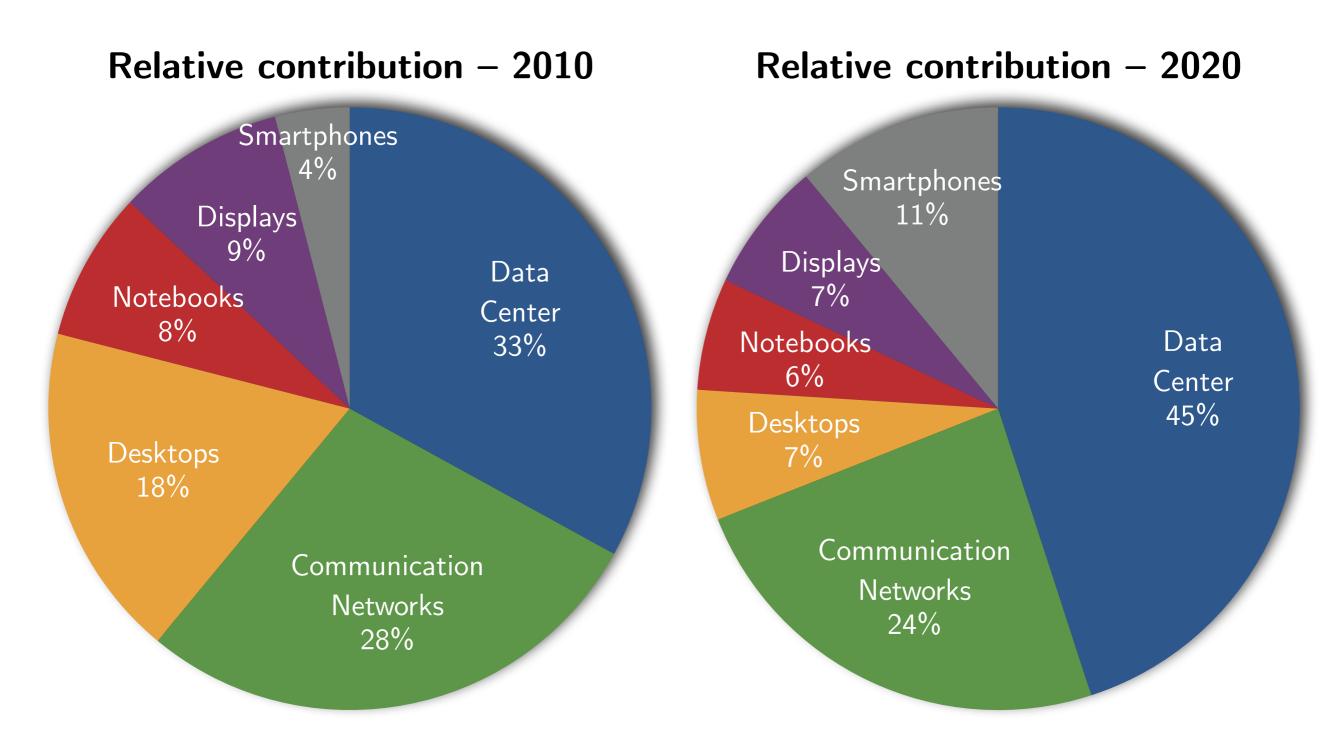
# Energy Efficiency in Online Data Intensive Systems

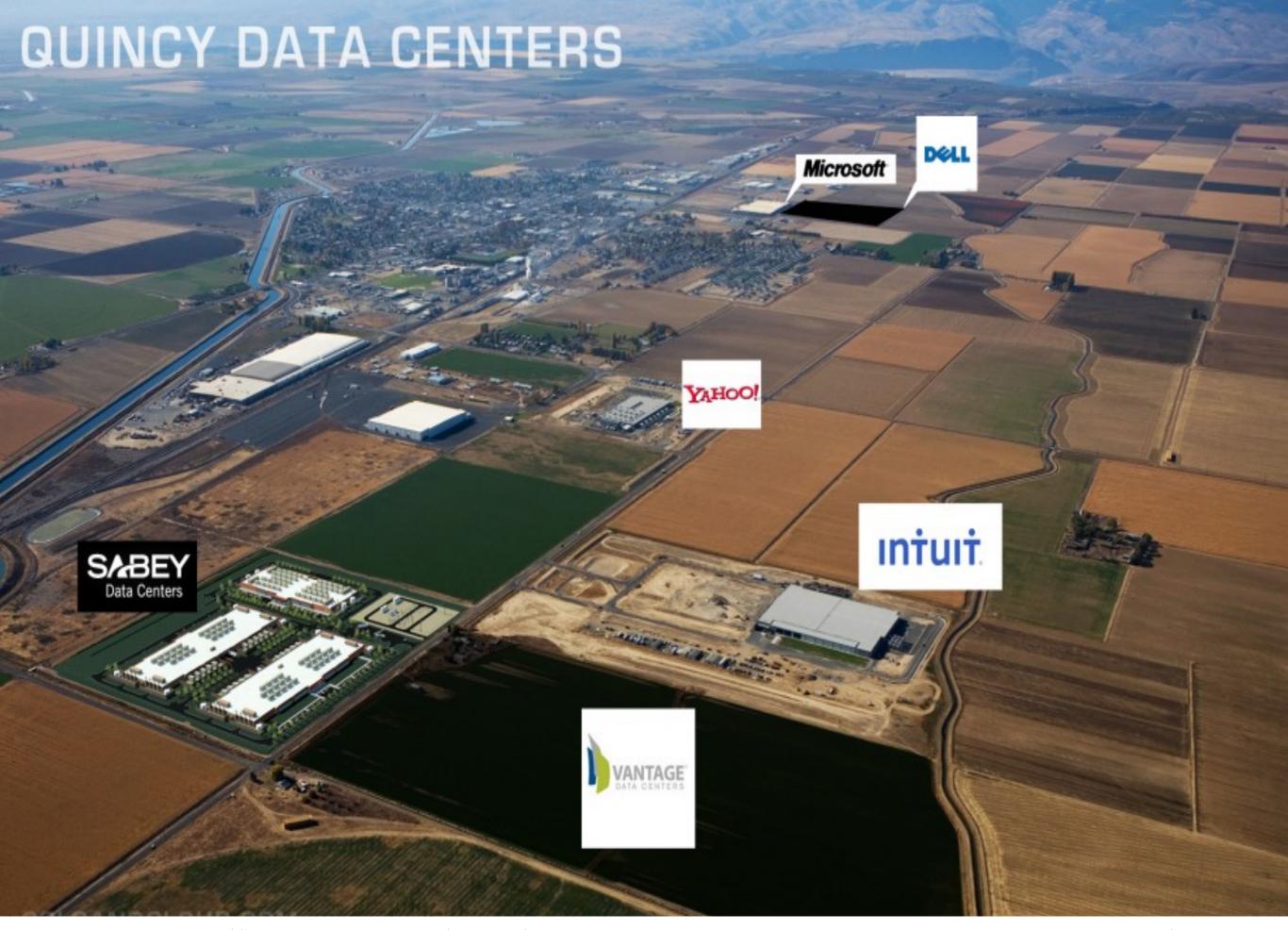
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## ICT Global Carbon Footprint



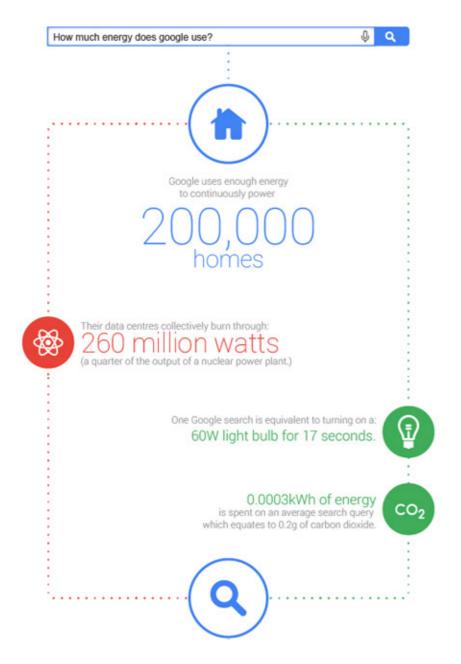
Source: L. Belkhir, A. Elmeligi. "Assessing ICT global emissions footprint: Trends to 2040 & recommendations", Journal of Cleaner Production 2018

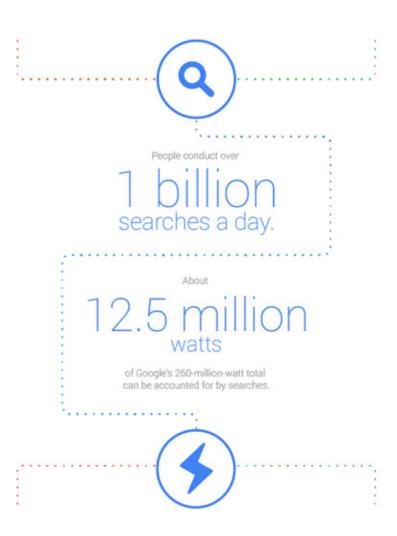


Source: http://www.coloandcloud.com/editorial/quincy-wa-big-data-centers-leverage-abundant-inexpensive-renewable-energy/

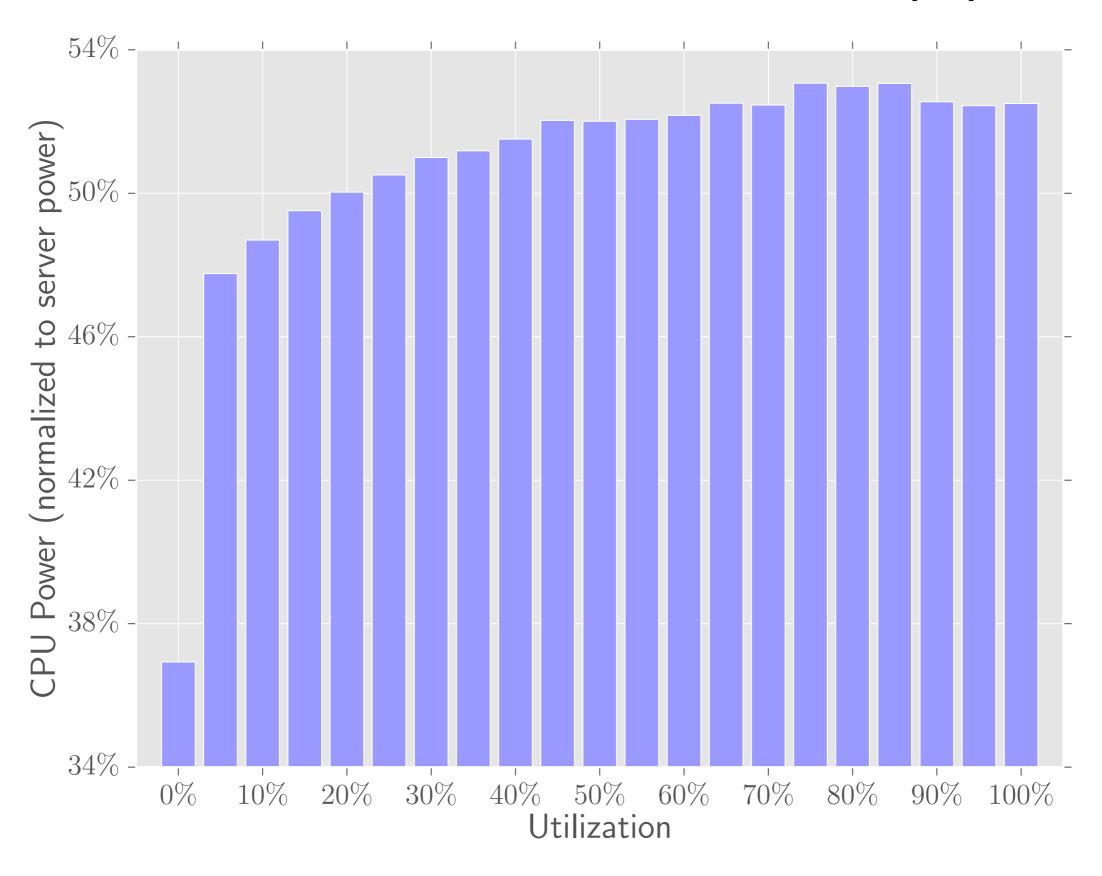
### How much energy does a search engine use?



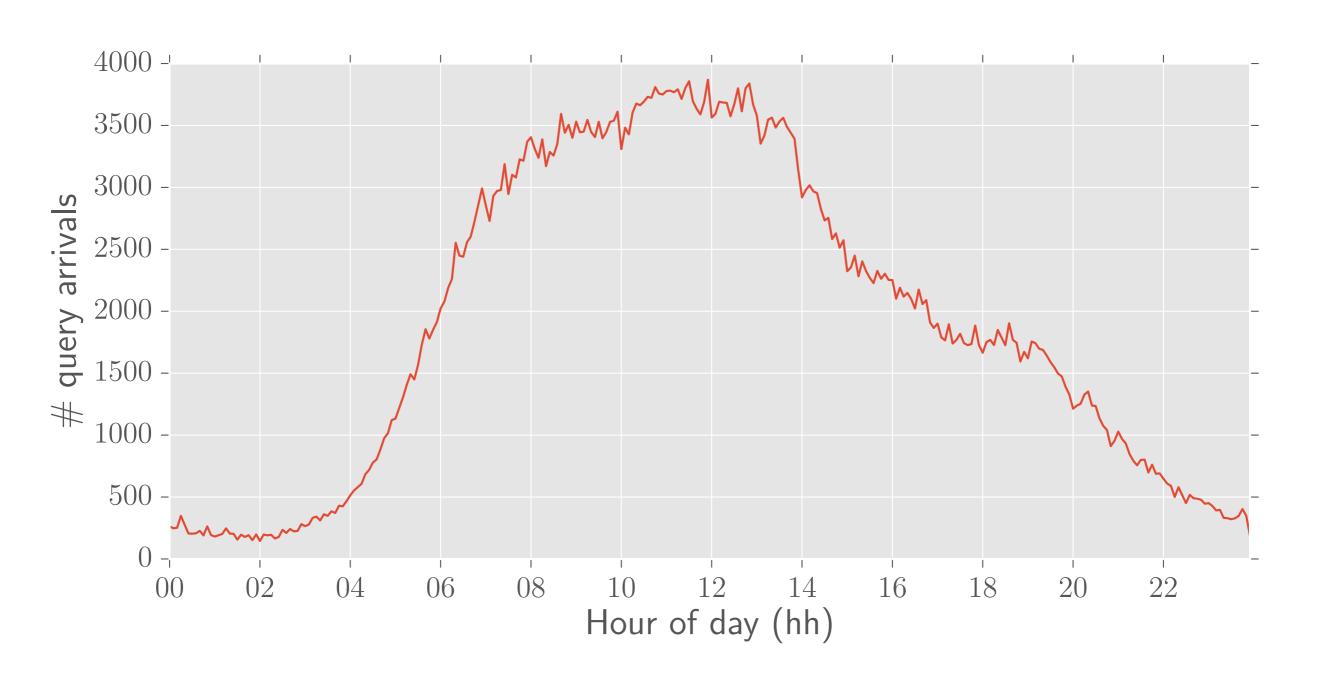




## **CPU Energy Consumption (II)**



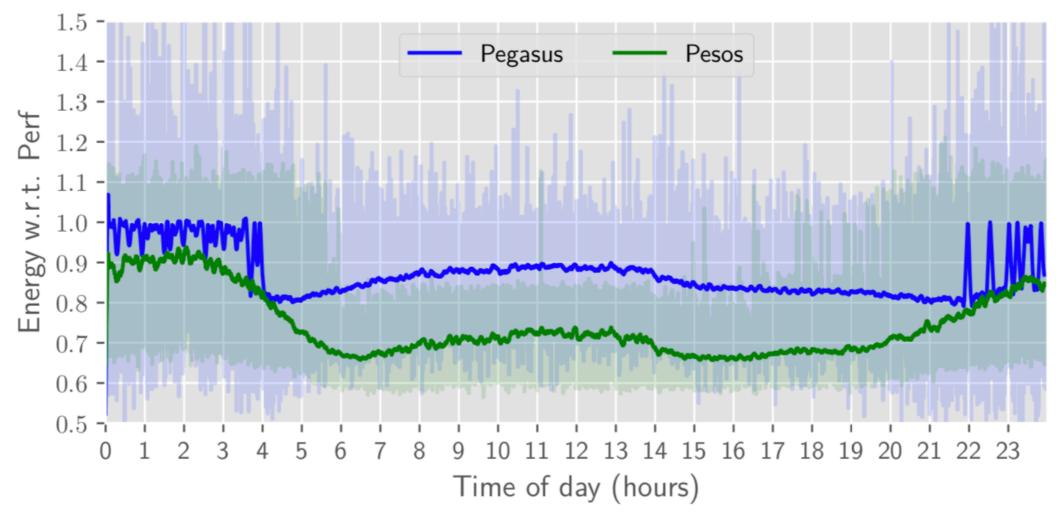
## Search Engine Daily Query Traffic



#### Idea

- We must take into account **processing times** constraints
- We could minimize a combination of energy consumption and processing times
- But users can't distinguish response times smaller than a given latency (e.g., few hundreds of milliseconds)\*
- Try to reduce CPU energy consumption while fulfilling a given latency constraint.
  - E.g., each data must be processed in less than 500 ms.

## **Experiments**



- PEGASUS does not exhibits significant energy savings when traffic is low
- PEGASUS energy savings up to ~20% w.r.t. PERF when traffic is high
- $\bullet$  PESOS energy savings up to ~10% w.r.t. PERF when traffic is low
- PESOS energy savings up to ~30% w.r.t. PERF when traffic is high

#### Overall Energy Consumption

	PERF	PEGASUS	PESOS
Energy (MWh)	254	218 (-18%)	179 (-29%)

#### What is next?

- How to incorporate heterogenous data/processing requirements?
- How to leverage renewable energy sources, e.g., air, solar, geothermal?
- How to incorporate personal energy sources, e.g., solar panels?
- How to leverage autarkic energy markets?
- Can we Leverage blockchain technologies to implement energy market ledgers?

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