamai workload

## measured traffic on Akamai's CDN

- ▶ large subset of Akamai's servers (~20K) in 25 cities
- ▶ collected over 24 days (Dec 2008 – Jan 2009)
- ▶ 5-min samples
  - › number of hits and bytes transferred
  - › track how Akamai routed clients to clusters
  - › group clients by origin state
- ▶ also derived a synthetic workload



# electricity prices

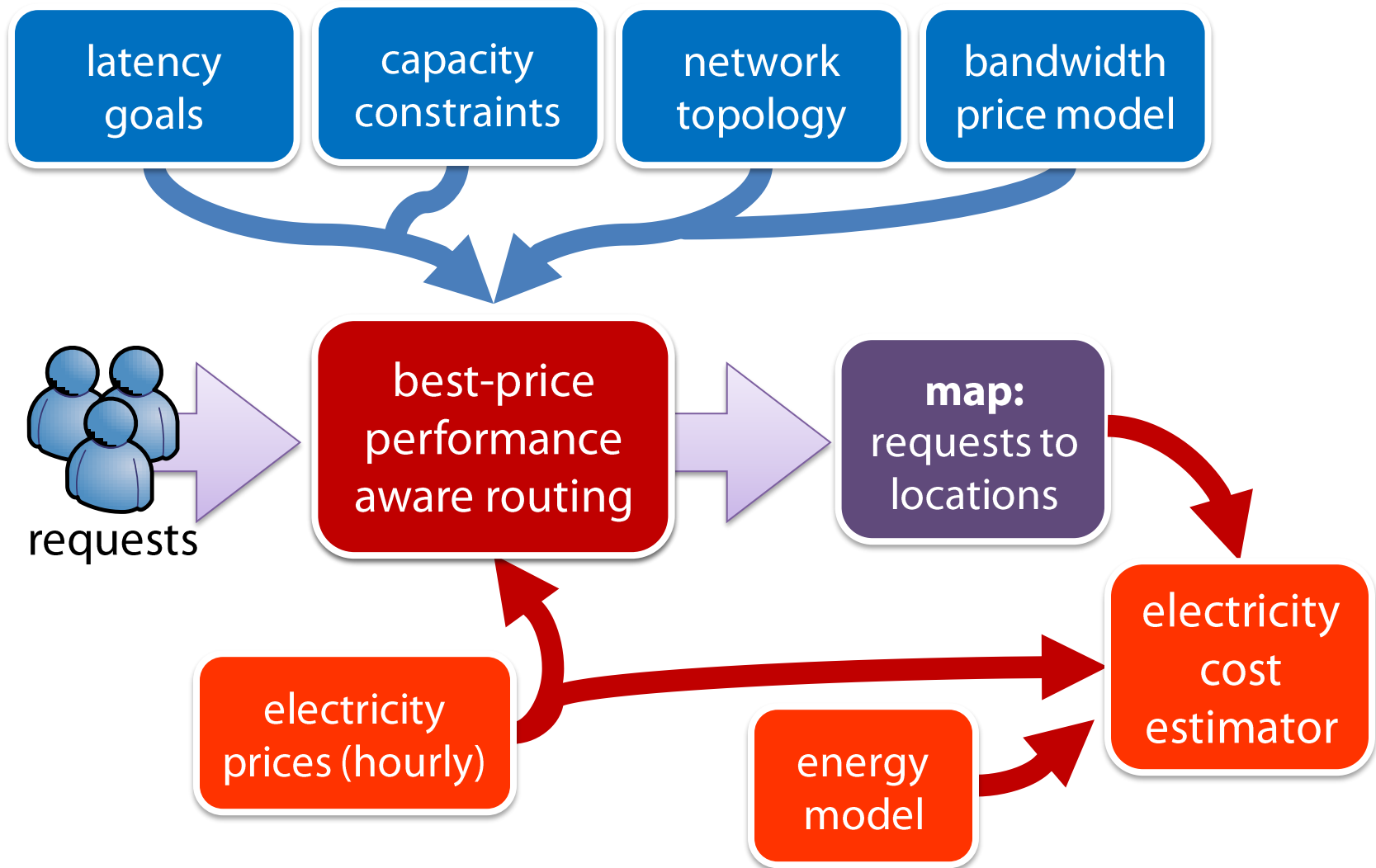
## extensive survey of US electricity markets

- regional wholesale markets (both futures and spot)
- nature and causes of price volatility (see paper...)

## data collection

- 39 months worth of historical hourly prices
  - **January 2006 through March 2009**
- 6 different regional wholesale markets
- 30 locations

# request routing evaluation

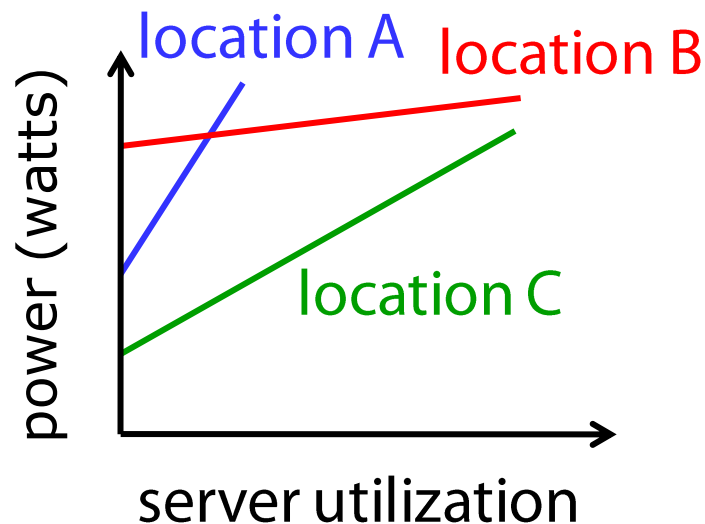




# location energy model

## linear model (roughly)

- server utilization -> watts
- scaling: number of servers
- based on a Google study
- power measurements at Akamai



## important parameters

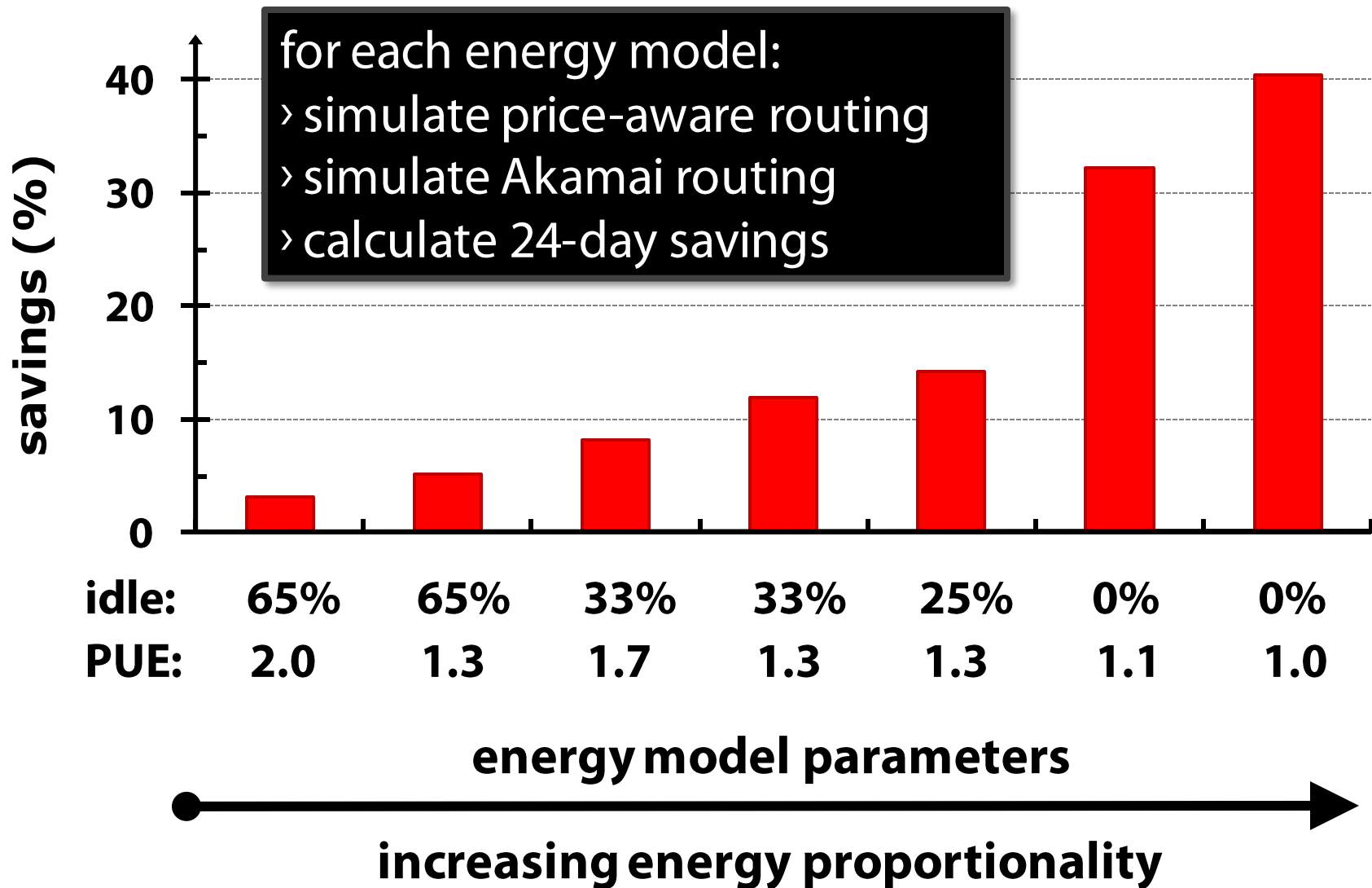
(a)  $\frac{\text{idle server power}}{\text{peak server power}}$

(b)  $\text{PUE} = \frac{\text{power enter data center}}{\text{power used by IT equip.}}$

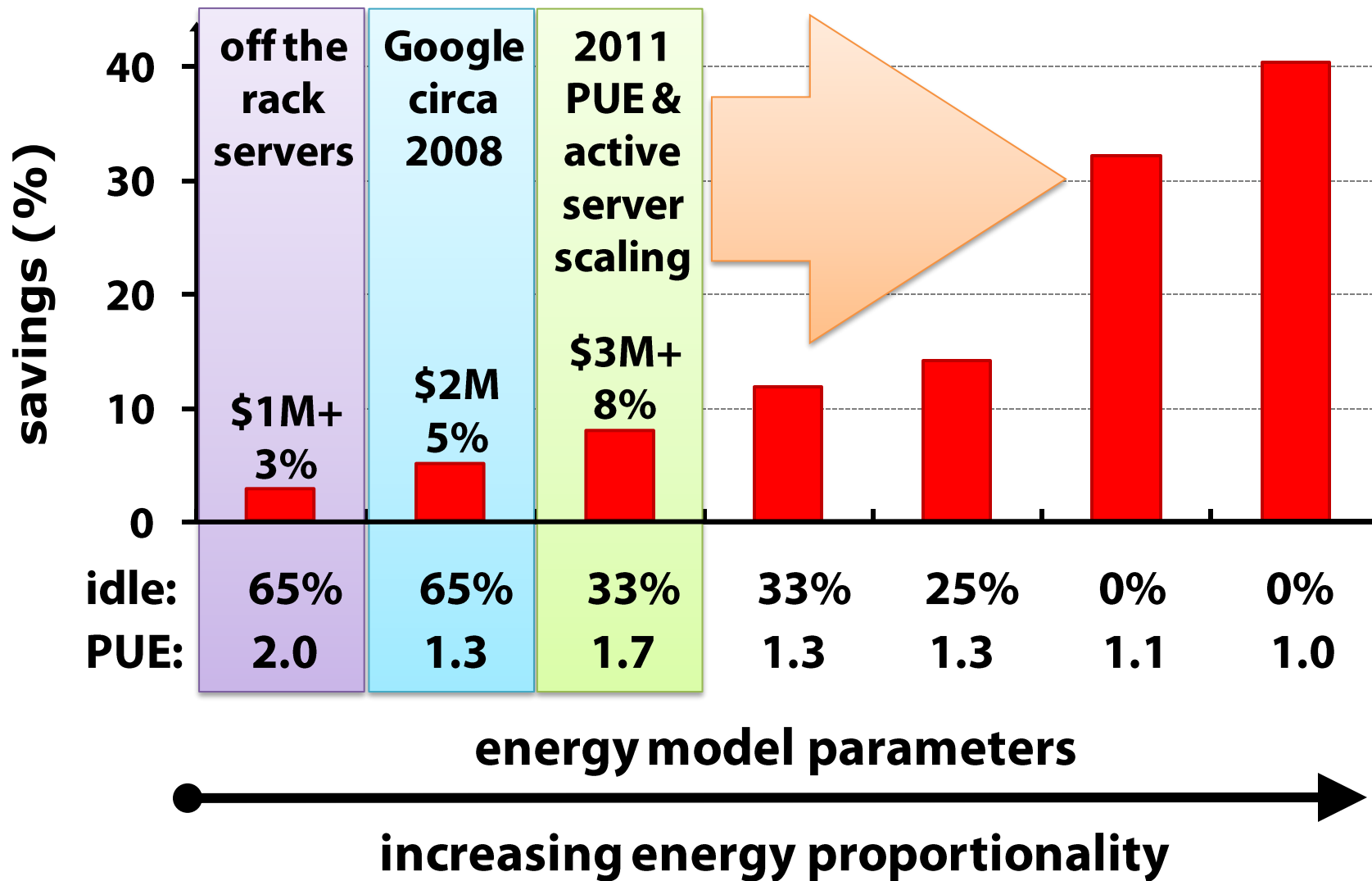
## critical: how proportional is power to load?

- server power management? are idle servers turned off?
- the 'energy elasticity' of the system

# importance of elasticity



# importance of elasticity



# bandwidth costs

## are we increasing bandwidth costs?

- problematic: bandwidth prices are proprietary

## uniform bandwidth price model

- fixed cost per bit regardless of time and place

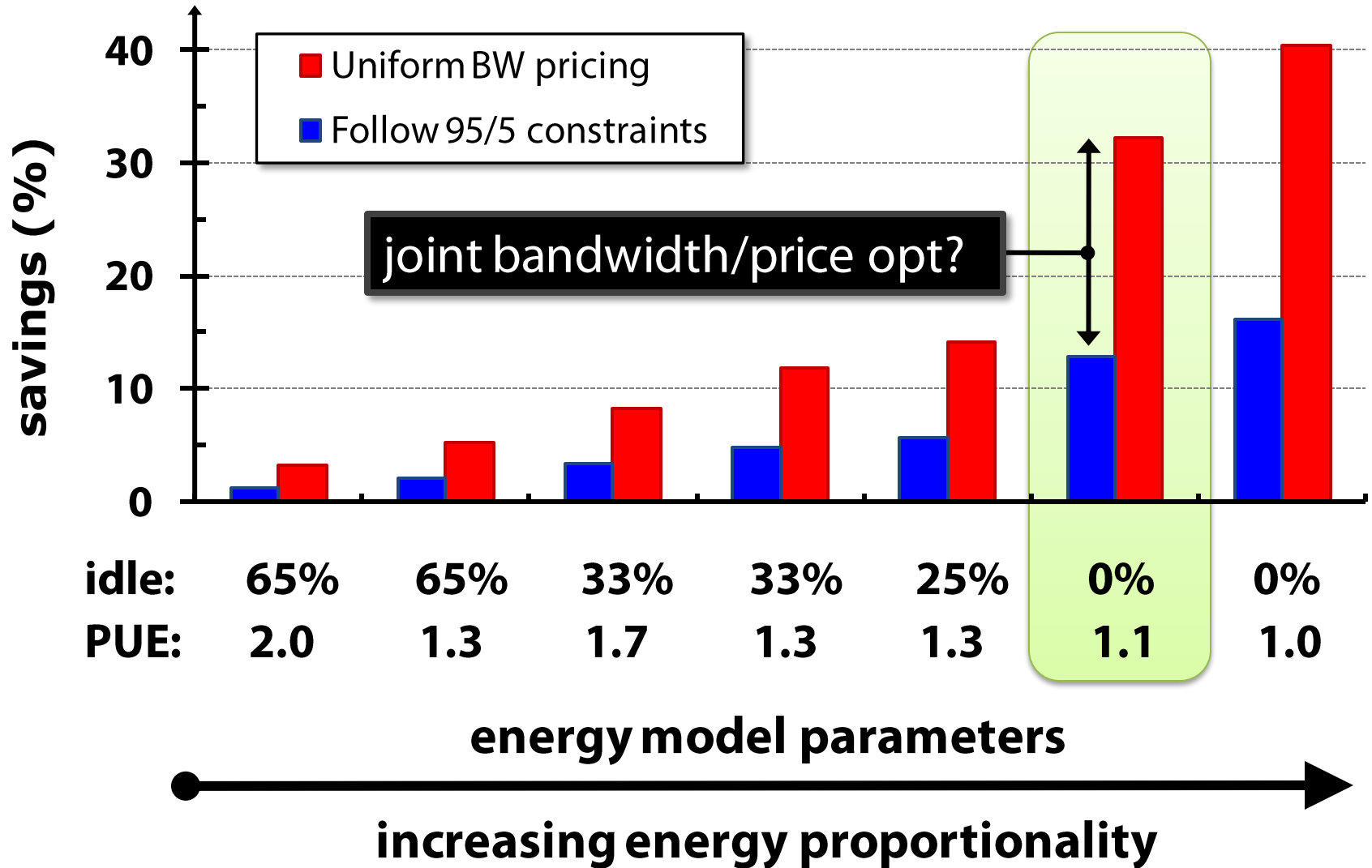
## 95/5 bandwidth pricing model

- prices set per network port
- network traffic is divided into 5-minute windows
- 95<sup>th</sup> percentile of traffic is used for billing

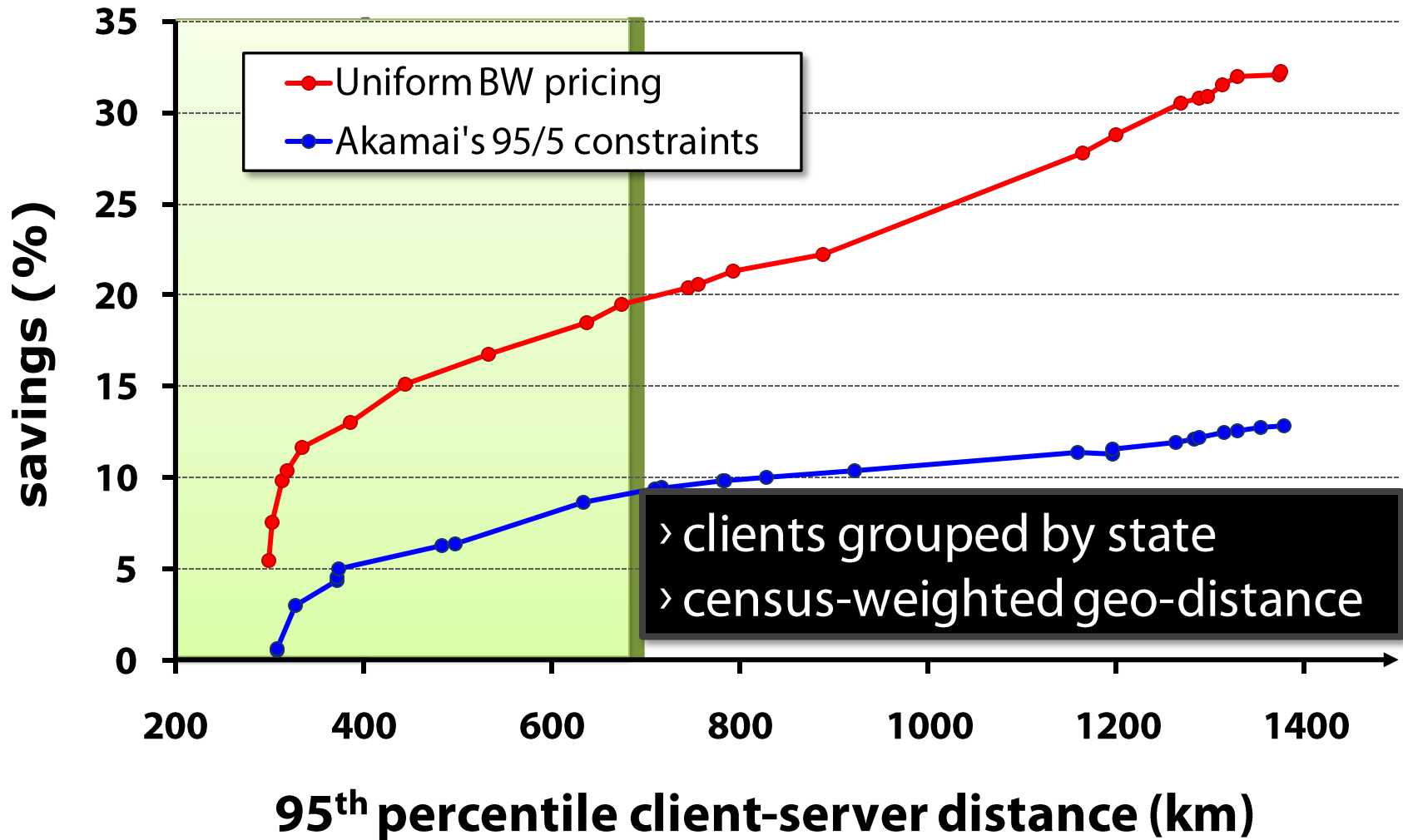
## approach: 95<sup>th</sup> percentiles from Akamai data

- constrain routing so that 95<sup>th</sup> percentiles are unchanged
- Akamai's routing factors in bandwidth prices...

# bandwidth constraints



# latency constraints



# practical implications

## who can use this approach?

- servers in multiple locations
- some energy proportionality

## complications

- electric billing based on peak power
- we need prices w/ time-varying uncorrelated volatility
  - e.g., wholesale market prices in the US

## current energy sector trends are favorable

# conclusion

## significant value in price volatility

- large systems today: save more \$1M/year
- increased energy elasticity: more than \$10M/year

## required mechanism already mostly in place

- minimal incremental changes required
- integrate real-time market information

## extensions

- other cost functions (carbon, NO<sub>x</sub>)
- other inputs (weather)
- active market participation (demand response, etc.)