

Google Workloads for Consumer Devices: Mitigating Data Movement Bottlenecks

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SAFARI

Carnegie Mellon

Google



SEOUL
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Consumer Devices

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Consumer Devices



Consumer devices are everywhere!

Consumer Devices



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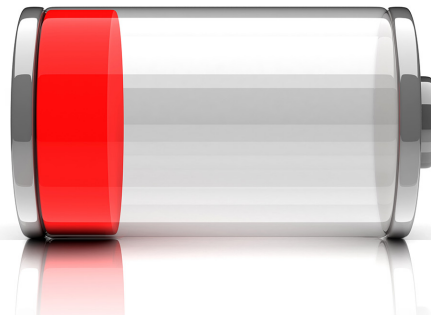


Consumer Devices



Consumer devices are everywhere!

**Energy consumption is
a first-class concern in consumer devices**



Popular Google Consumer Workloads

Popular Google Consumer Workloads



Chrome

Google's web browser

Popular Google Consumer Workloads



Chrome

Google's web browser



TensorFlow Mobile

Google's machine learning
framework

Popular Google Consumer Workloads



Chrome

Google's web browser



TensorFlow Mobile

Google's machine learning framework

VP9



Video Playback

VP9



Video Capture

Popular Google Consumer Workloads



Chrome

Google's web browser



TensorFlow Mobile

Google's machine learning framework

VP9



Video Playback

Google's **video codec**

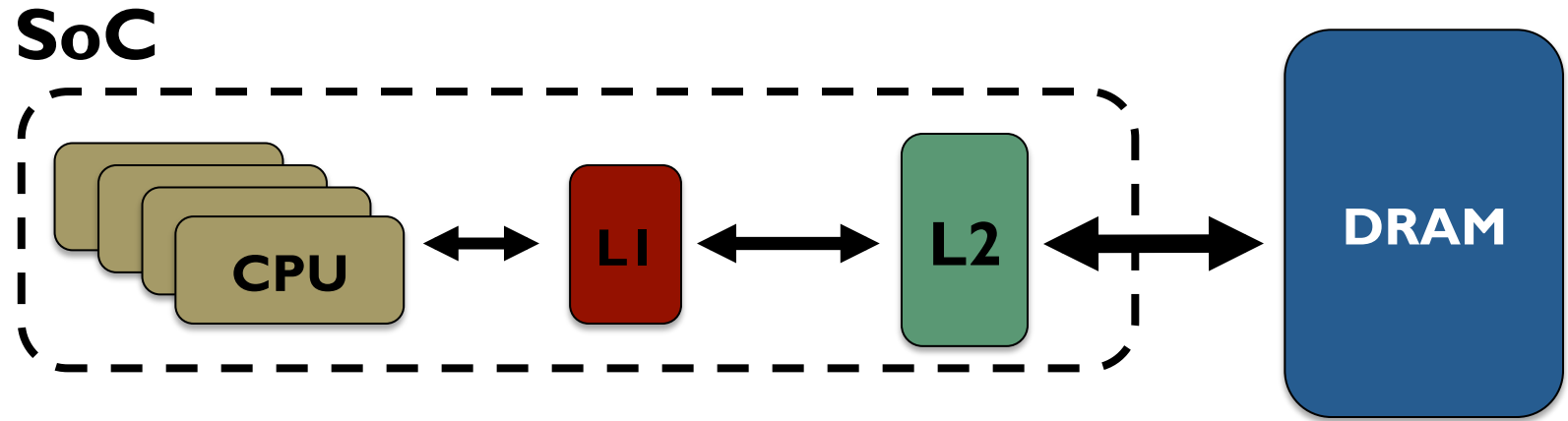
VP9



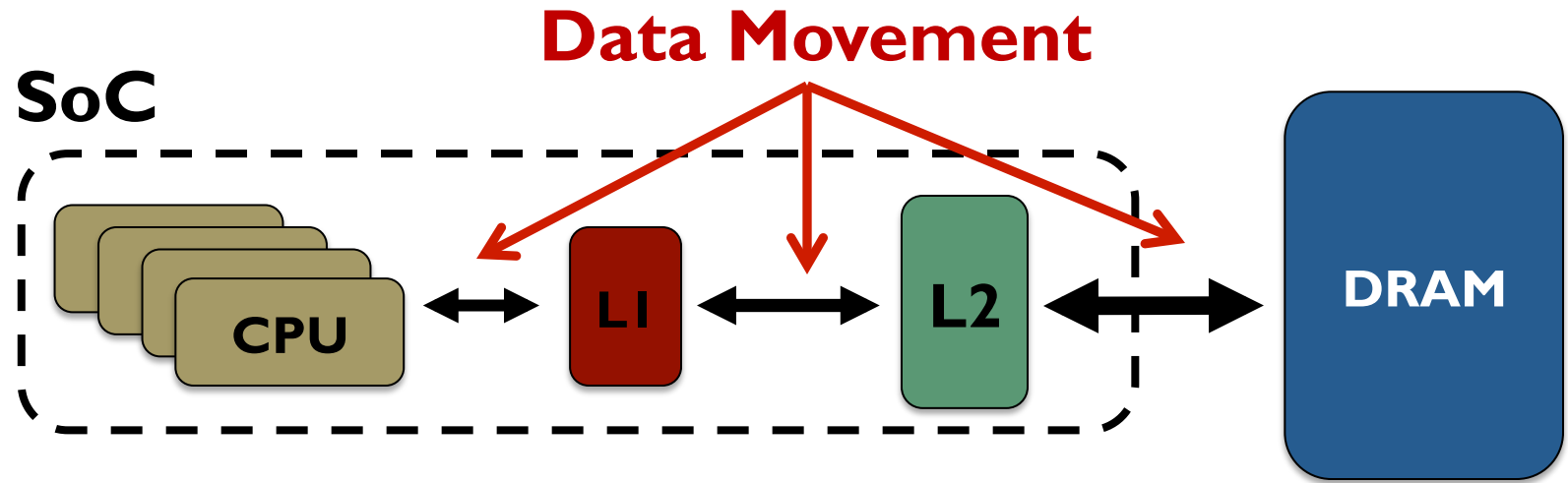
Video Capture

Google's **video codec**

Energy Cost of Data Movement

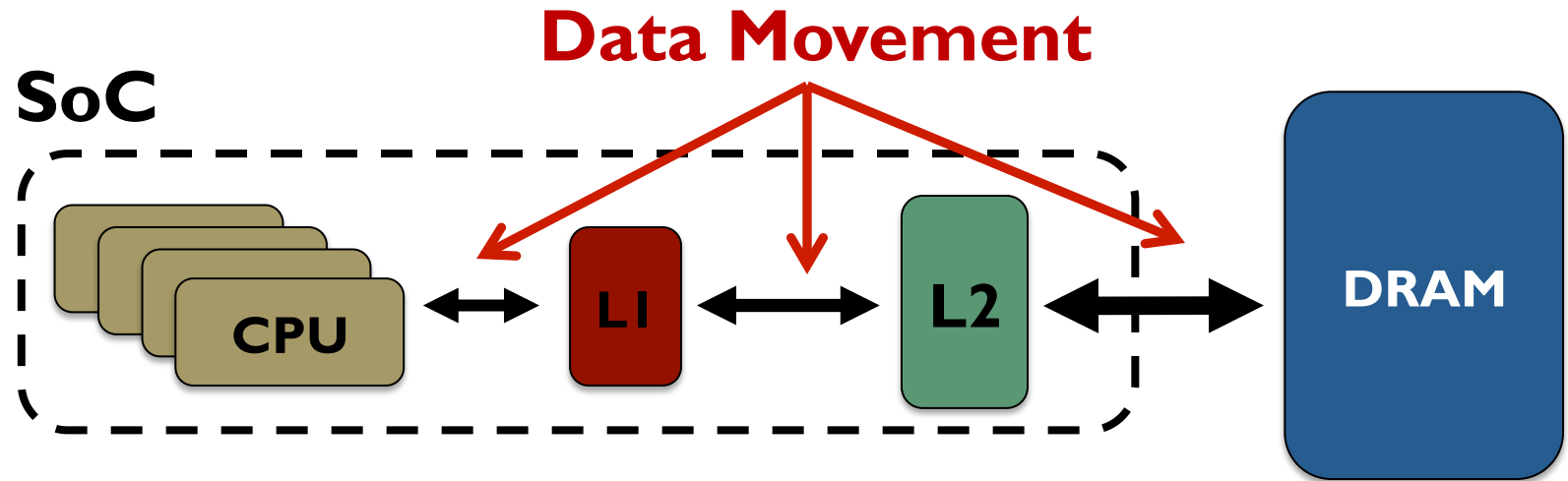


Energy Cost of Data Movement



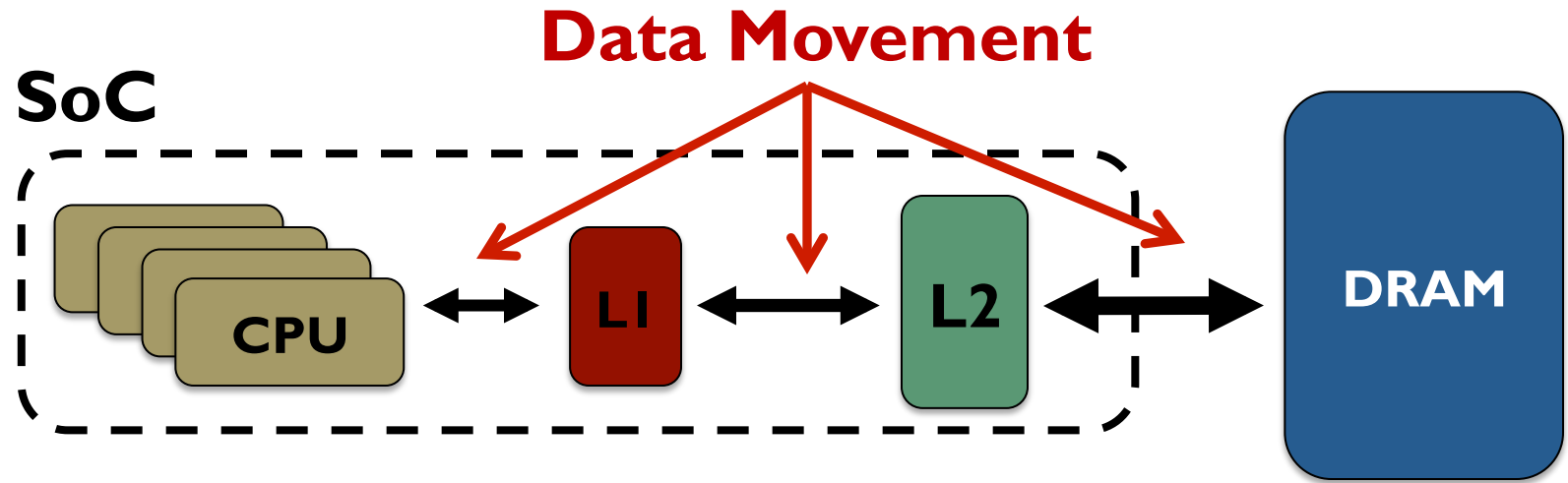
Energy Cost of Data Movement

1st key observation: **62.7%** of the total system energy is spent on **data movement**



Energy Cost of Data Movement

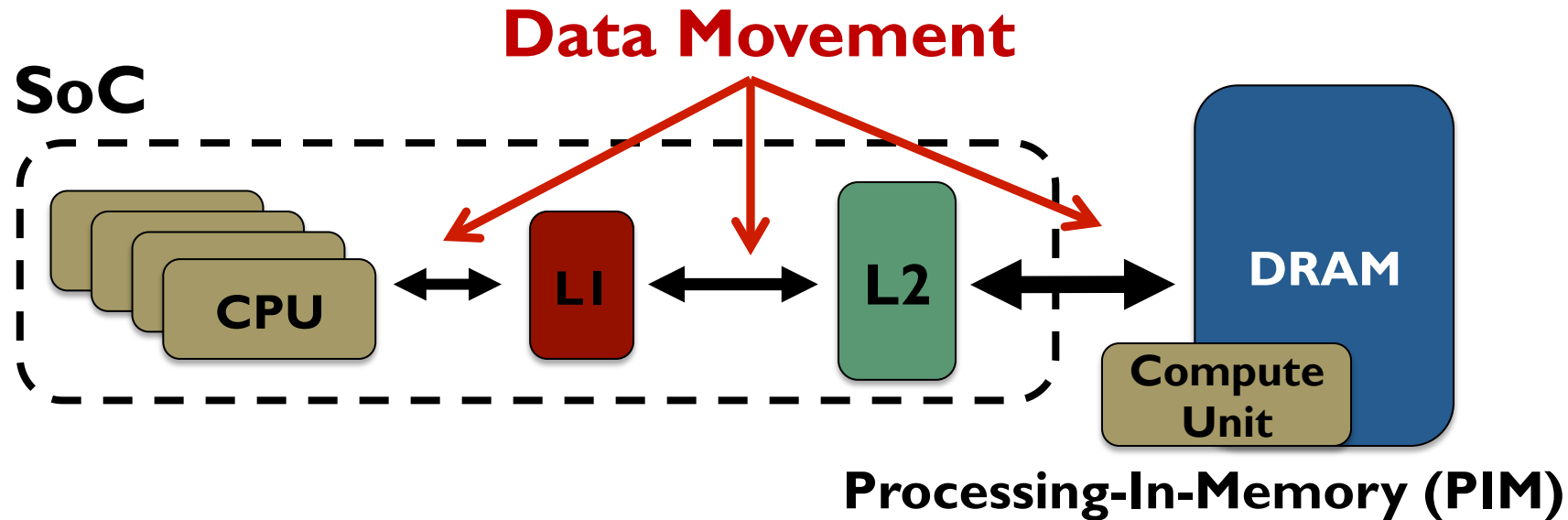
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Potential solution: move computation **close to data**

Energy Cost of Data Movement

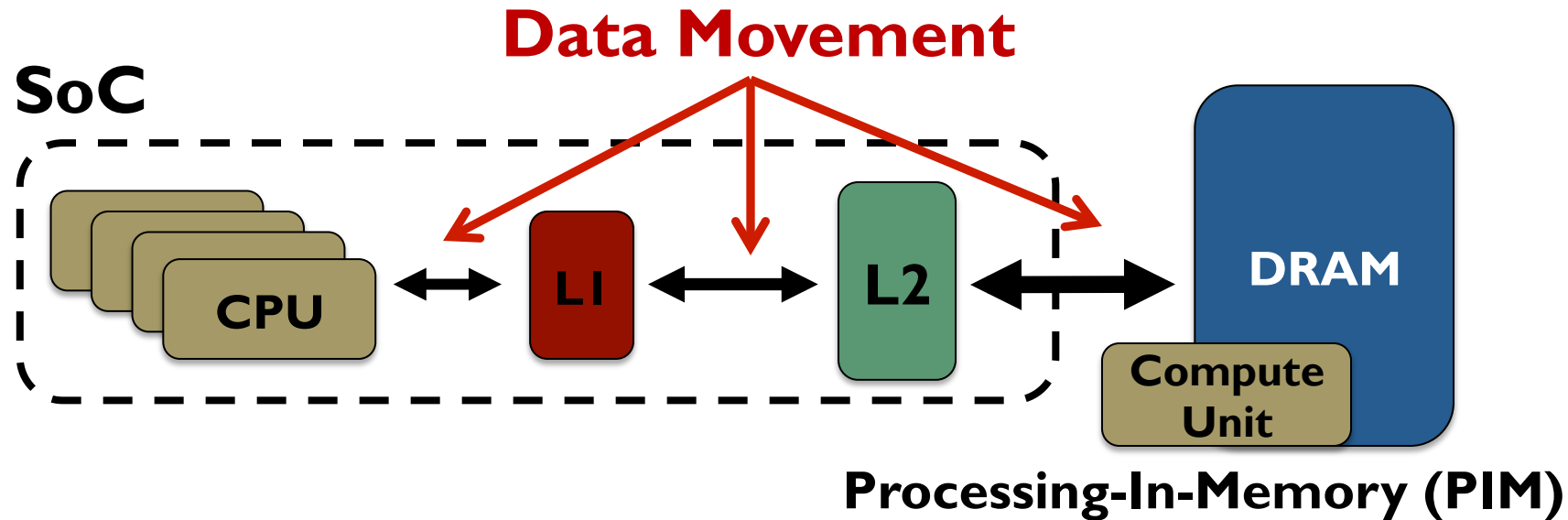
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Energy Cost of Data Movement

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Potential solution: move computation **close to data**

Challenge: limited area and energy budget

Using PIM to Reduce Data Movement

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2nd key observation: a significant fraction of the **data movement** often comes from **simple functions**

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We can design lightweight logic to implement these simple functions in **memory**

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Small embedded
low-power core



Using PIM to Reduce Data Movement

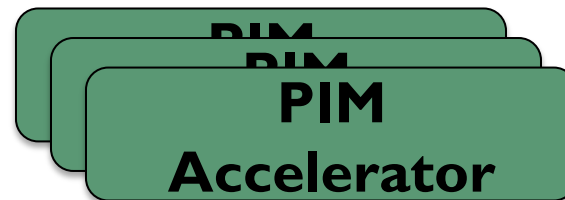
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Small fixed-function
accelerators



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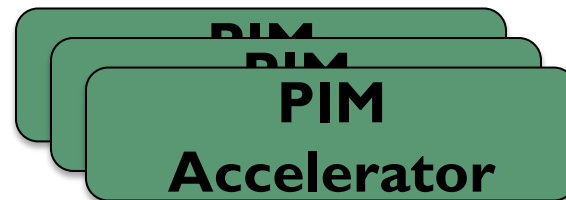
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Offloading to PIM logic reduces energy and improves performance, on average, by 55.4% and 54.2%

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Location: Virginia EF

Time: 11:10 AM

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