



# Exploiting Webpage Characteristics for Energy-Efficient Mobile Web Browsing

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**Yuhao Zhu**, Aditya Srikanth, Jingwen Leng, Vijay Janapa Reddi  
Department of Electrical and Computer Engineering  
The University of Texas at Austin

Best of CAL — Feb. 11th, 2015

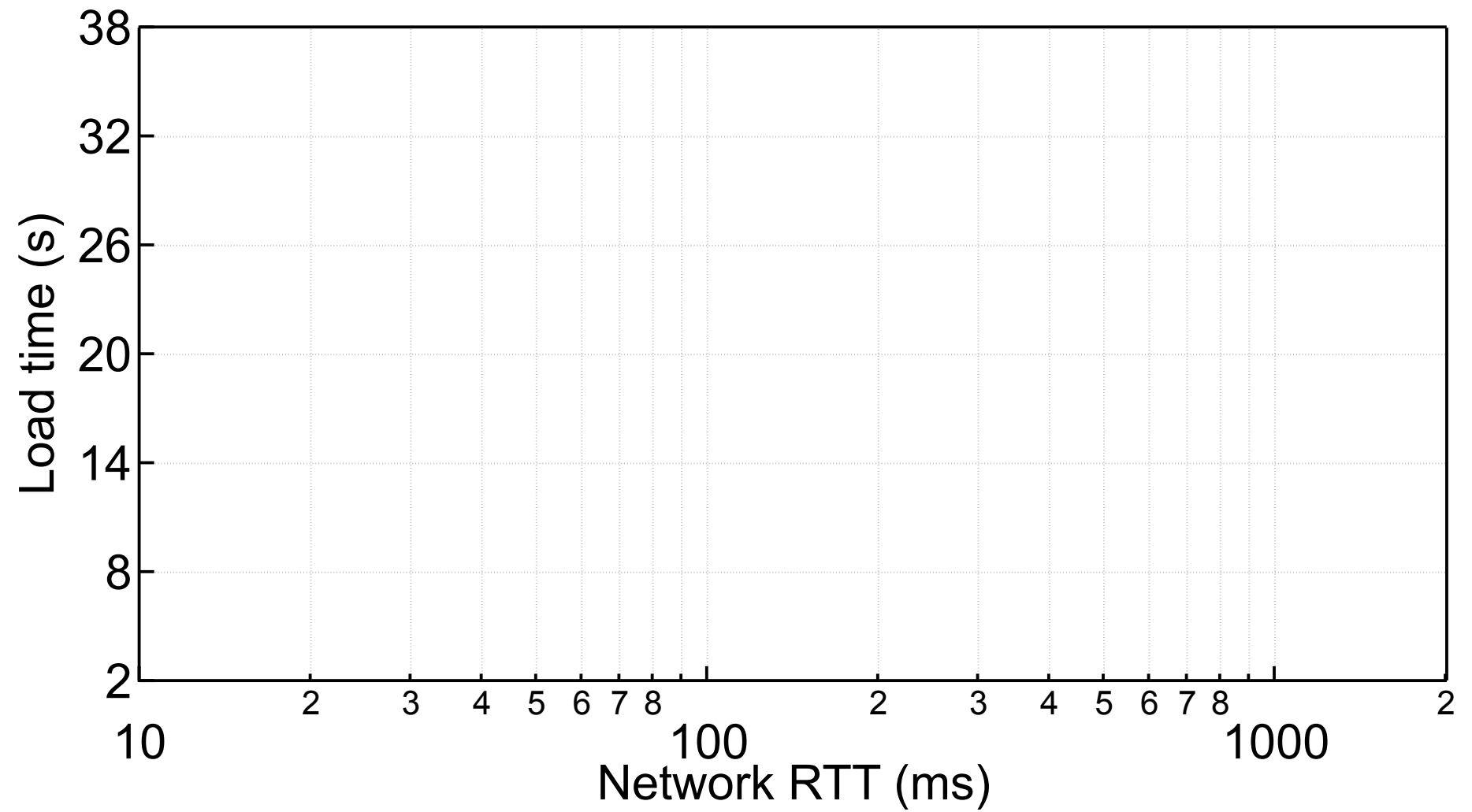
# Isn't This a Network Issue?

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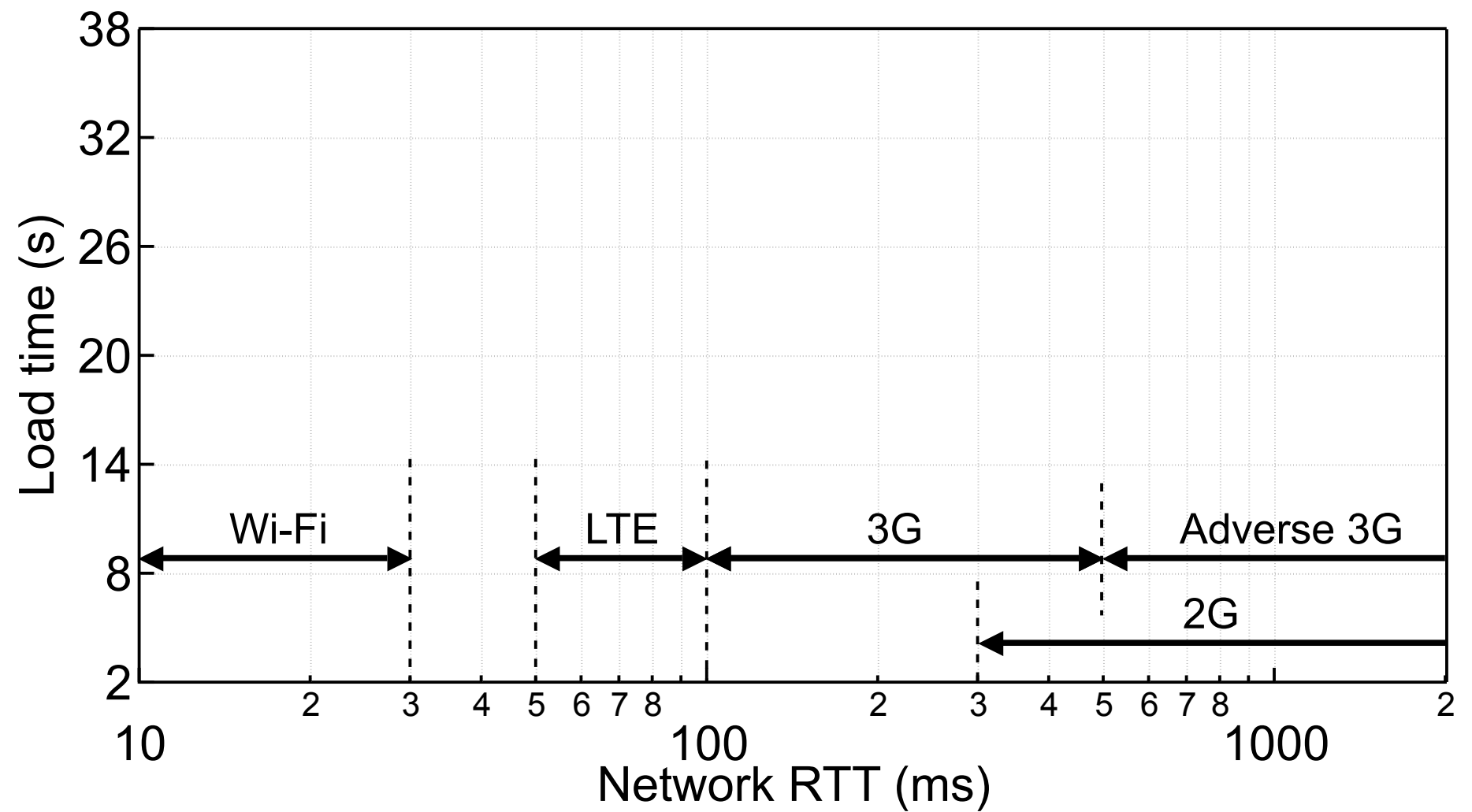


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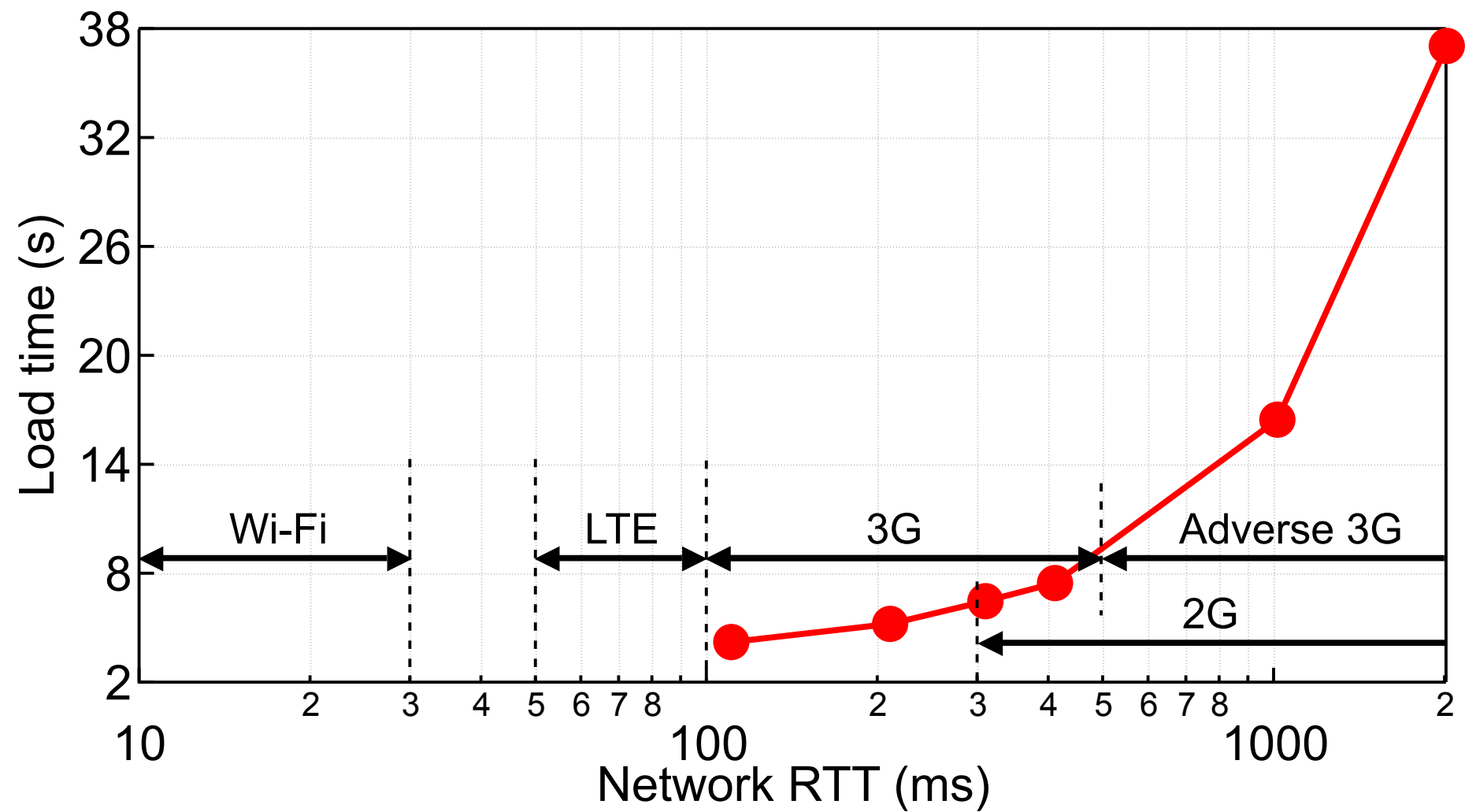
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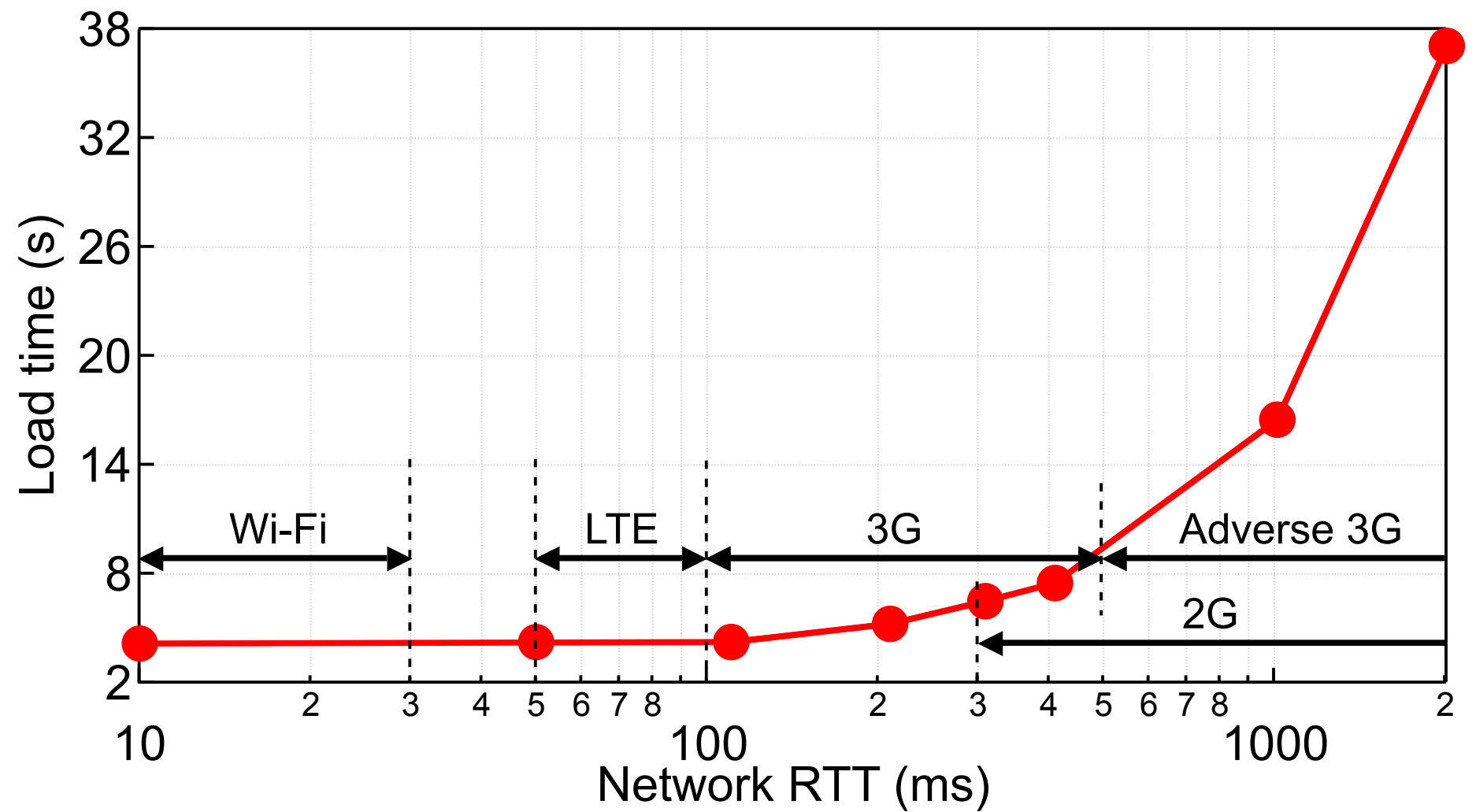
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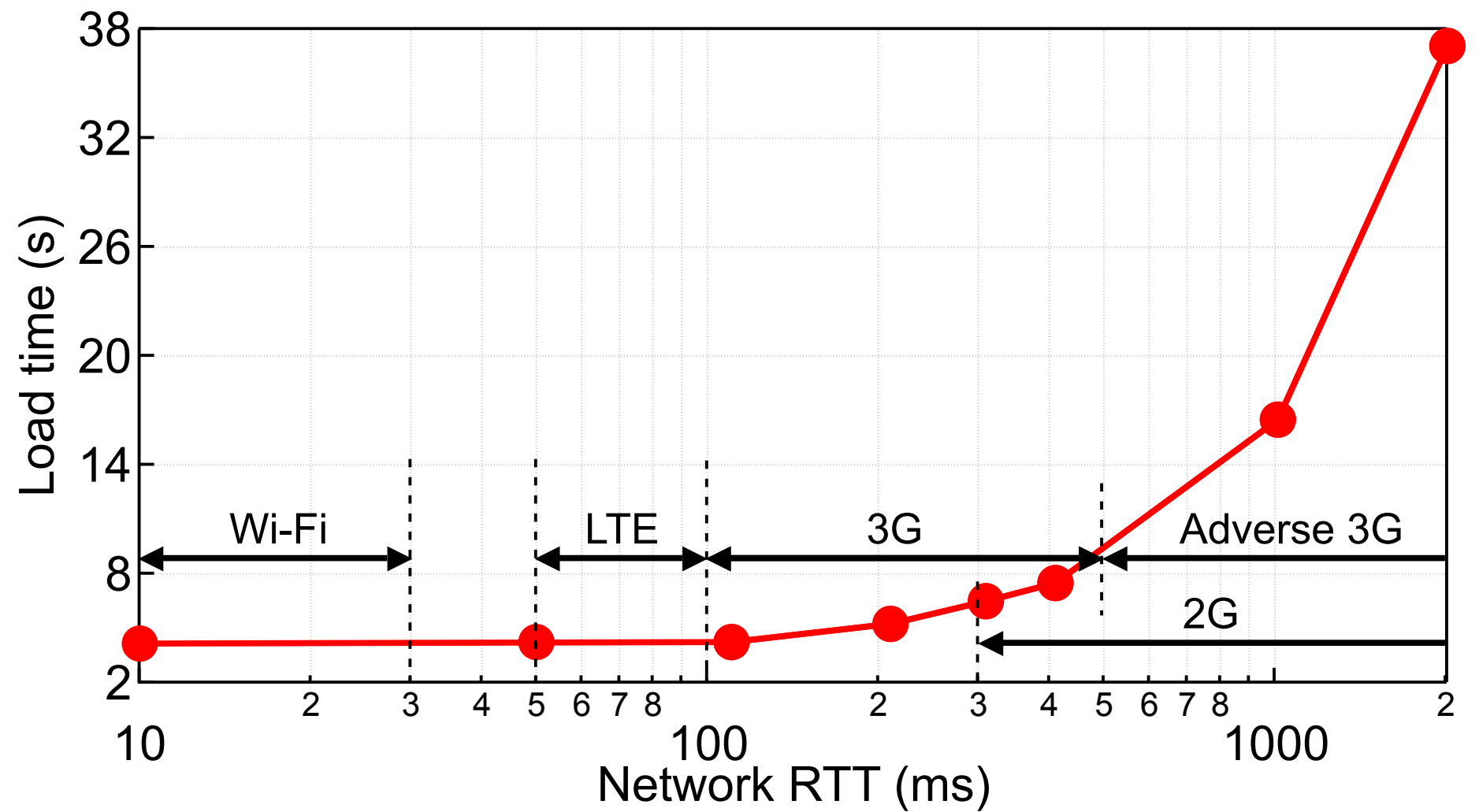
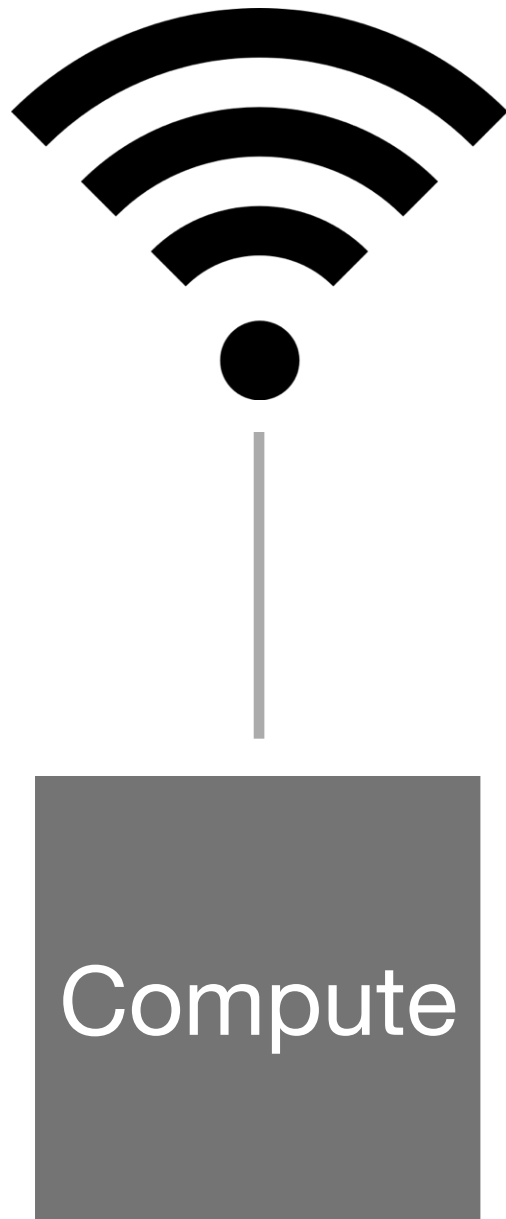
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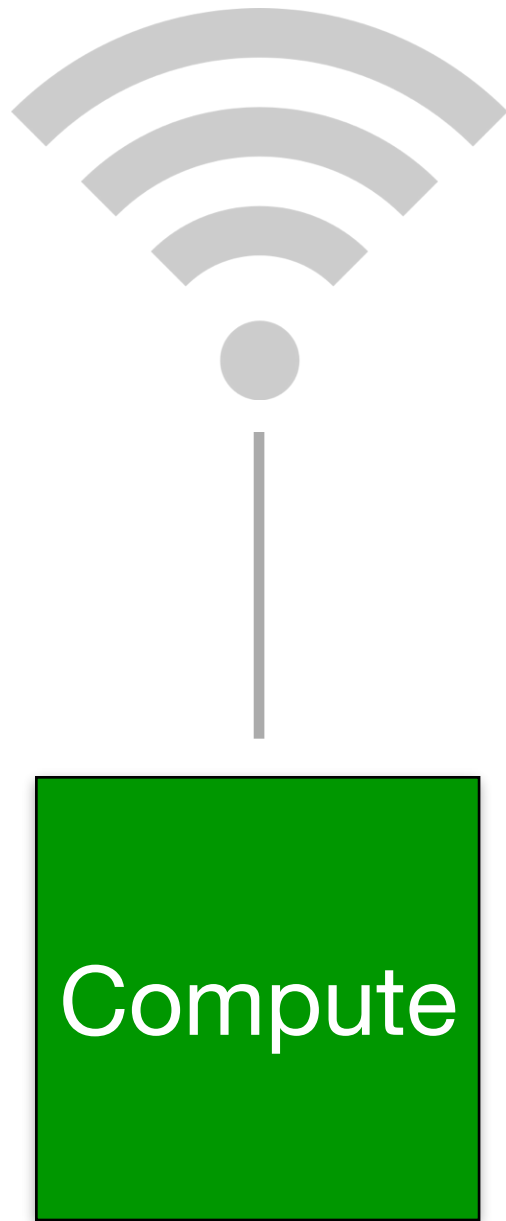


# Isn't This a Network Issue?



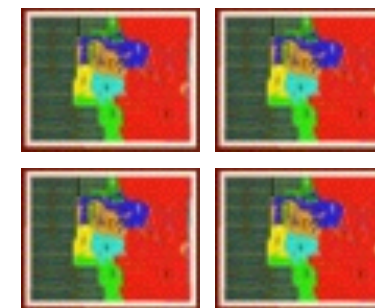
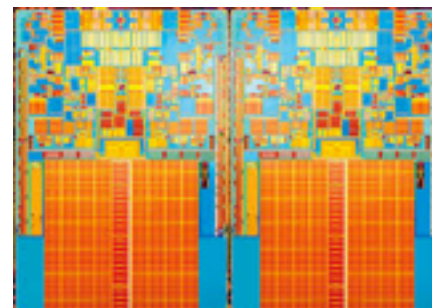
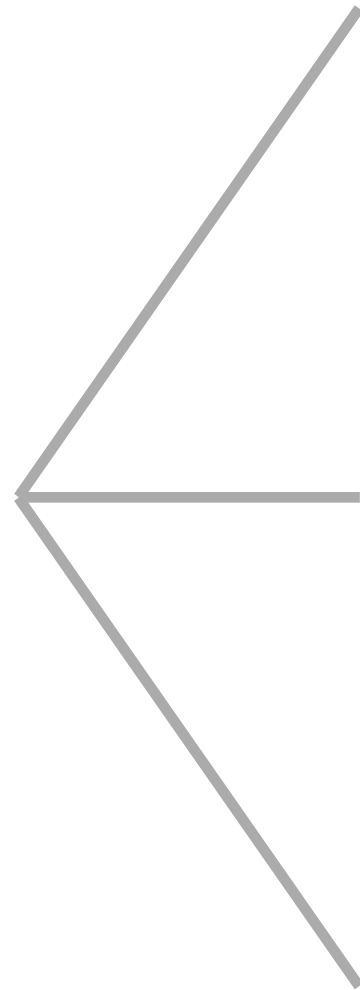
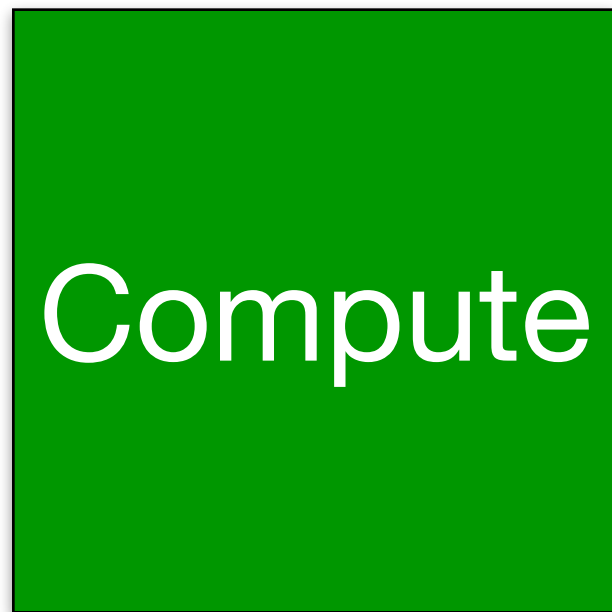
# Web Browsing from a Compute Perspective

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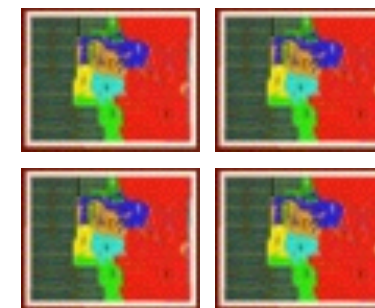
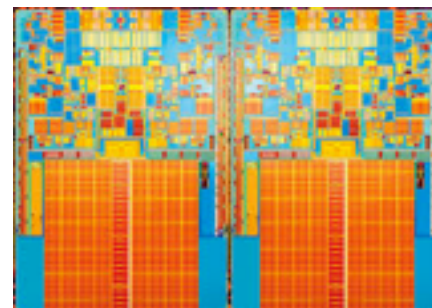
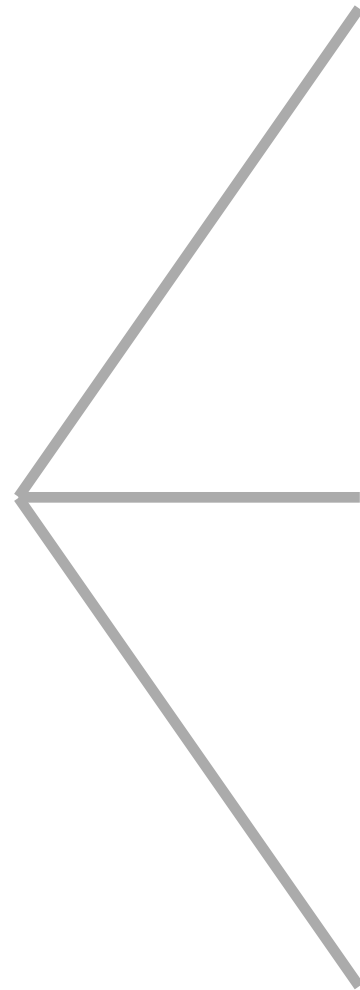
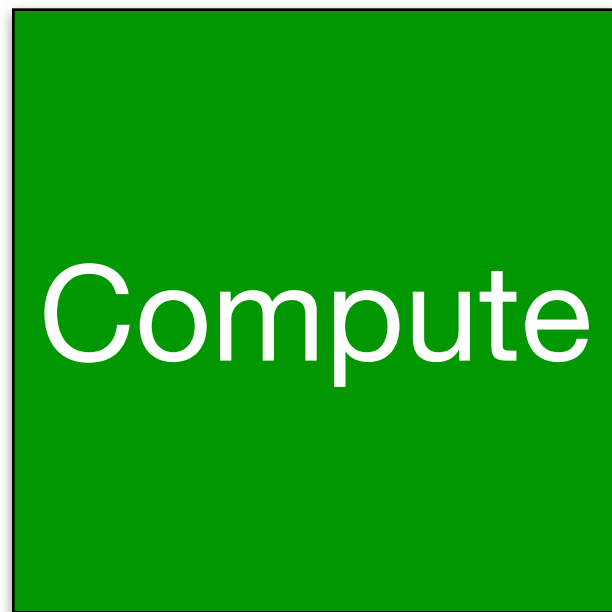




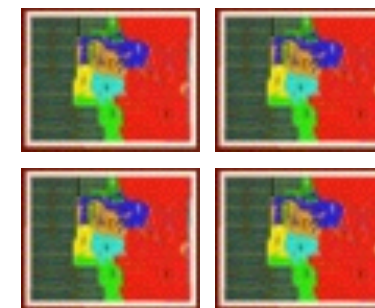
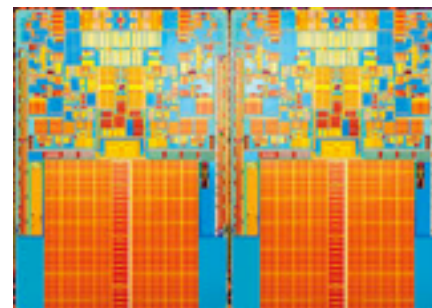
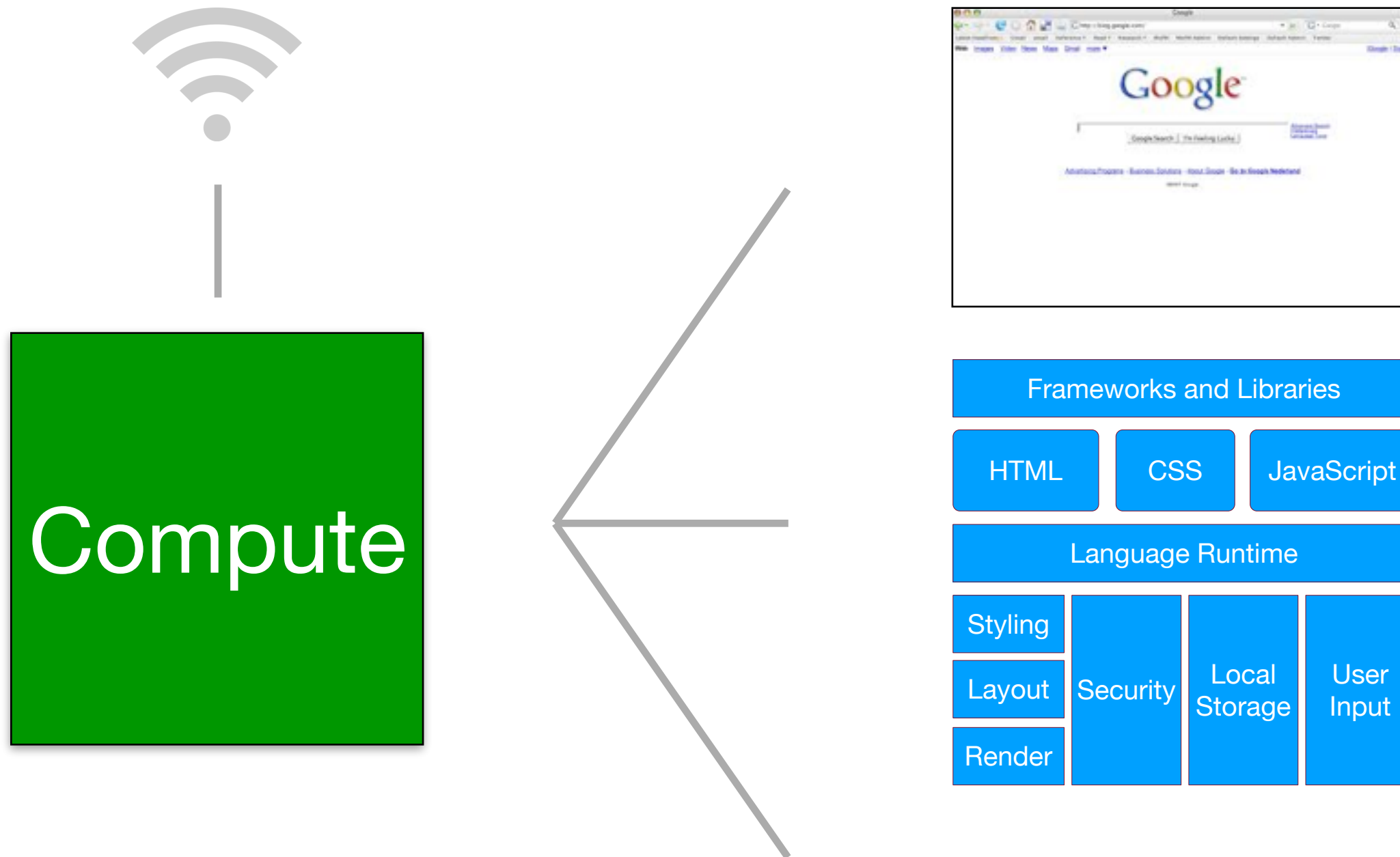
# Web Browsing from a Compute Perspective



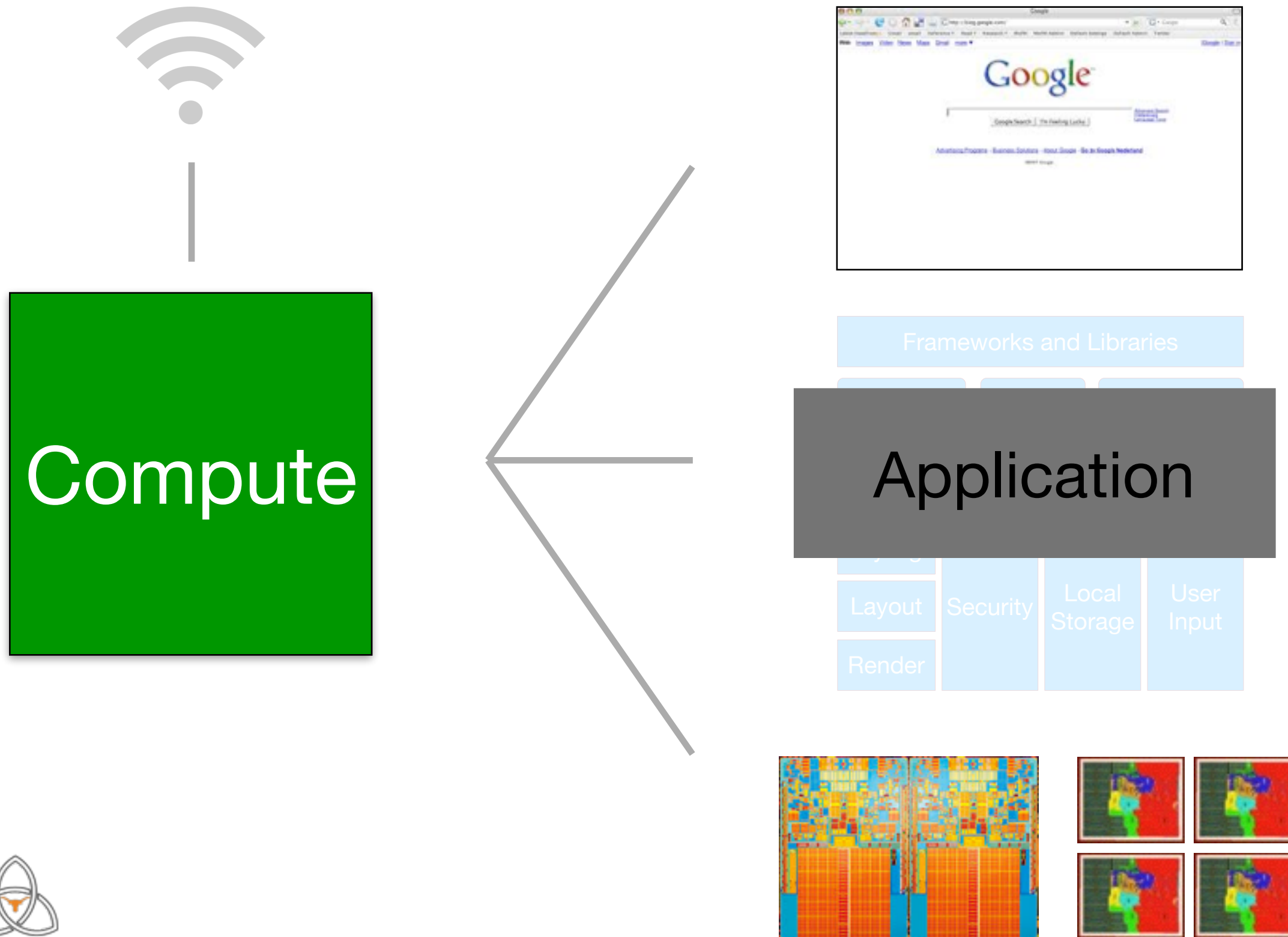
# Web Browsing from a Compute Perspective



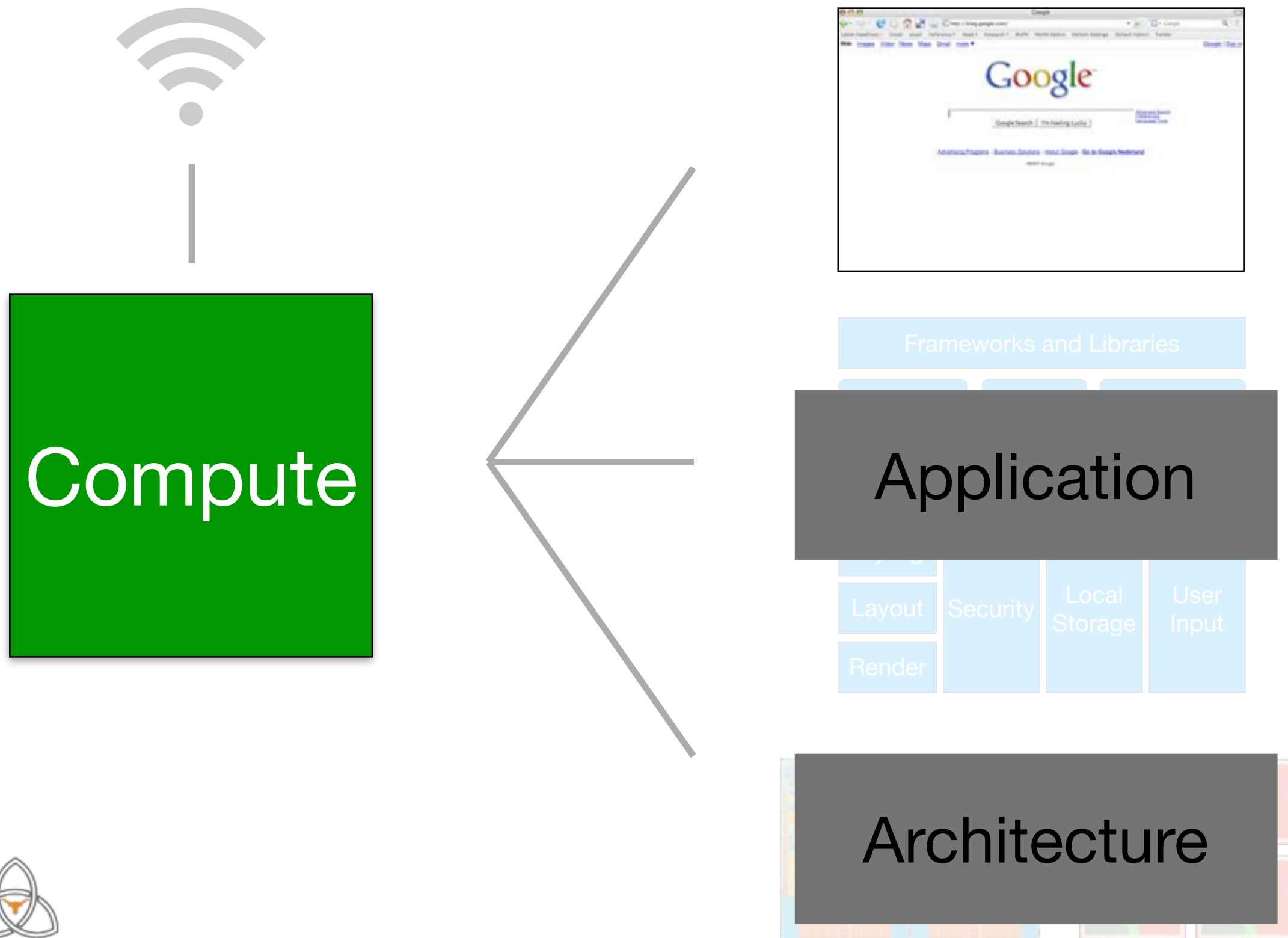
# Web Browsing from a Compute Perspective



# Web Browsing from a Compute Perspective

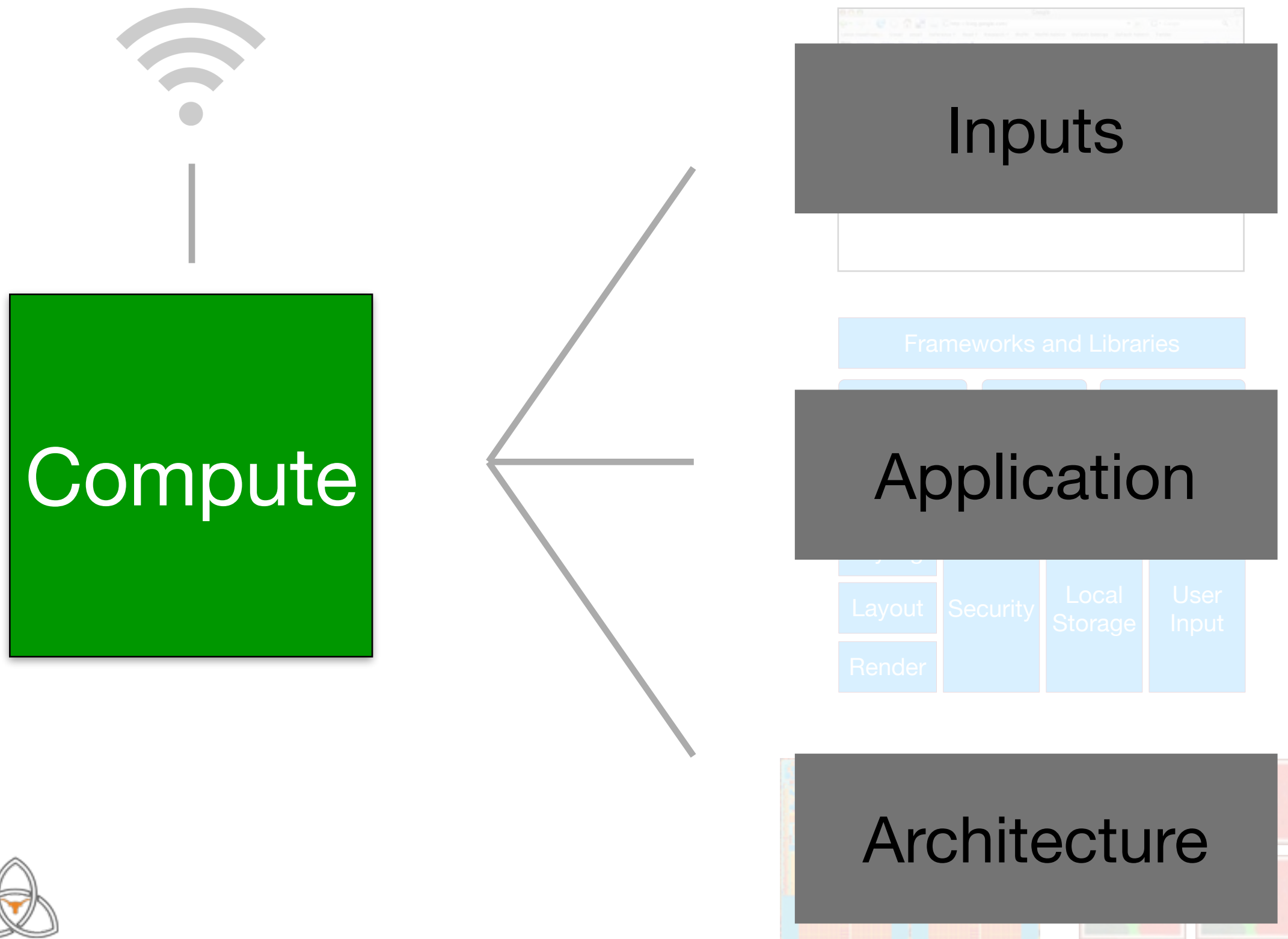


# Web Browsing from a Compute Perspective

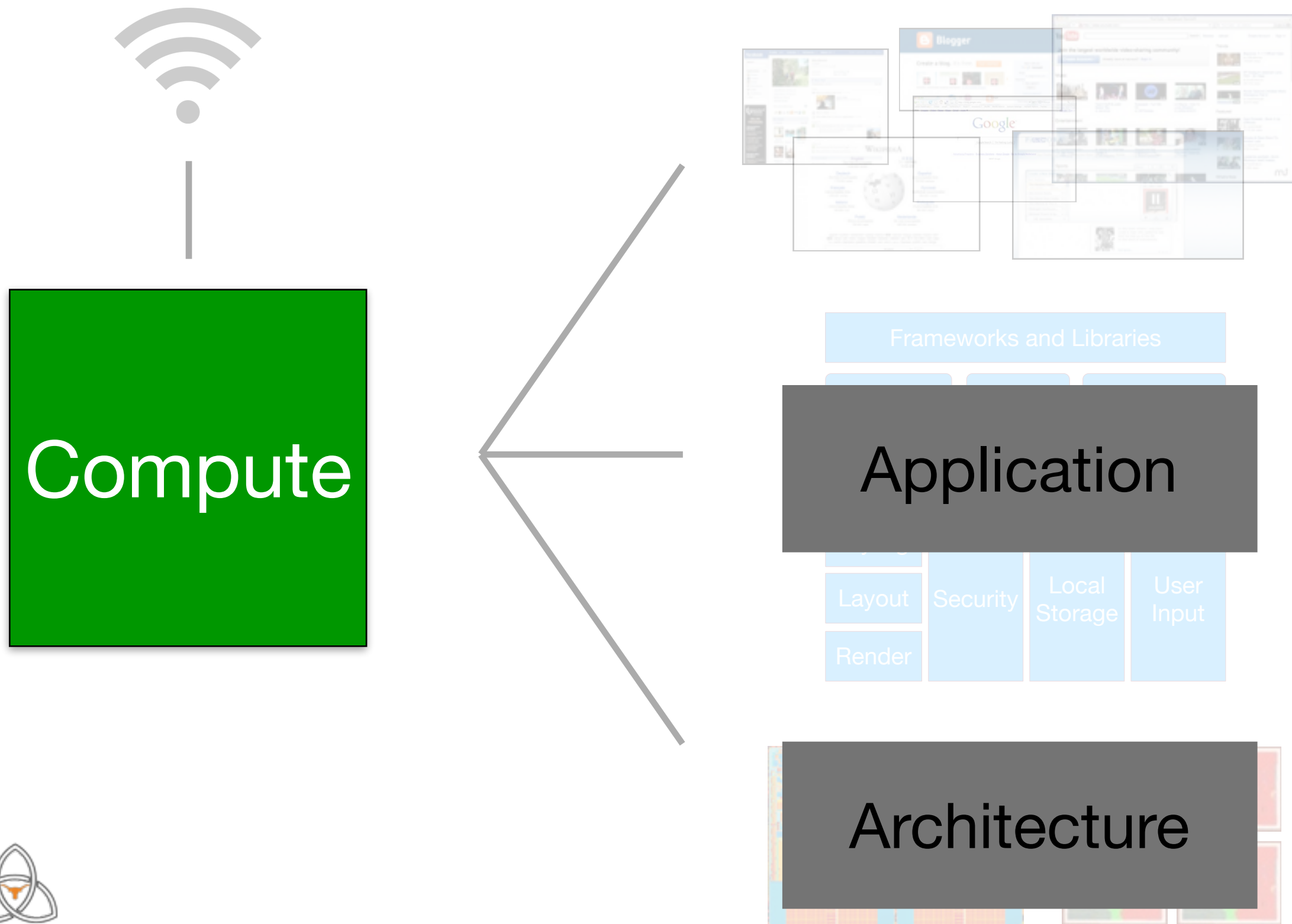


# Web Browsing from a Compute Perspective

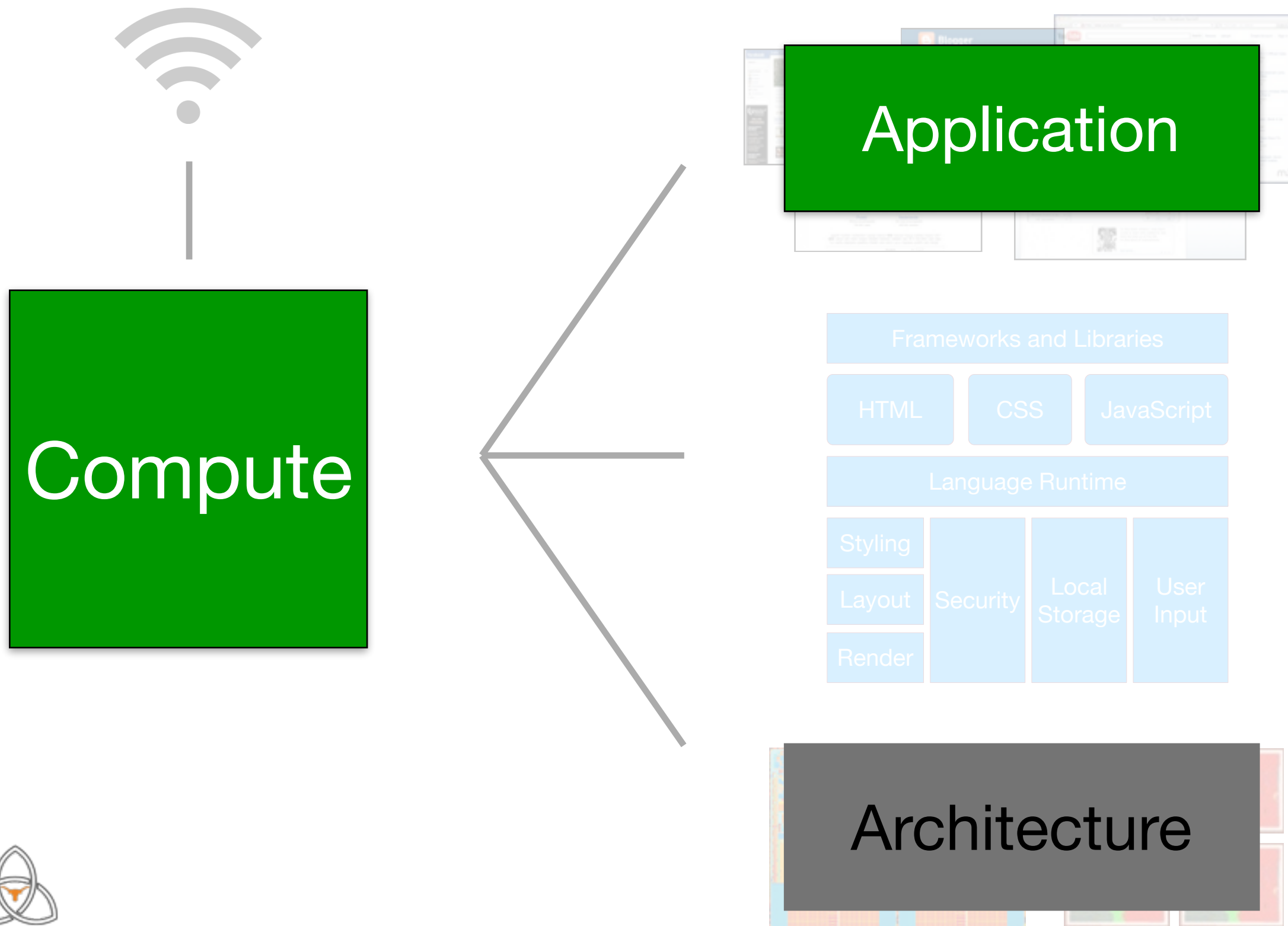
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# Web Browsing from a Compute Perspective

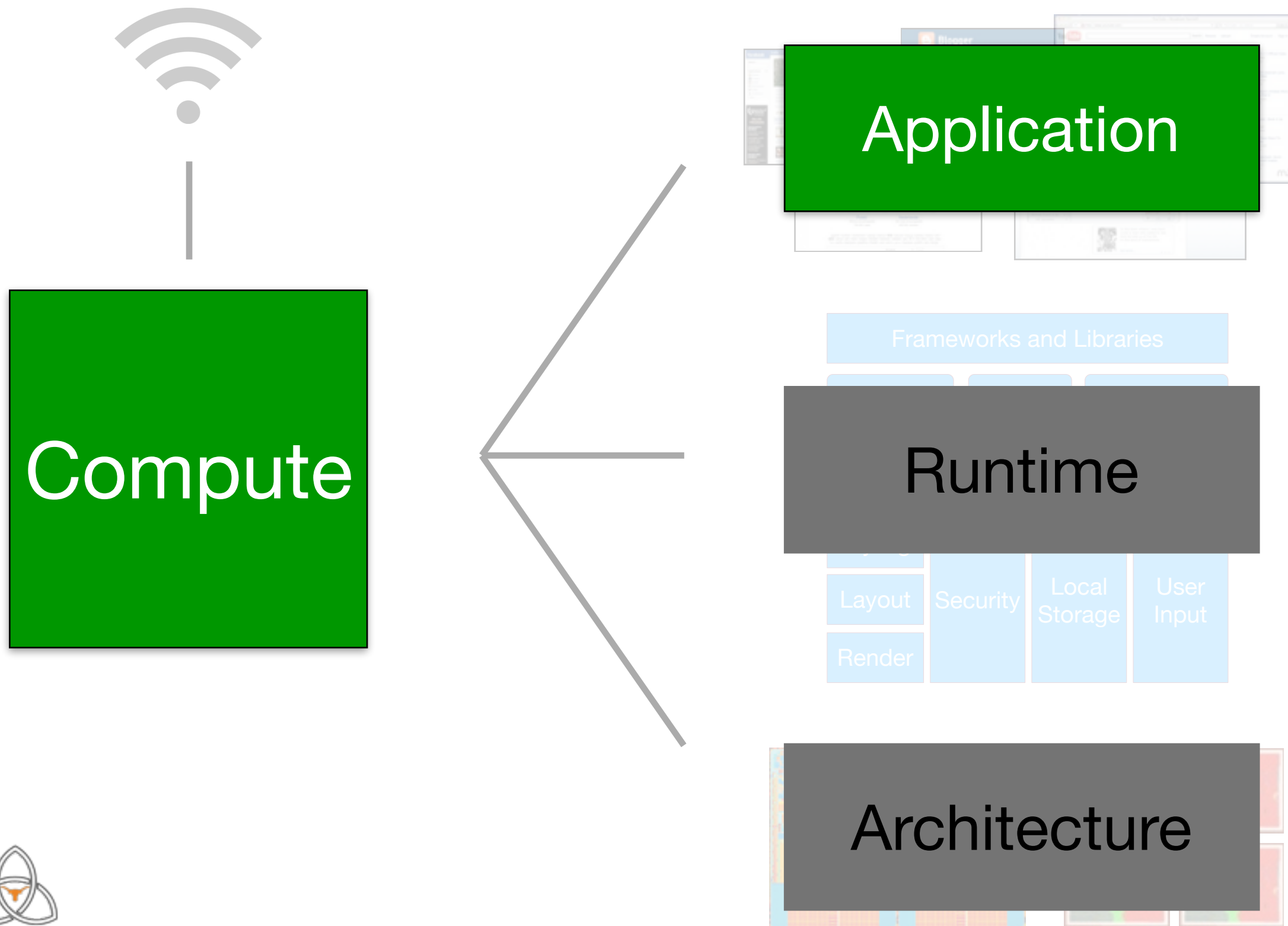


# Web Browsing from a Compute Perspective

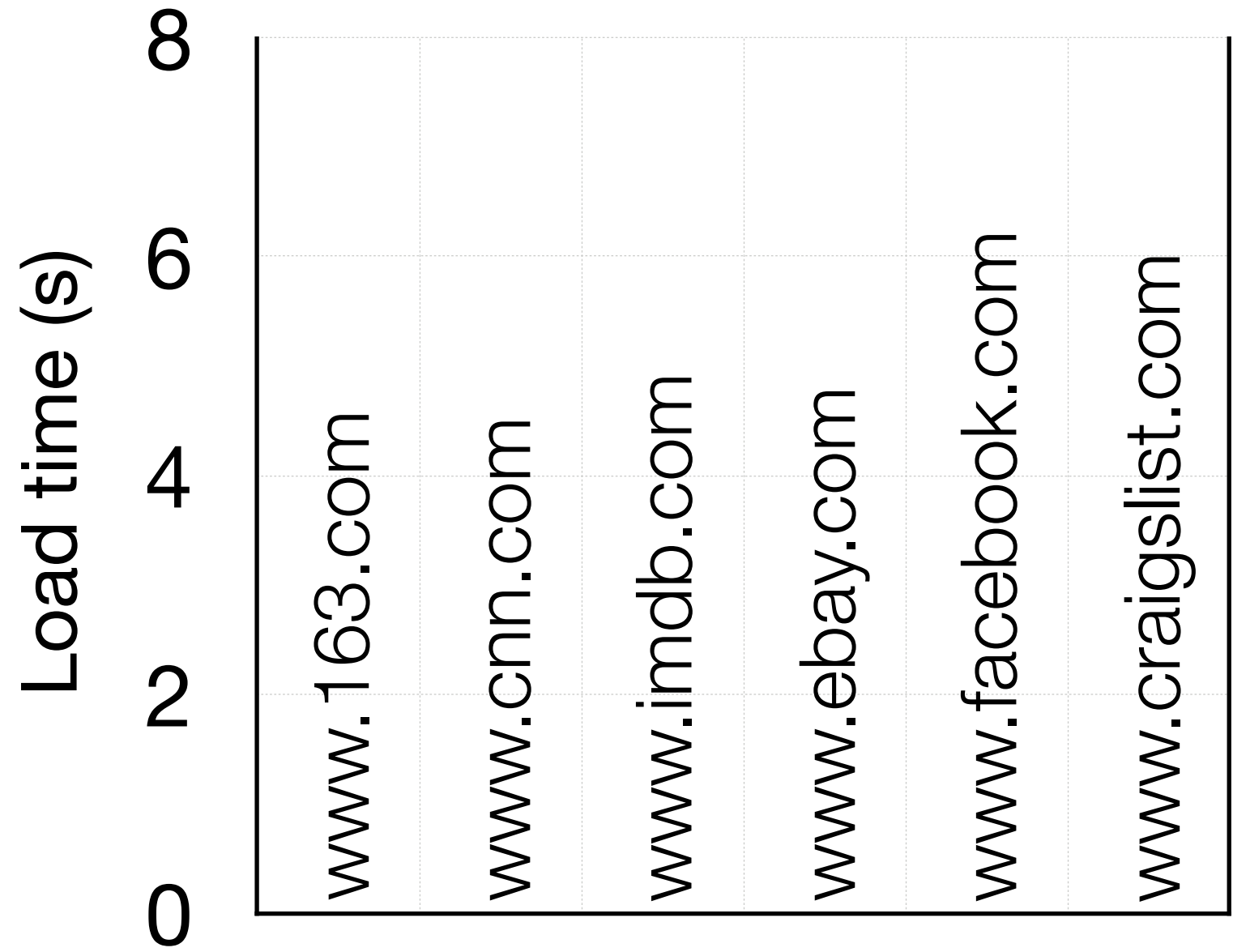




# Web Browsing from a Compute Perspective

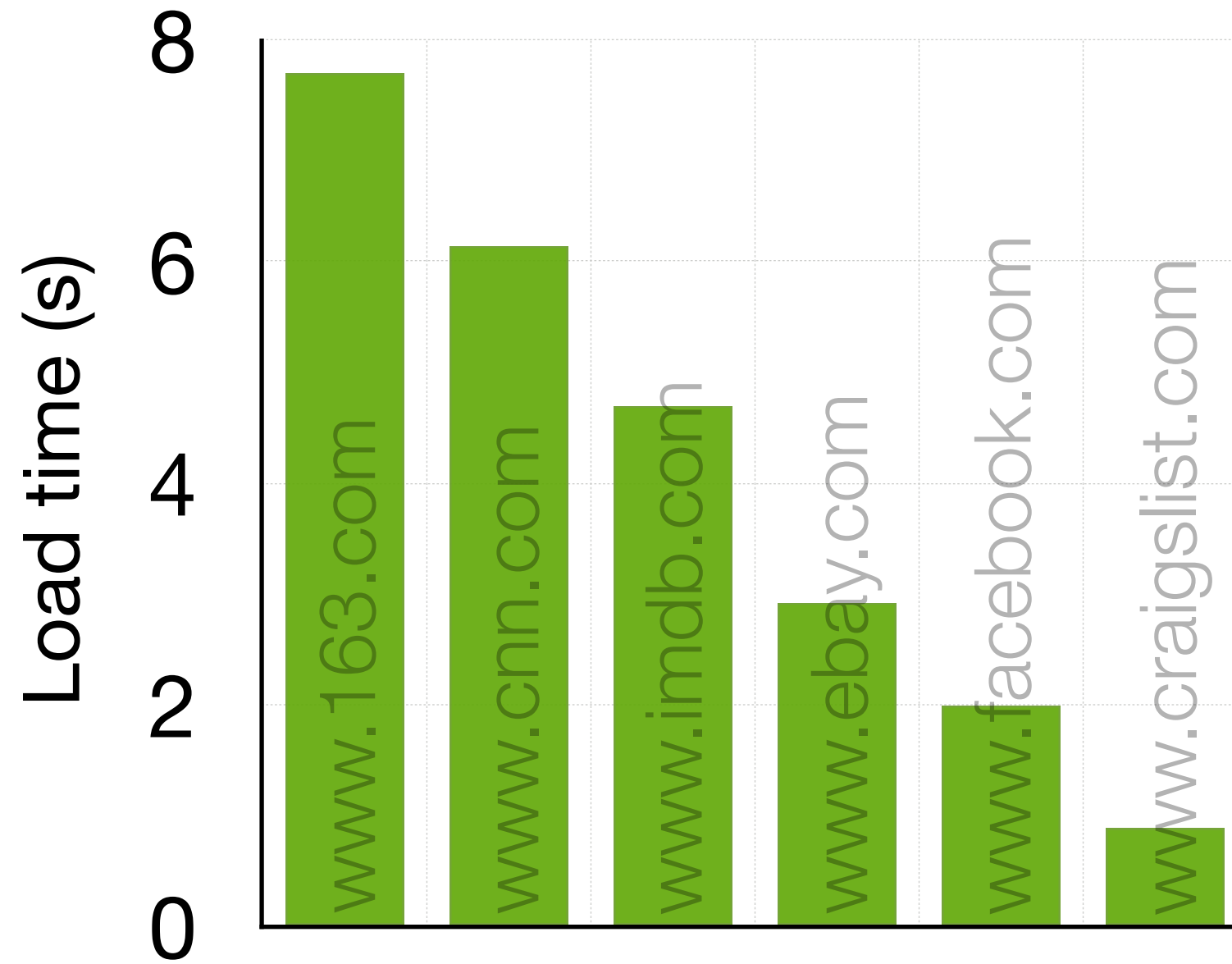


# Webpage-Level Characterization

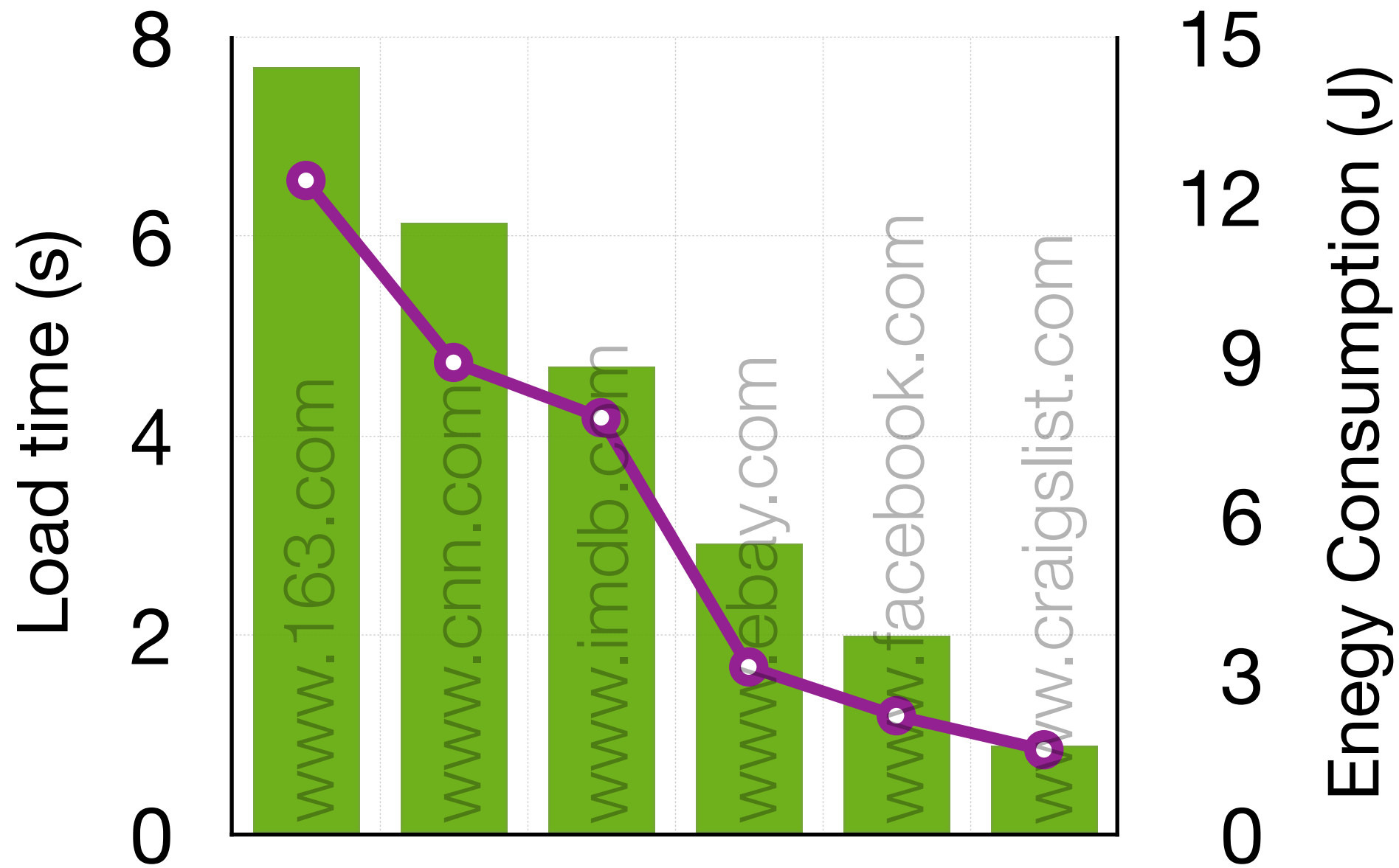


# Webpage-Level Characterization

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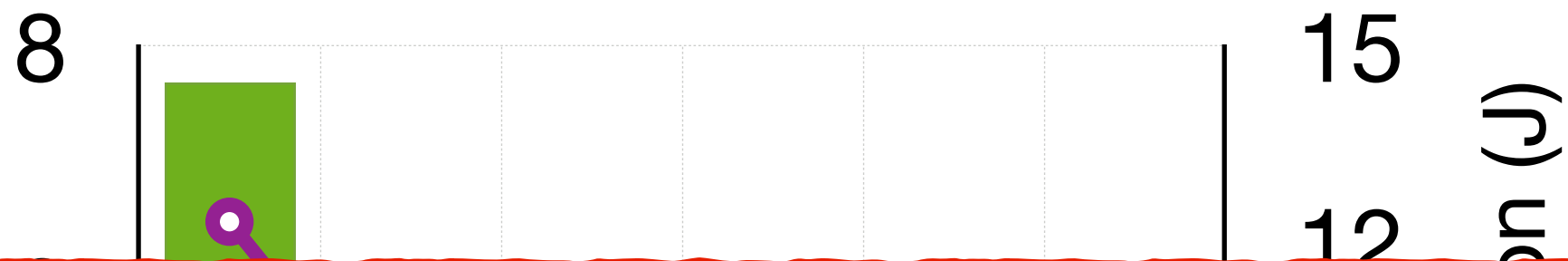


# Webpage-Level Characterization

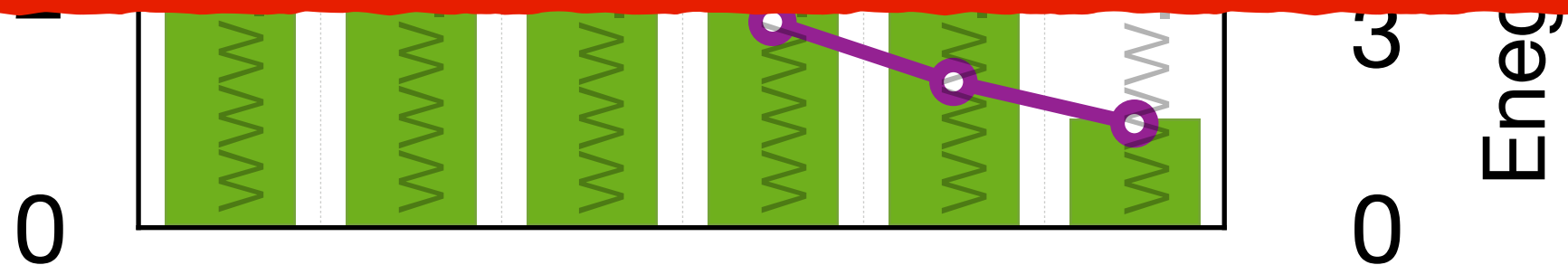


# Webpage-Level Characterization

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**Webpages are inherently different.  
Need a systematic way to analyze them.**



# Breaking Down the Computations

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# Breaking Down the Computations

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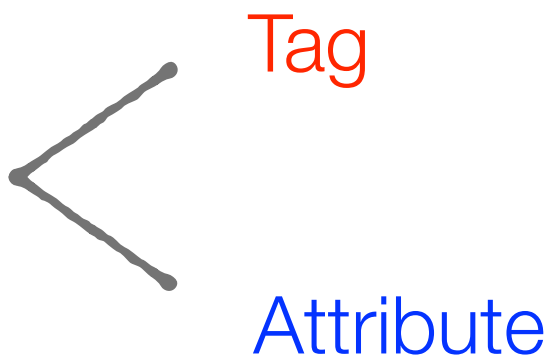
HTML (Structure)

CSS (Style)



# Breaking Down the Computations

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HTML (Structure) 

CSS (Style)

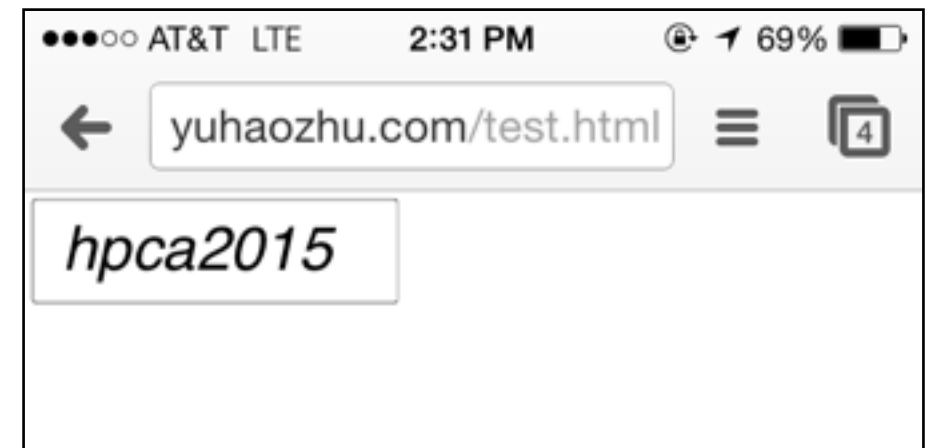




# Breaking Down the Computations

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HTML (Structure)  `<input value="hpca2015">`



CSS (Style)

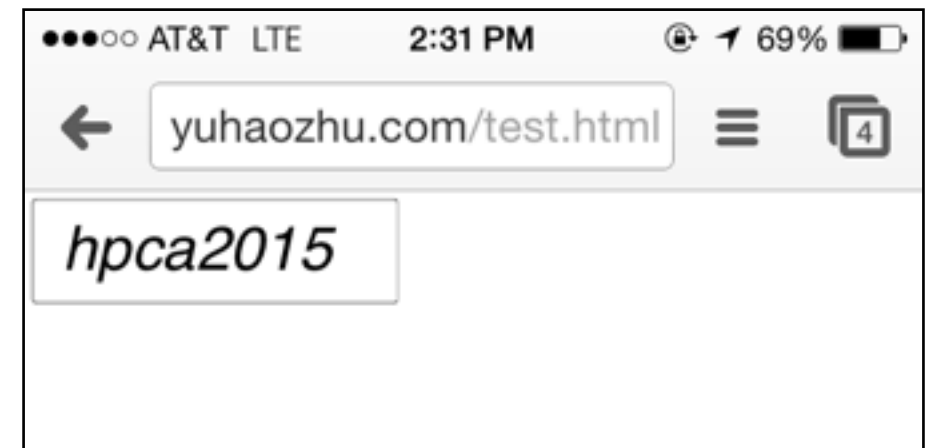


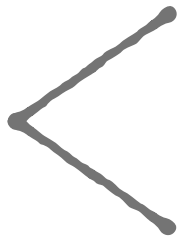
# Breaking Down the Computations

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HTML (Structure)  Tag Attribute

`<input value="hpca2015">`



CSS (Style)  Selector Property

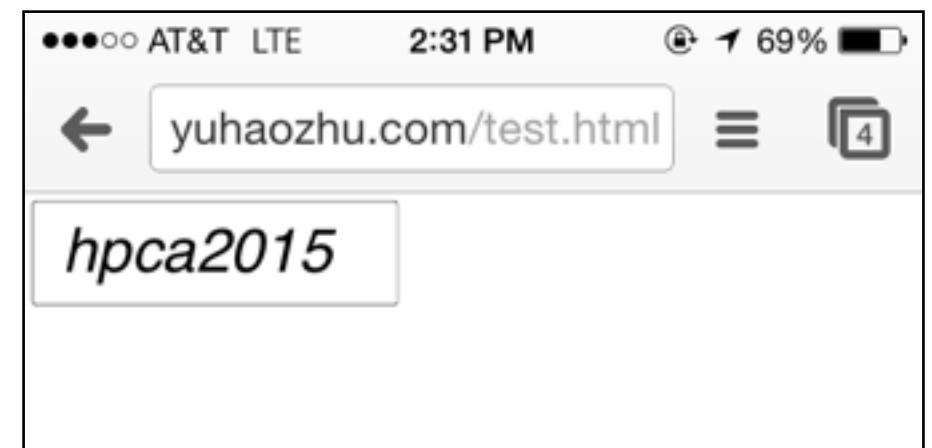


# Breaking Down the Computations

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HTML (Structure)  Tag Attribute

`<input value="hpca2015">`

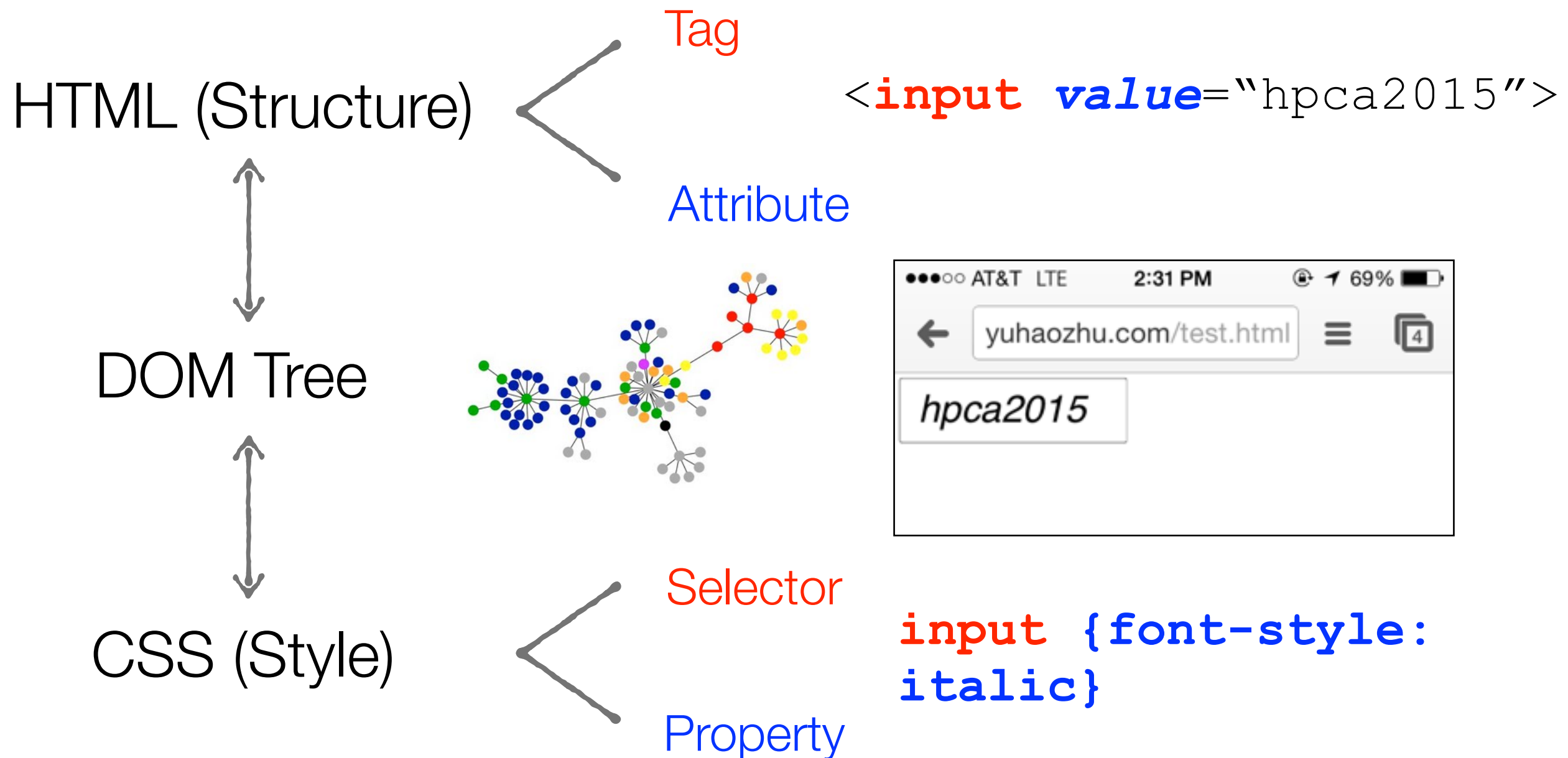


CSS (Style)  Selector Property

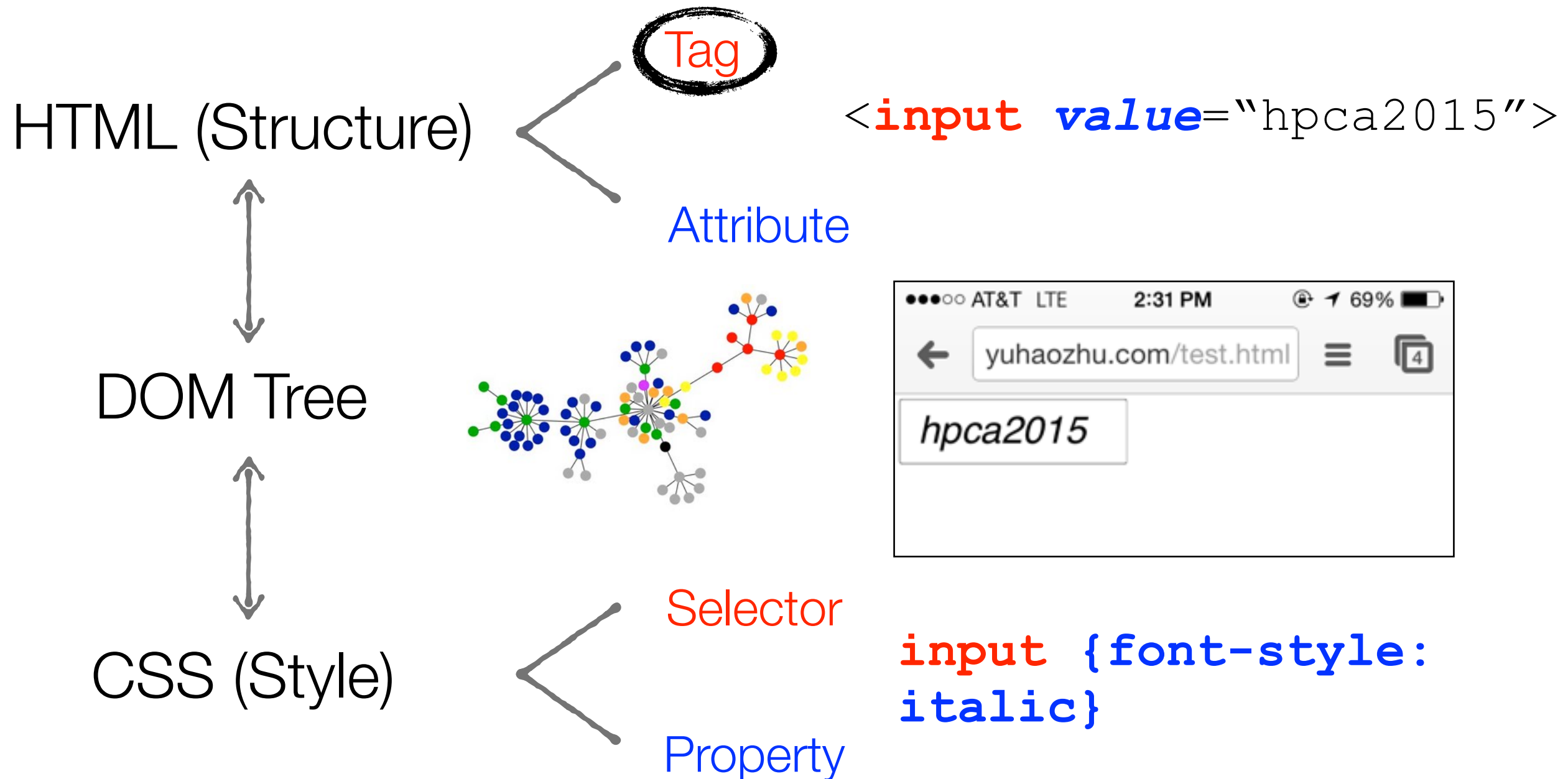
`input {font-style: italic}`



# Breaking Down the Computations



# Breaking Down the Computations

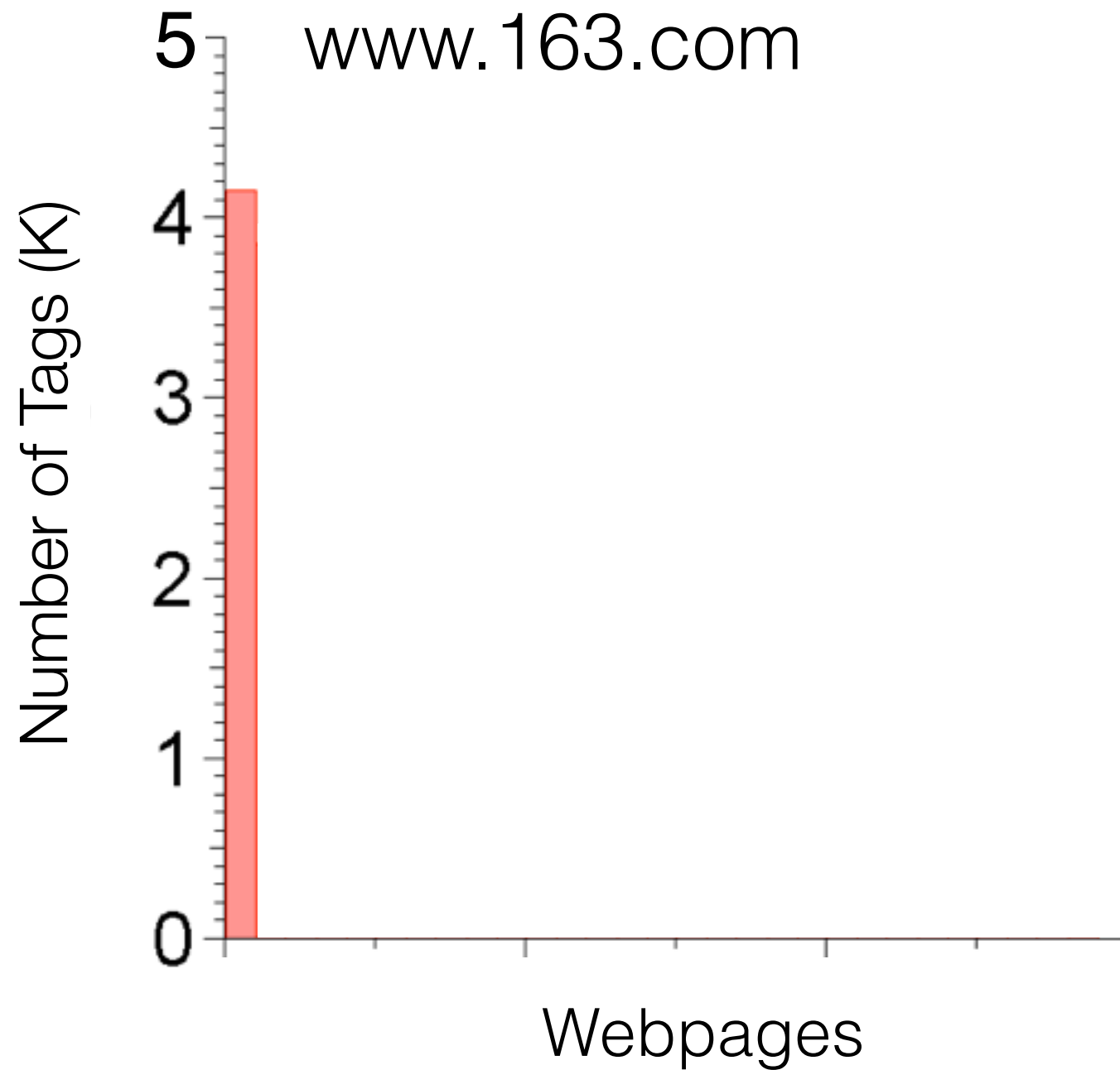


# HTML Tag Analysis

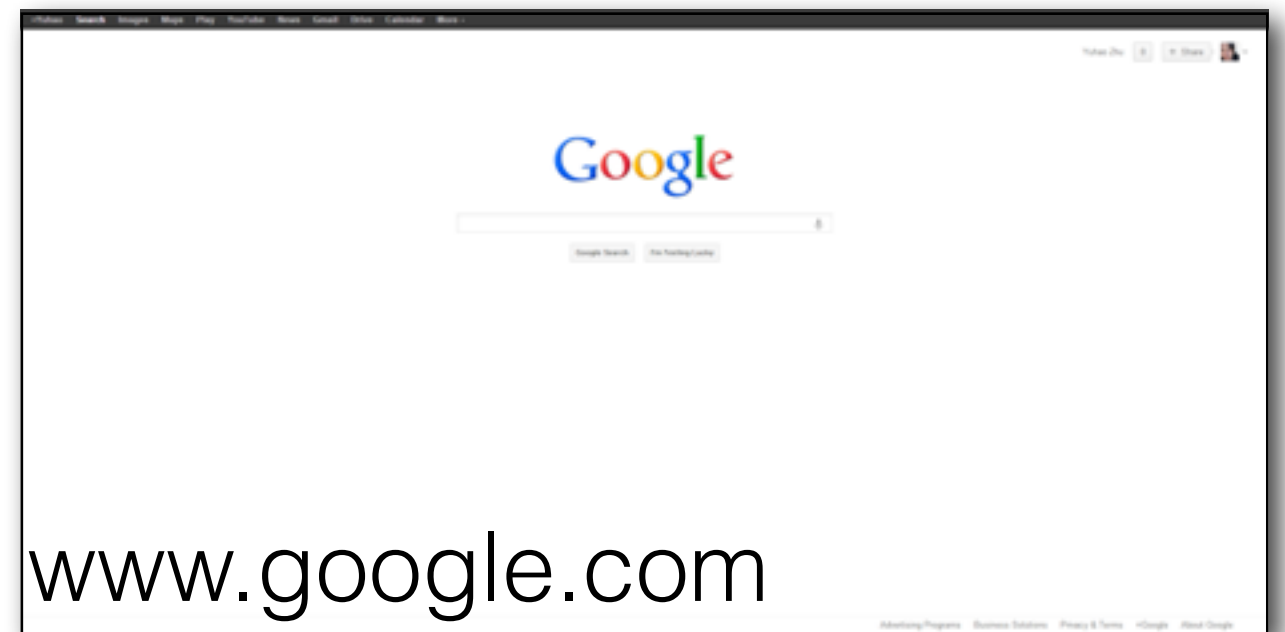
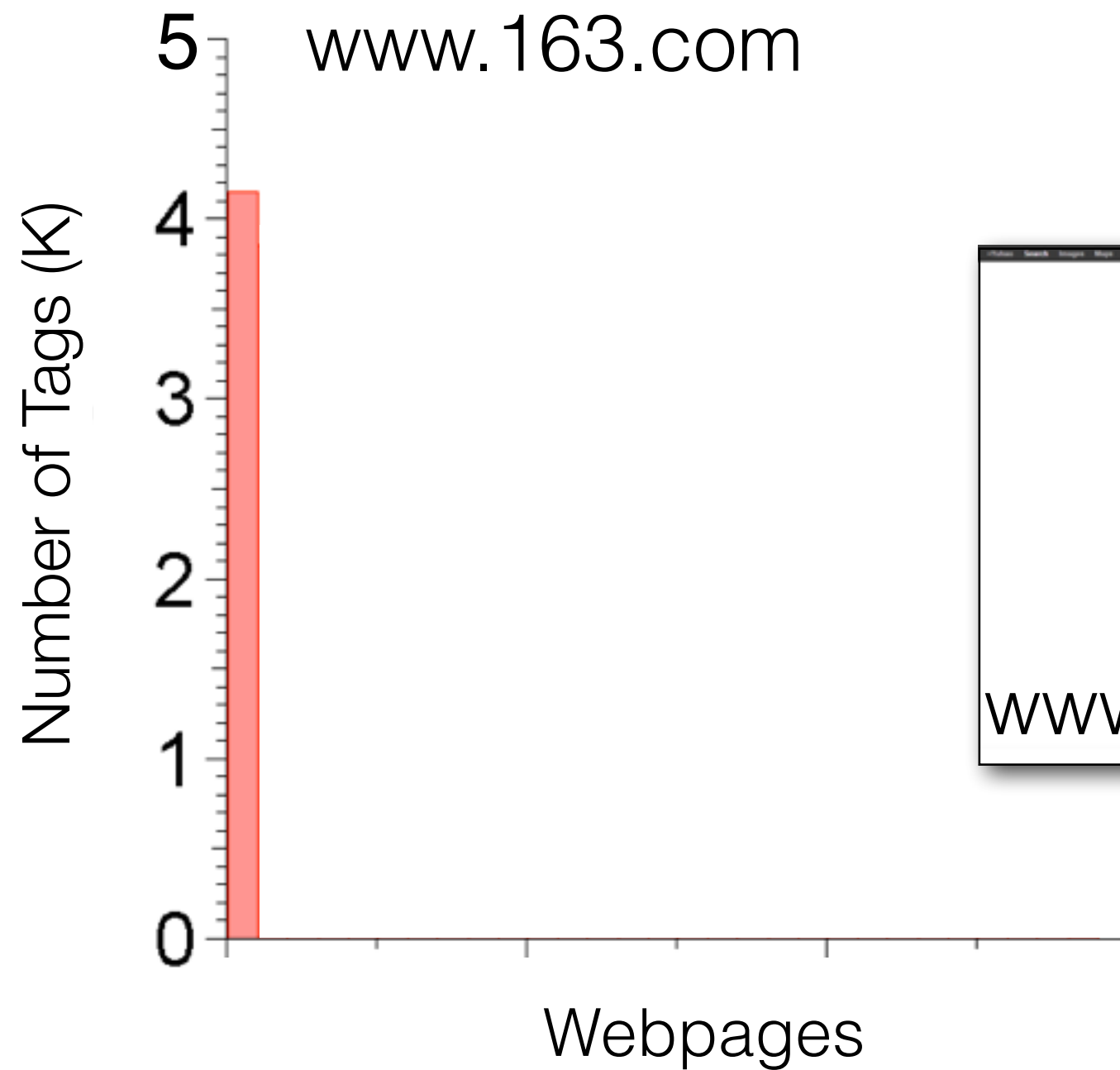
www.163.com



# HTML Tag Analysis

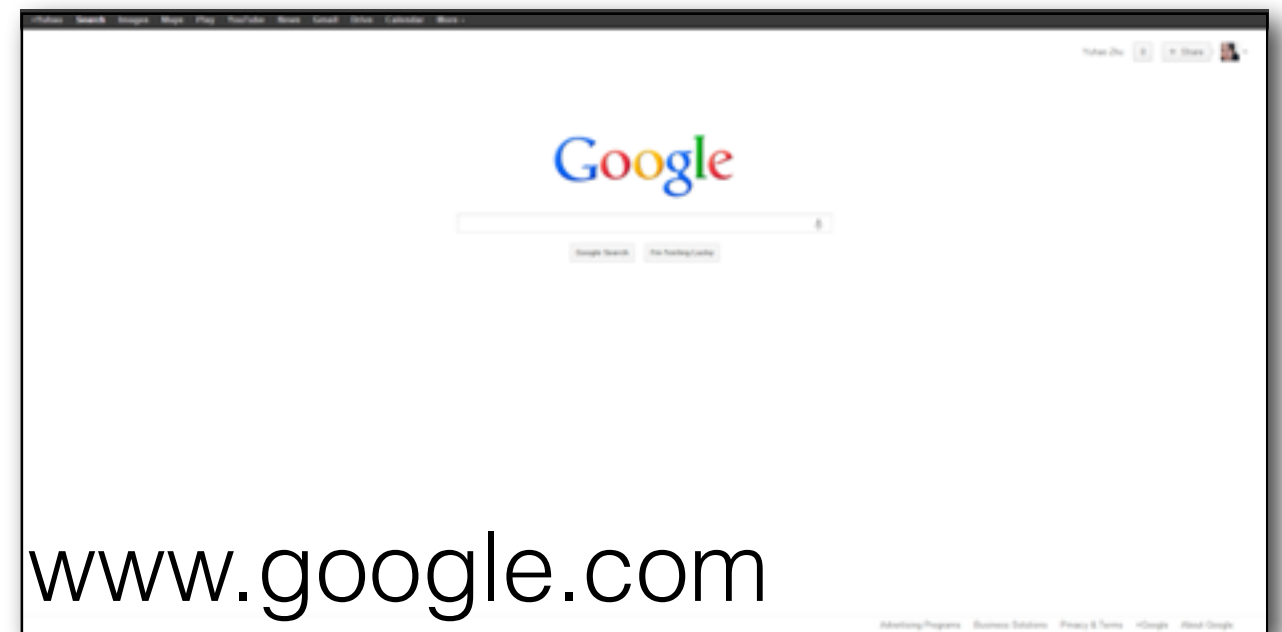
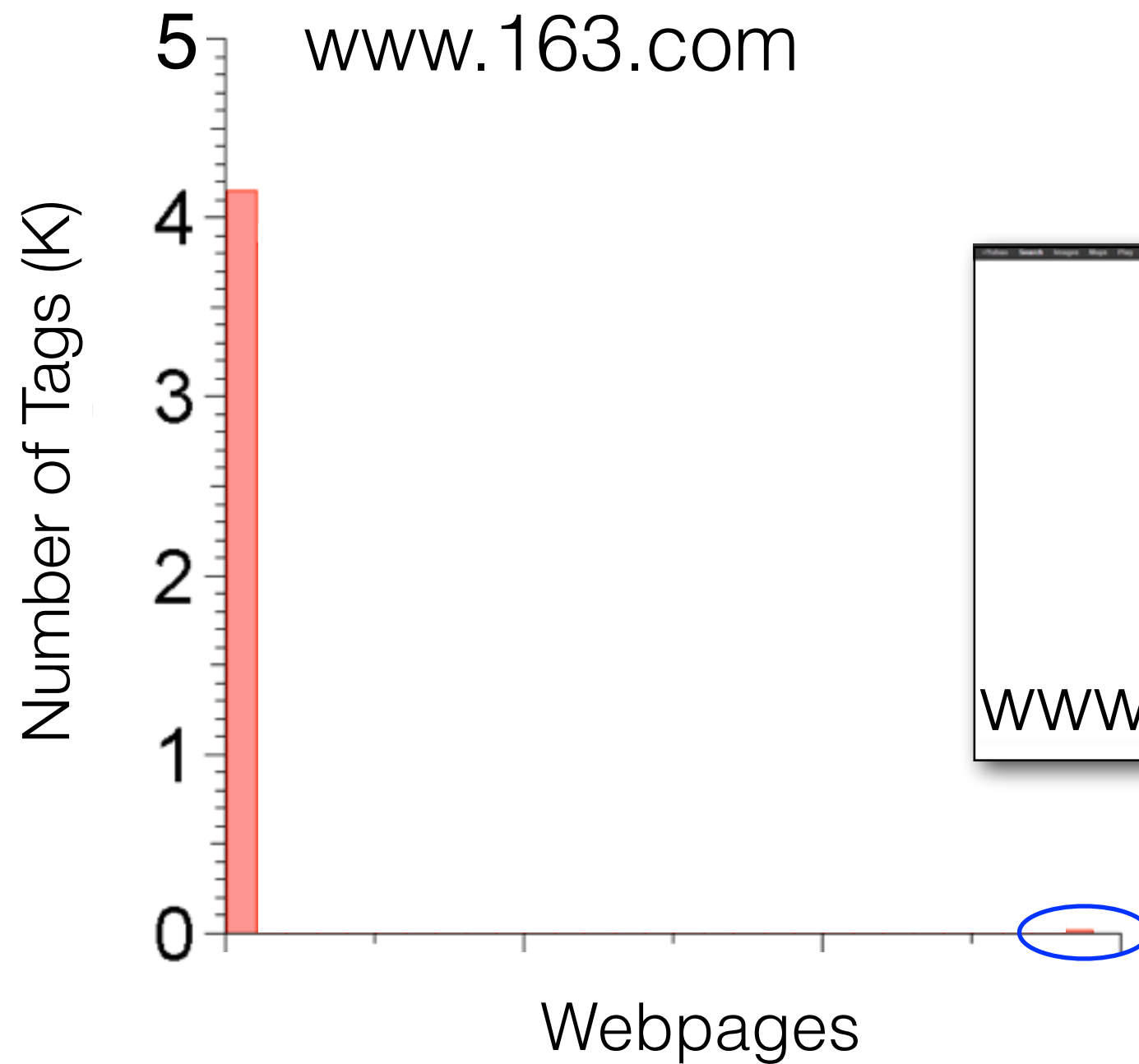


# HTML Tag Analysis



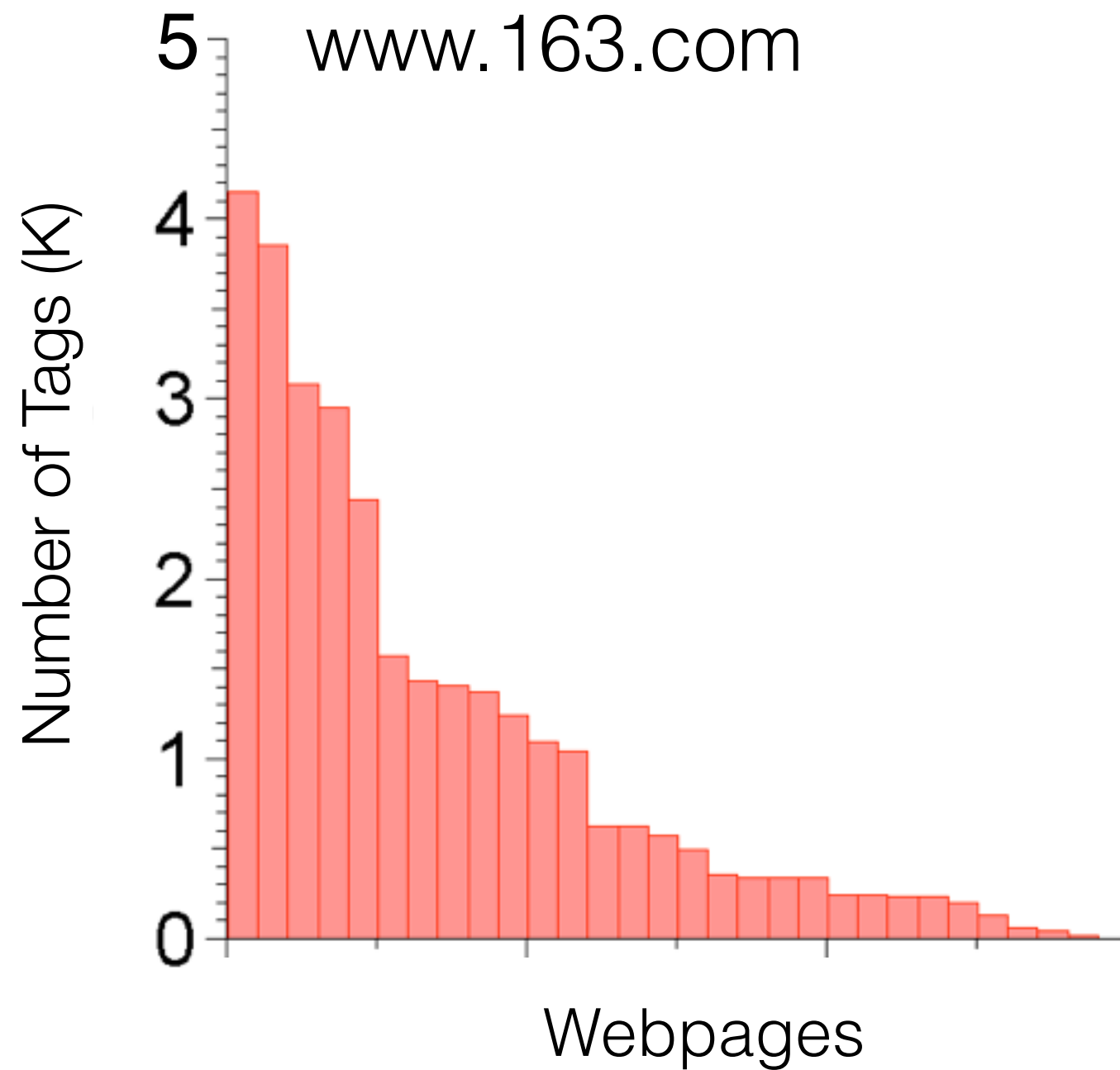


# HTML Tag Analysis



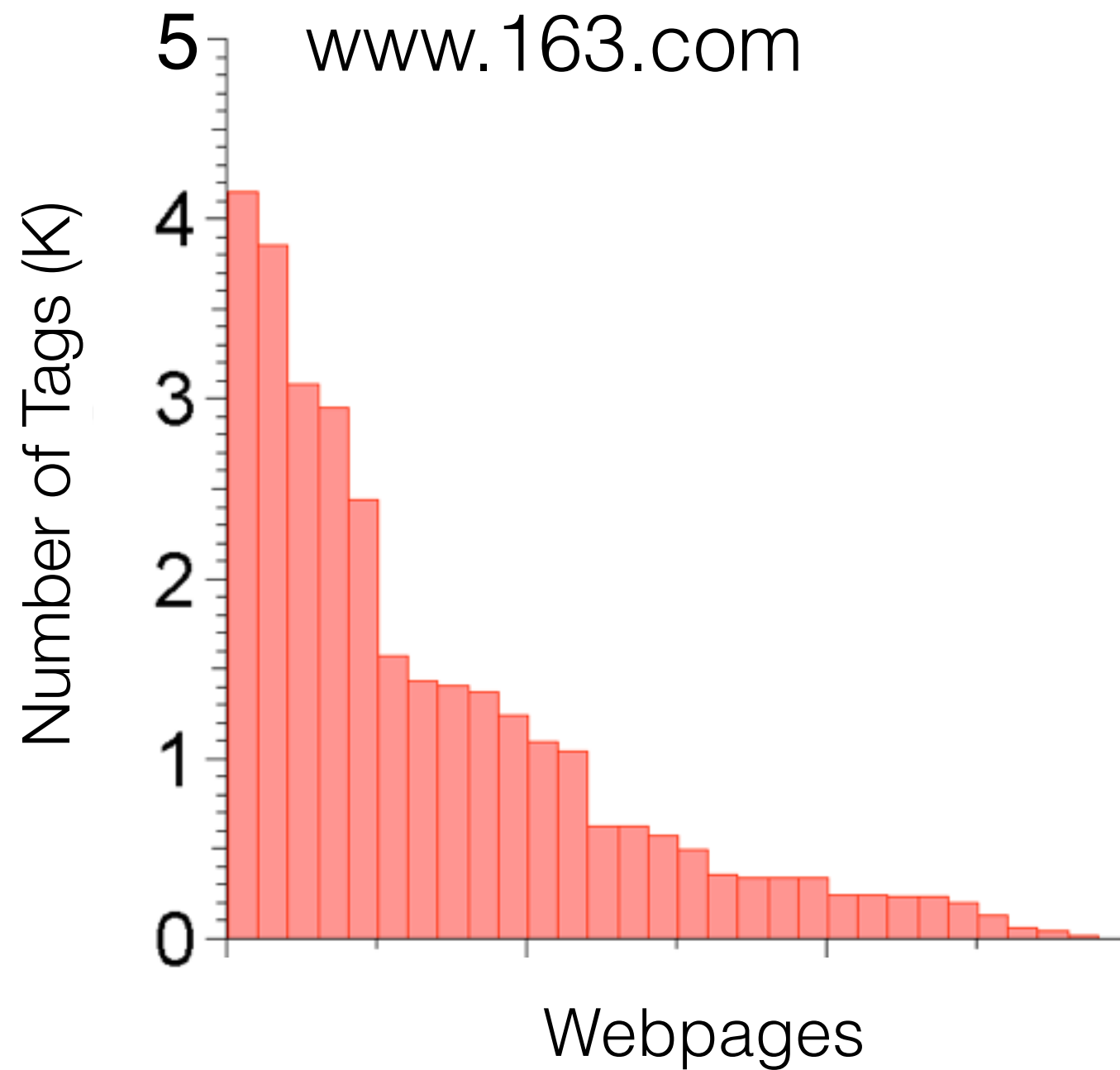
# HTML Tag Analysis

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# HTML Tag Analysis

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Webpages have different tag counts



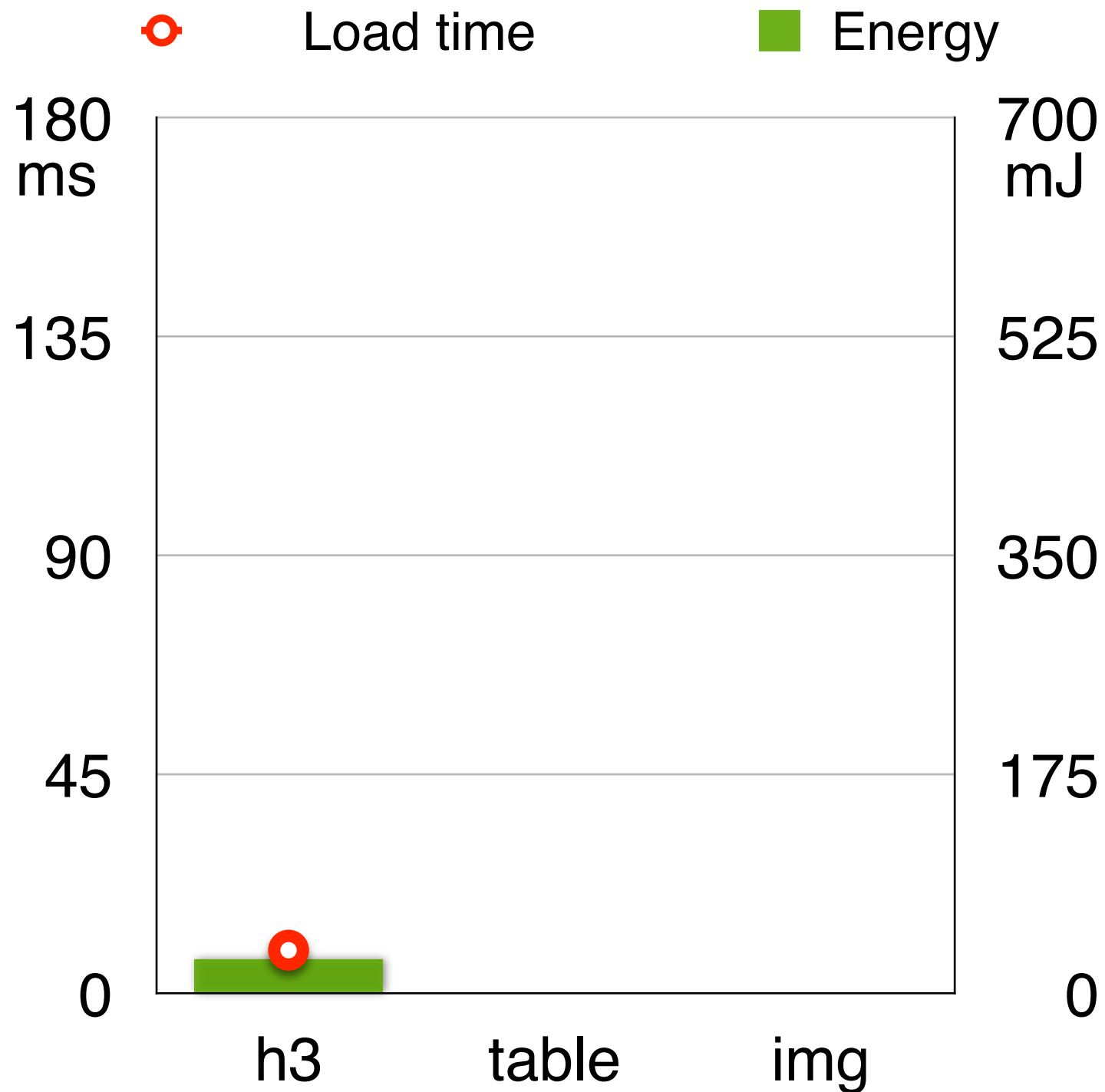
# Tag Processing Overhead



Webpages have  
different tag counts



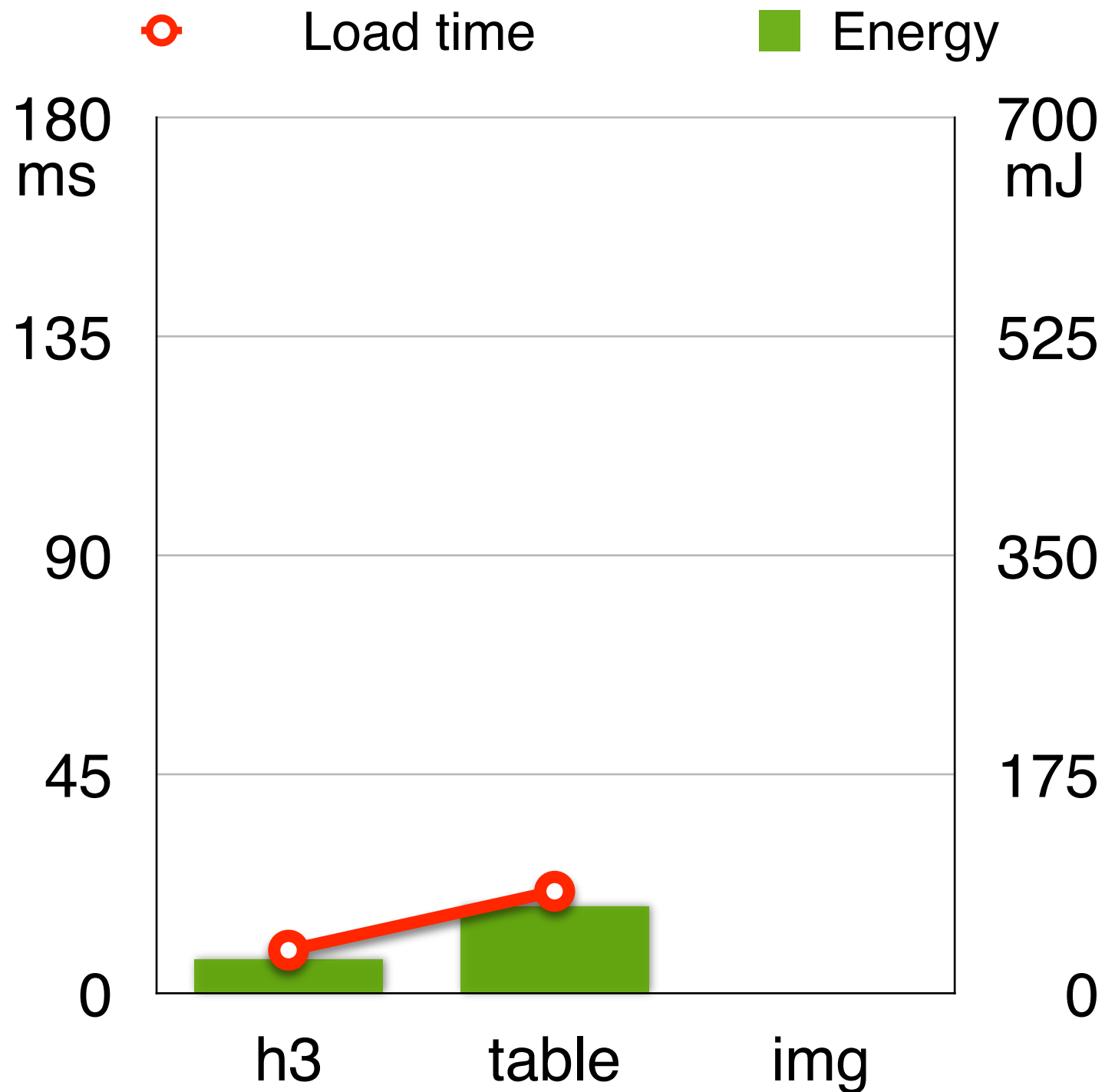
# Tag Processing Overhead



Webpages have different tag counts



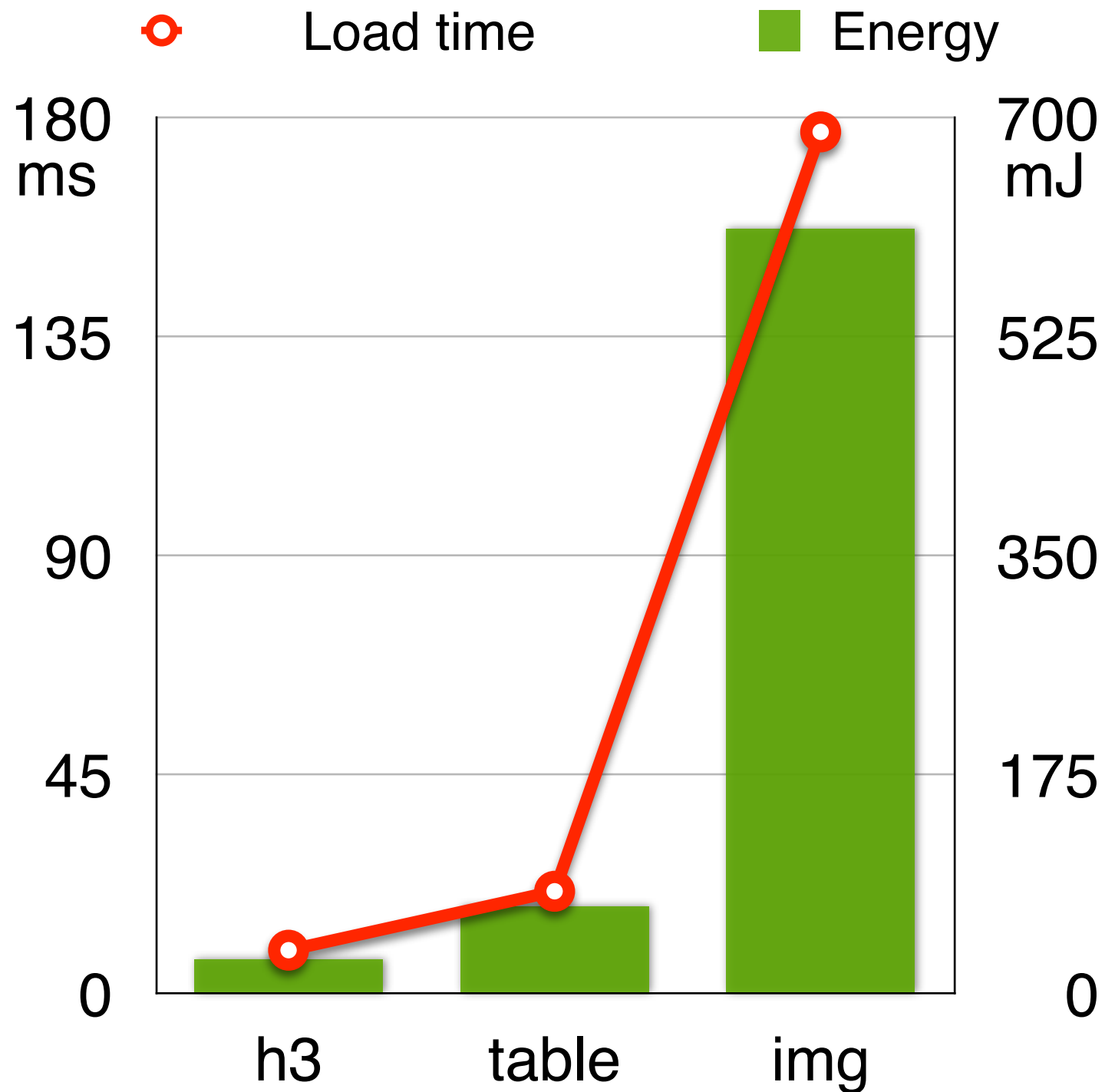
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Webpages have different tag counts



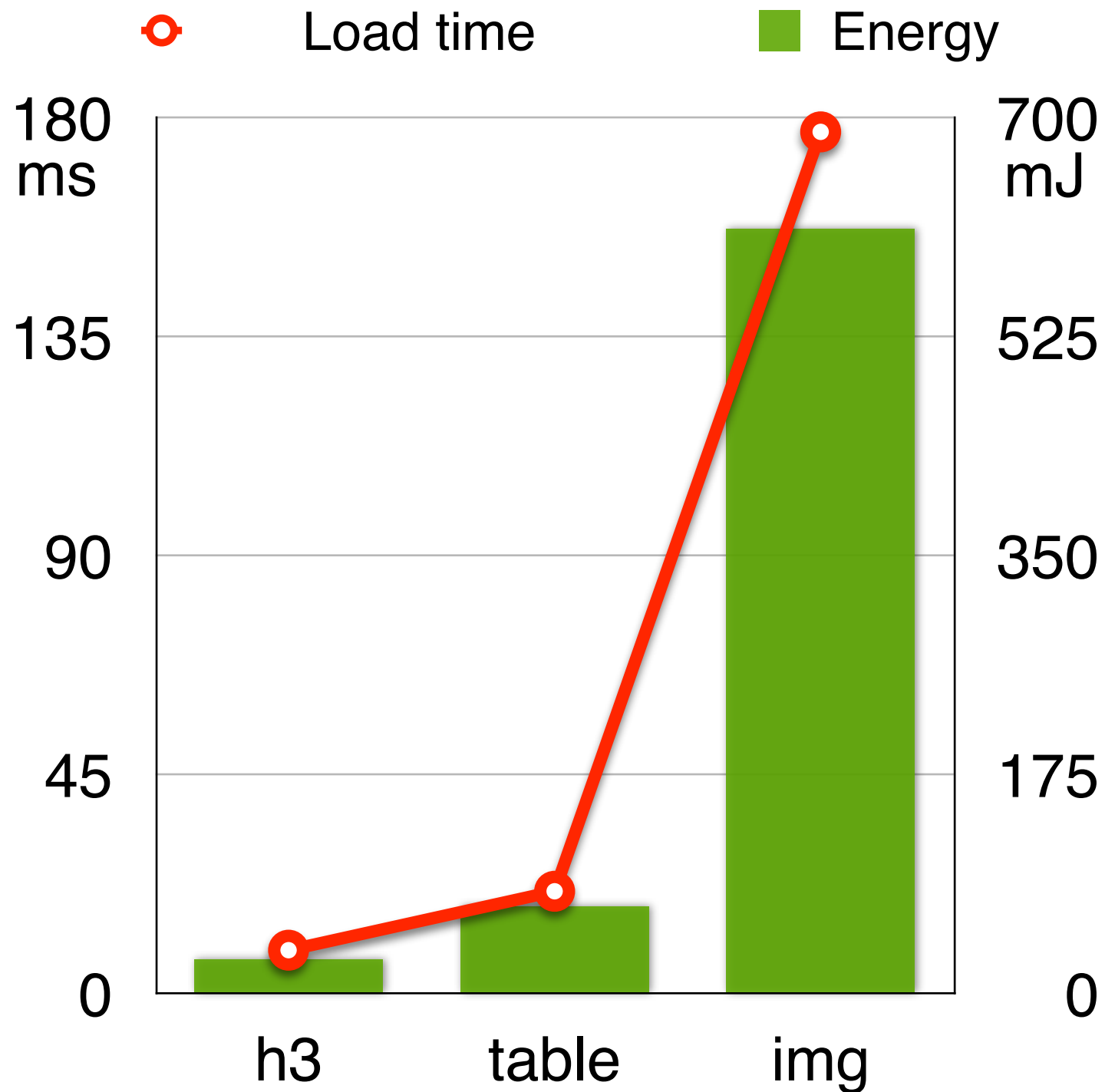
# Tag Processing Overhead



Webpages have different tag counts



# Tag Processing Overhead



Webpages have different tag counts

Tags have different processing overheads





# Capturing Webpage-Level Diversity

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Idea: **predict** webpage load time and energy consumption (responses) based on webpage characteristics (predictors)

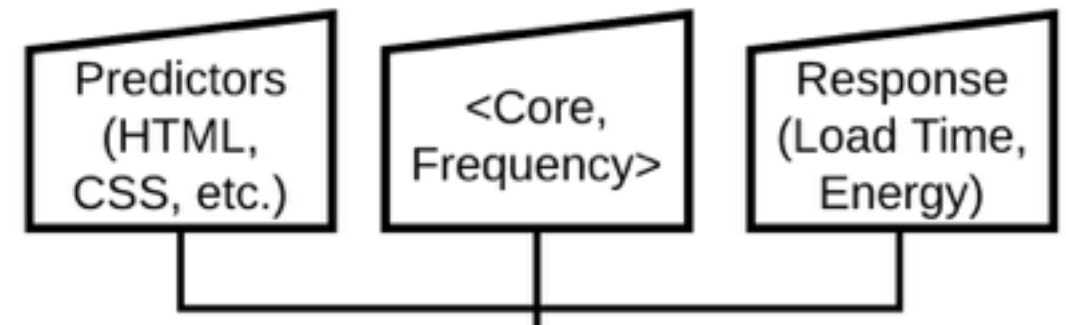


# Capturing Webpage-Level Diversity

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## Identify Predictors

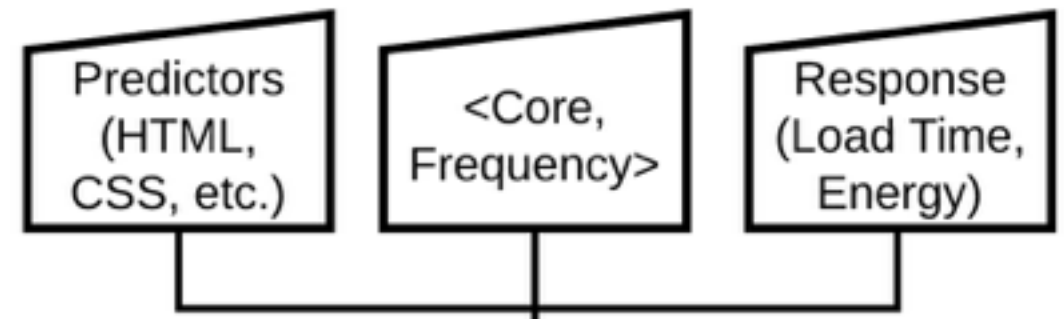
Training using hottest 2,500 webpages



# Capturing Webpage-Level Diversity

## Identify Predictors

Training using hottest 2,500 webpages



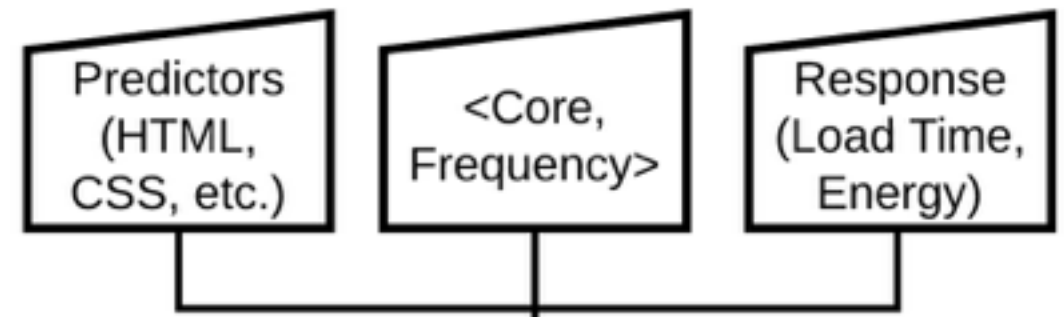
Group	Model Predictors
HTML	Number of each tag
	Number of each attribute
	Number of DOM tree nodes
CSS	Number of rules
	Number of each selector pattern
	Number of each property
Content-dependent	Total image size
	Total webpage size



# Capturing Webpage-Level Diversity

## Identify Predictors

Training using hottest 2,500 webpages

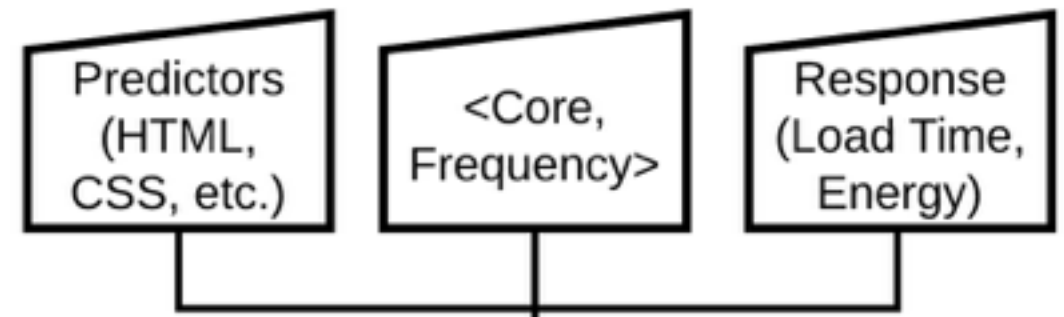


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Training using hottest 2,500 webpages



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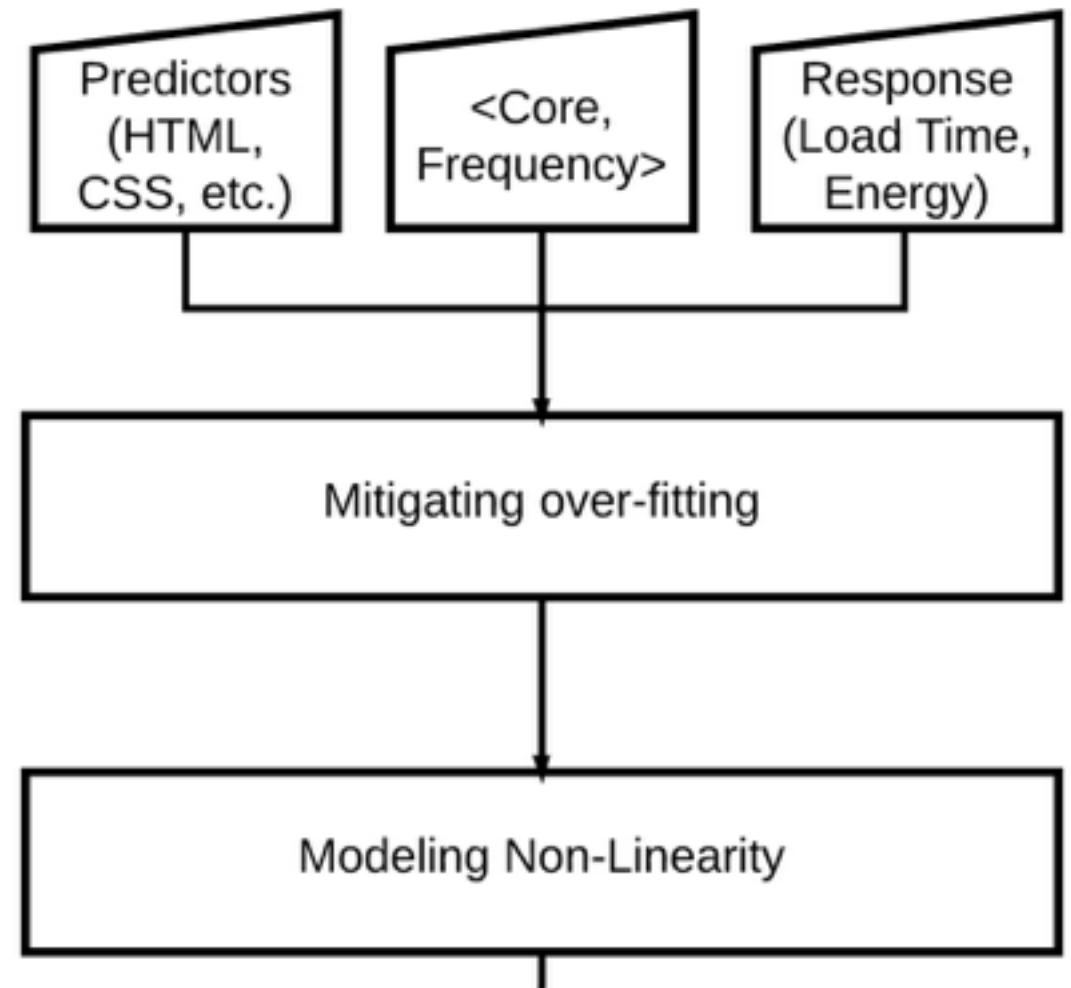
## Identify Predictors

Training using hottest 2,500 webpages



## Model Construction and Refinement

Start from the linear model and progressively refine it



# Capturing Webpage-Level Diversity

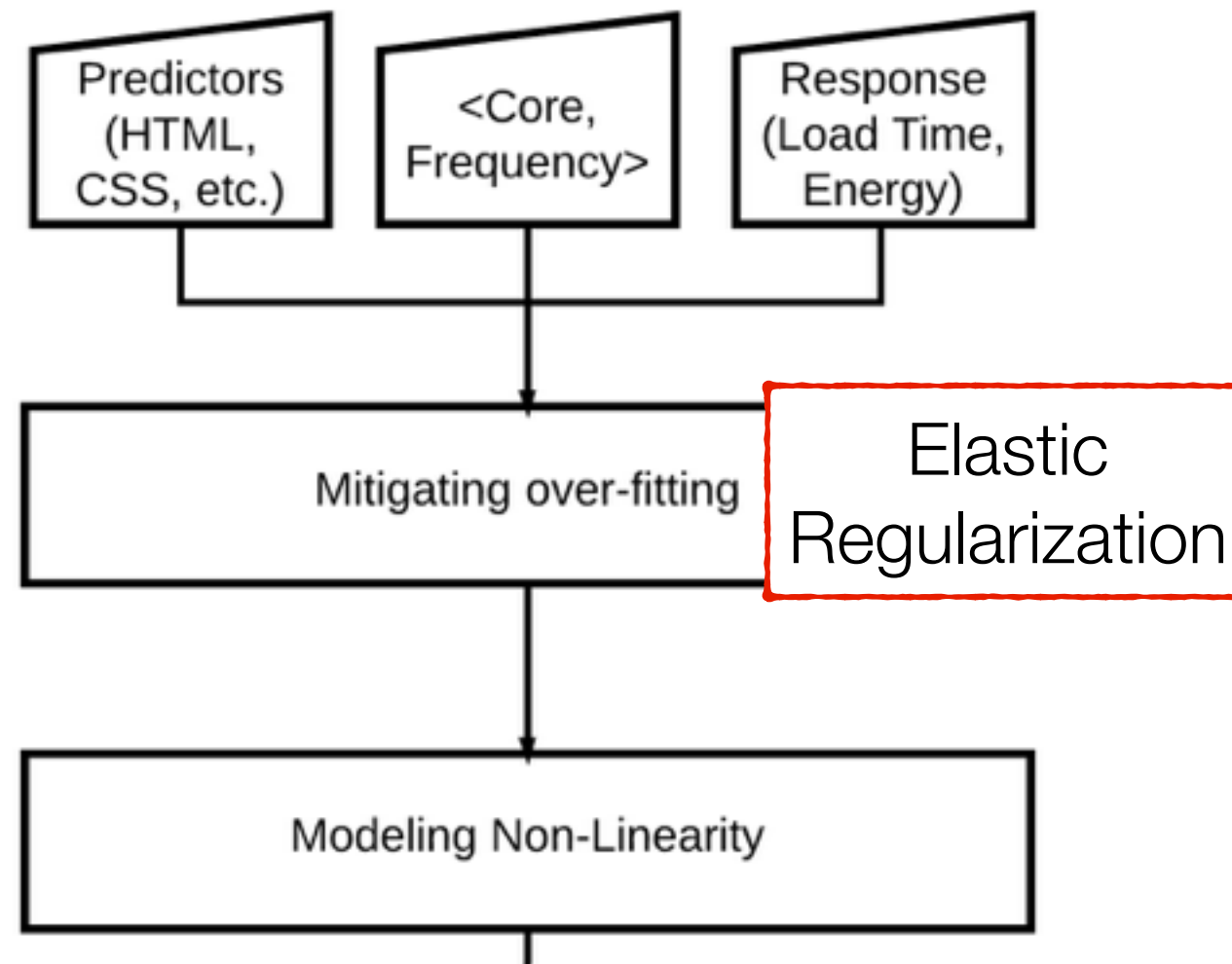
## Identify Predictors

Training using hottest 2,500 webpages



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# Capturing Webpage-Level Diversity

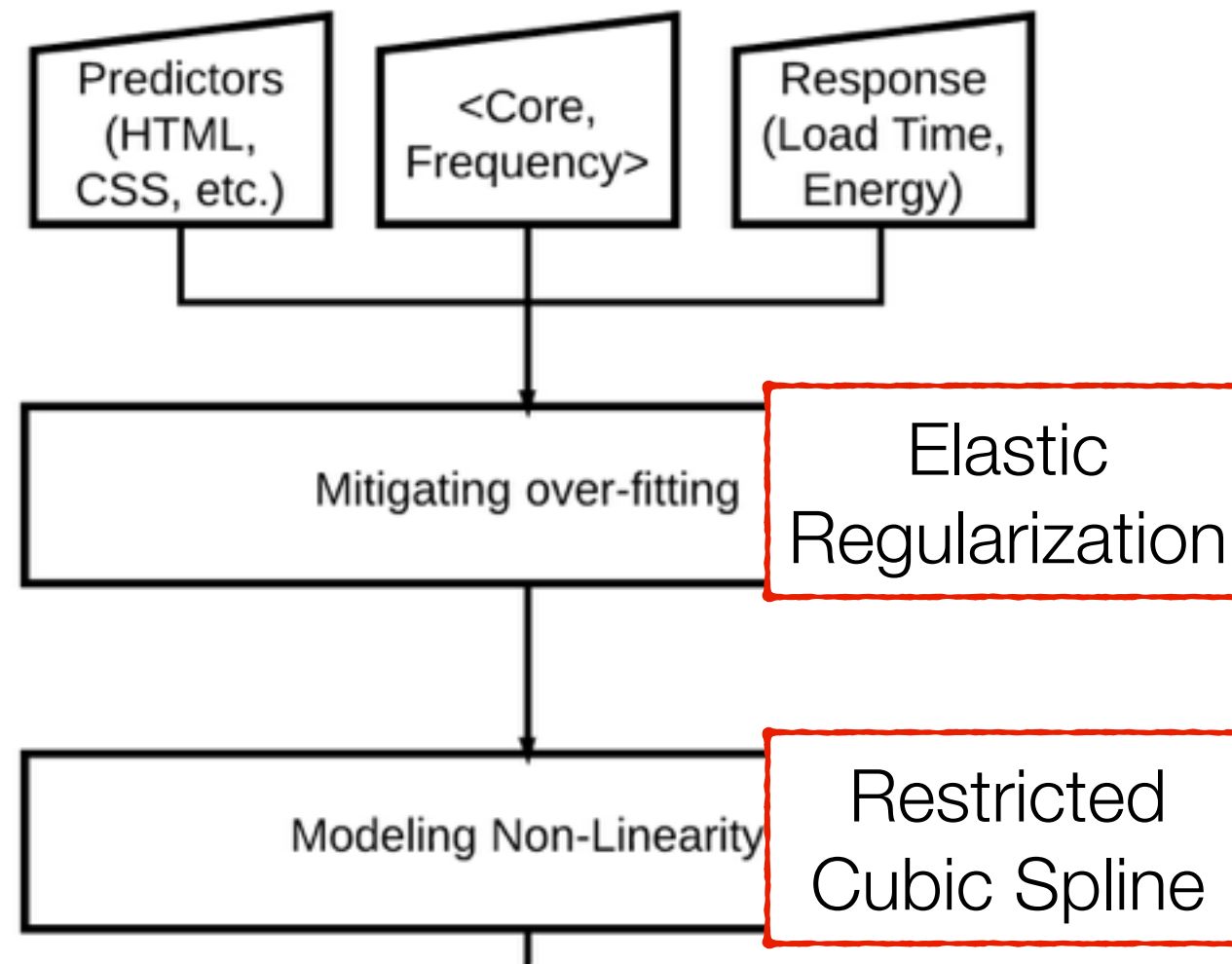
## Identify Predictors

Training using hottest 2,500 webpages



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# Capturing Webpage-Level Diversity

## Identify Predictors

Training using hottest 2,500 webpages



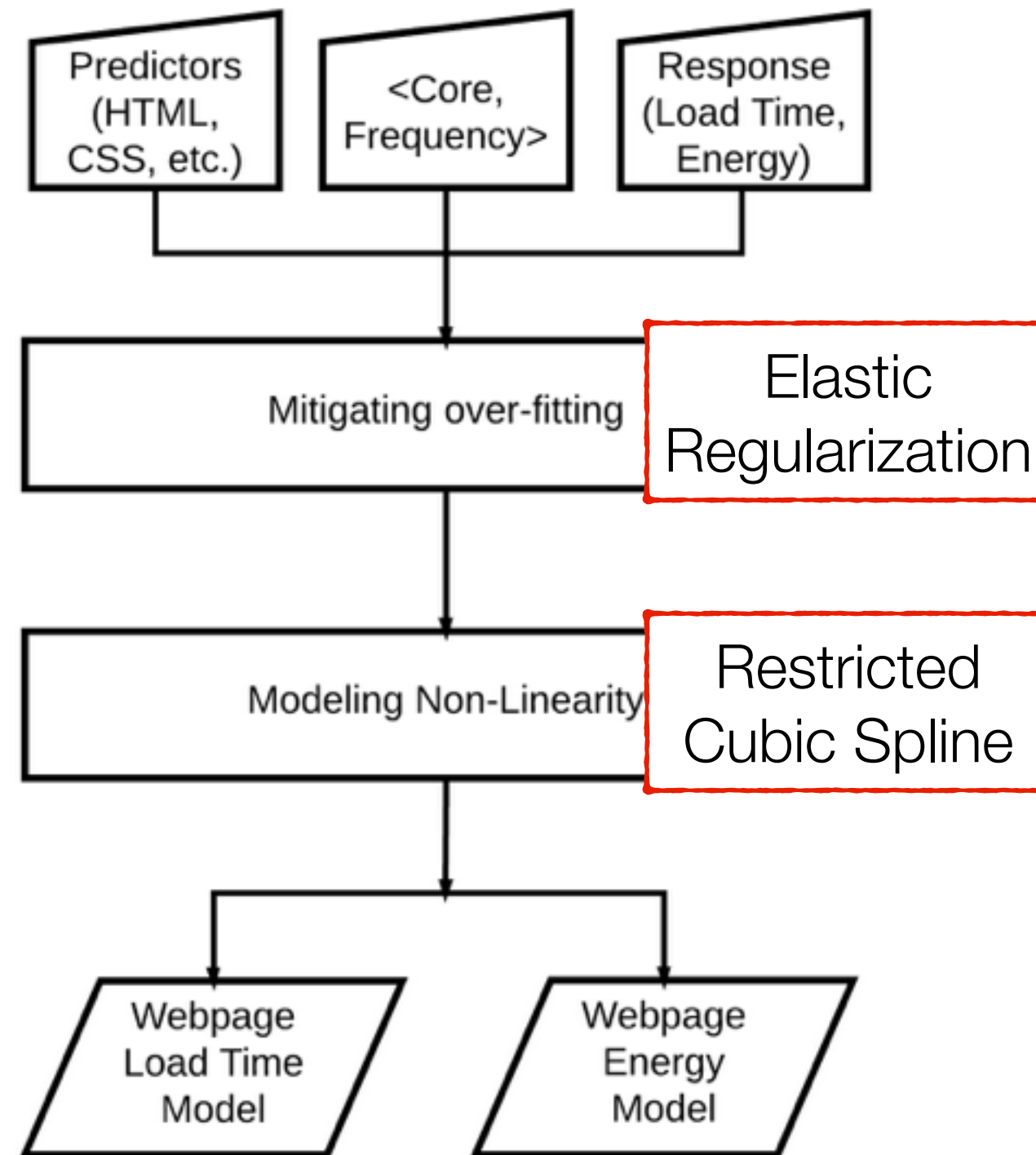
## Model Construction and Refinement

Start from the linear model and progressively refine it



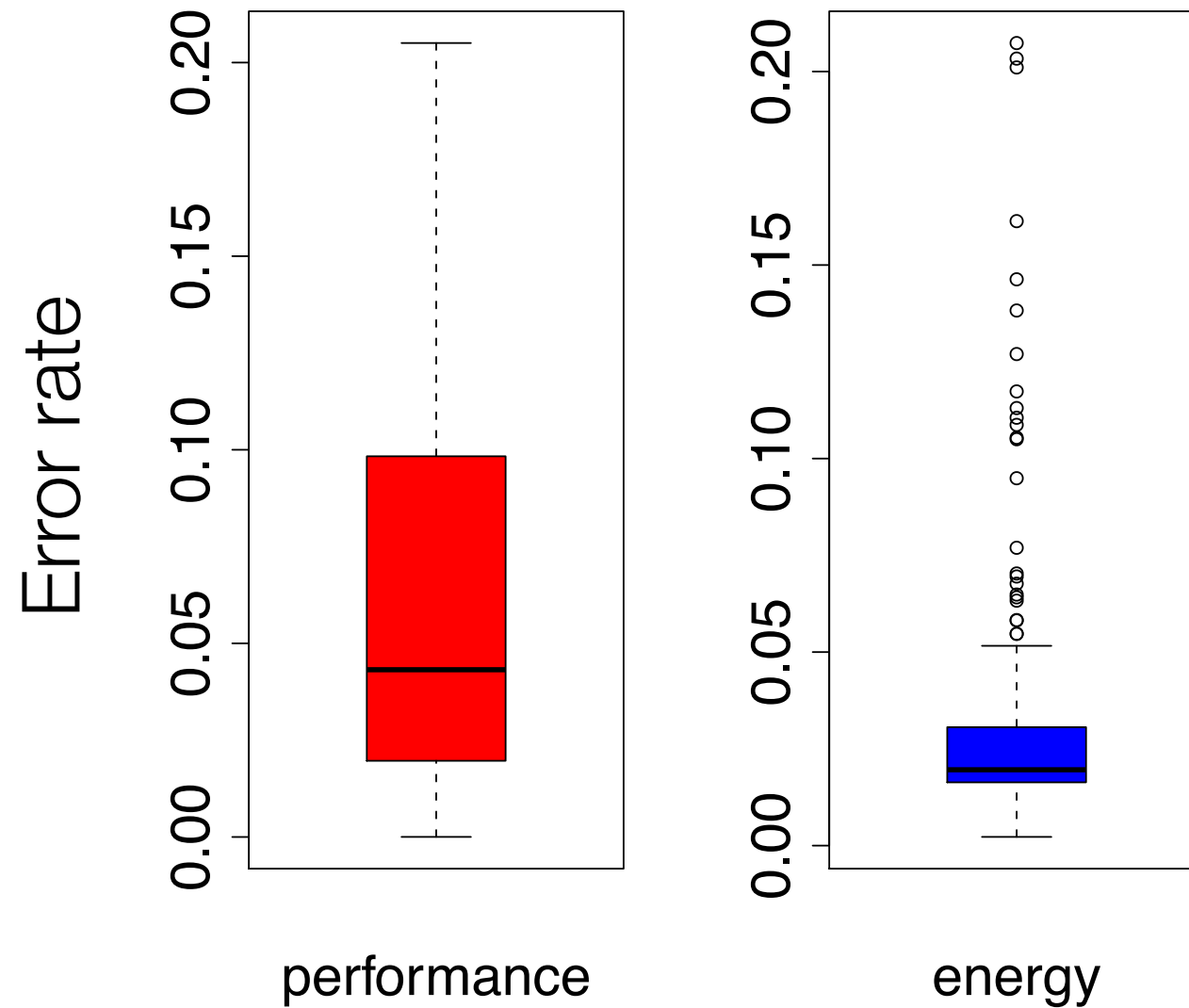
## Model Validation

Validating on another 2,500 webpages



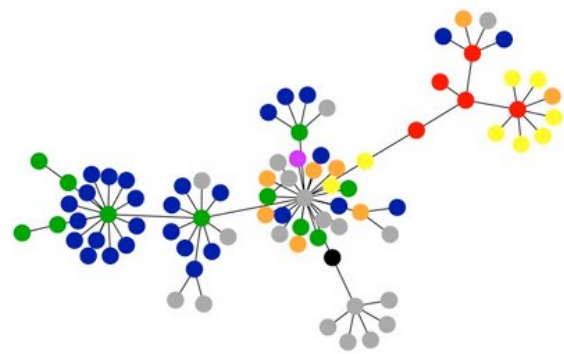
# Model Accuracy

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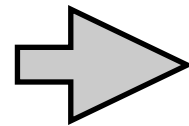


Median prediction error is less than 5%  
for the performance and energy model

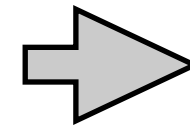




Webpage  
Characterization



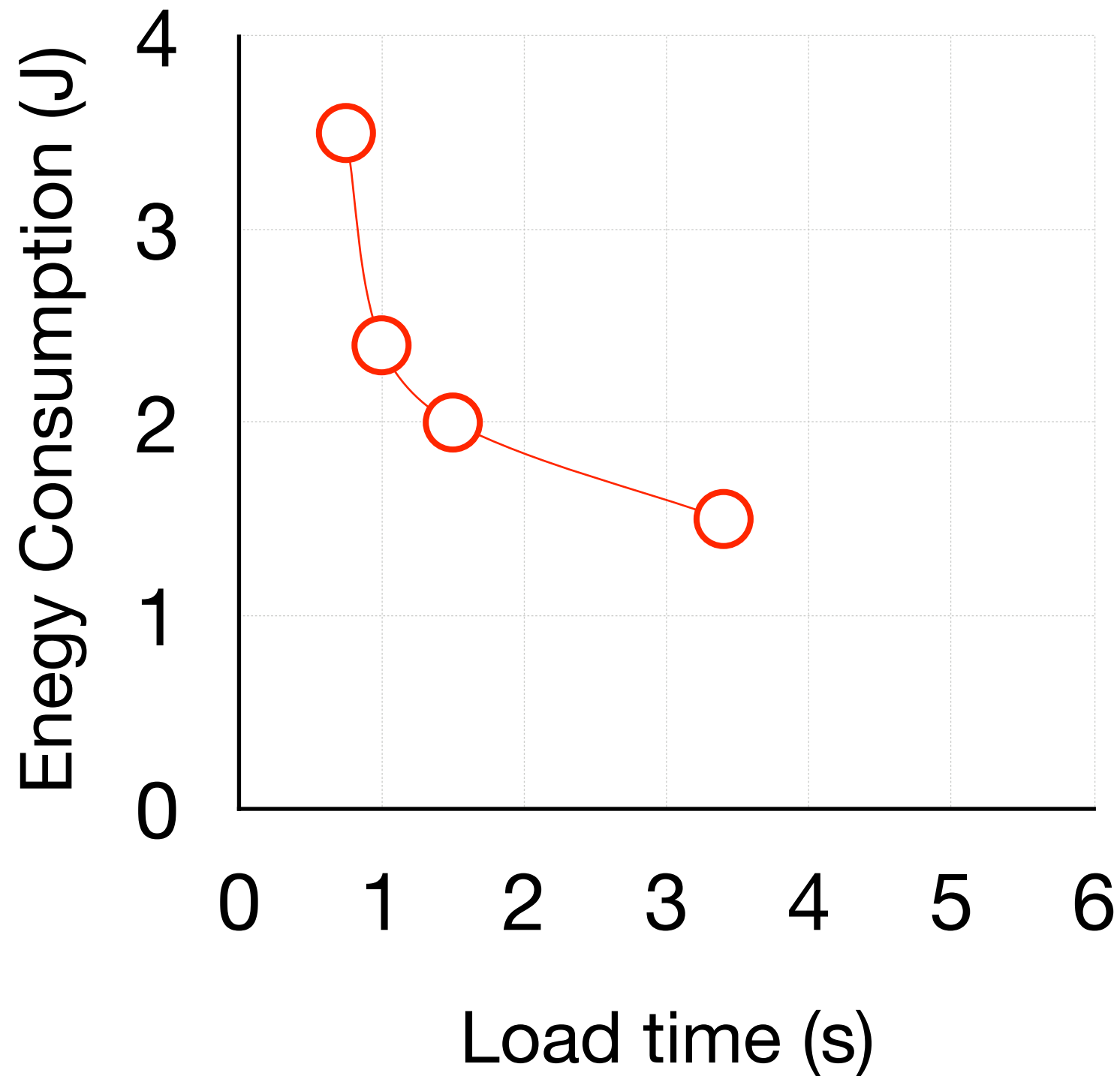
Performance/Energy  
Prediction



Processor  
Architecture

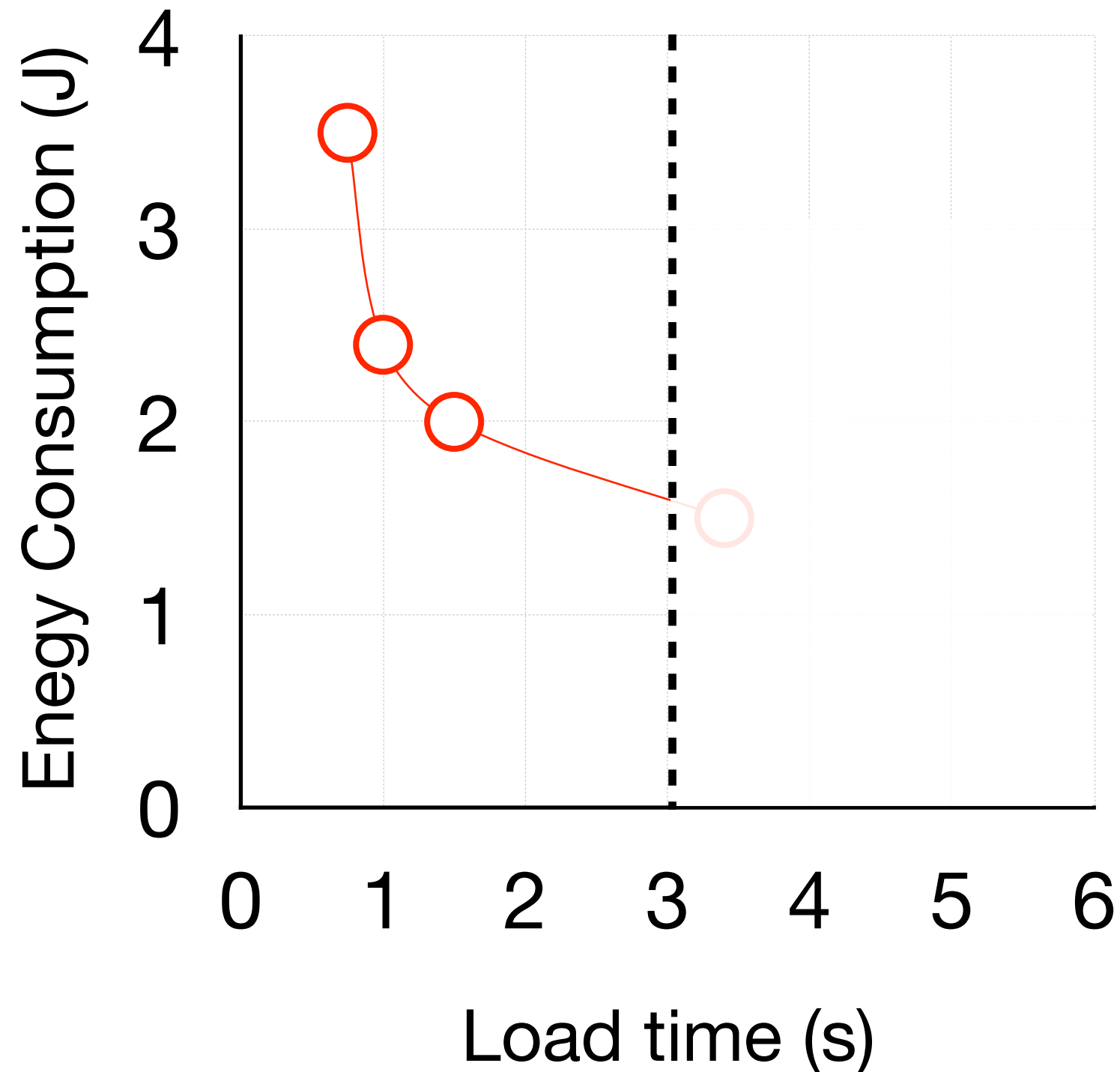
# Energy-Efficiency Optimizations

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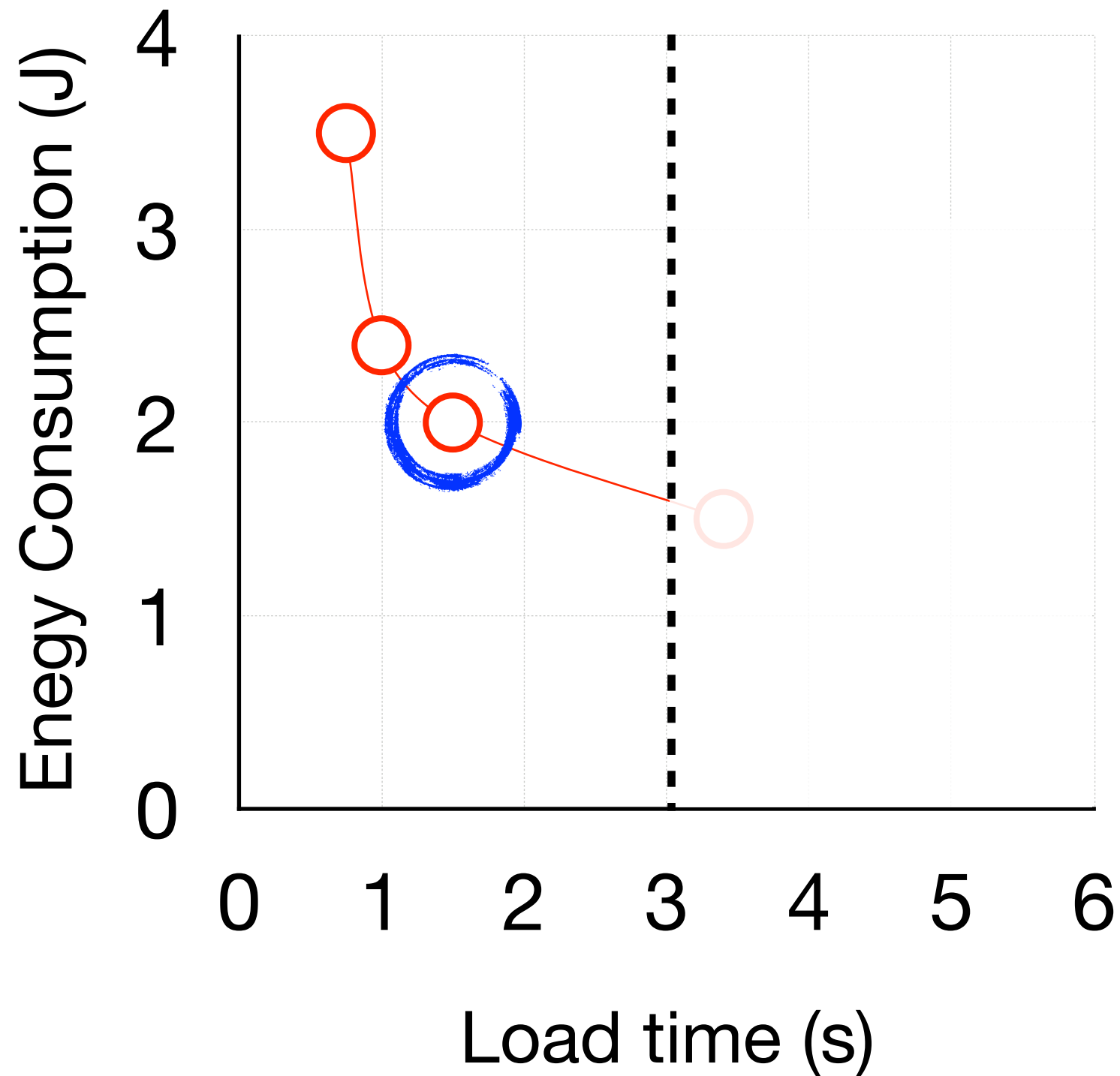
# Energy-Efficiency Optimizations

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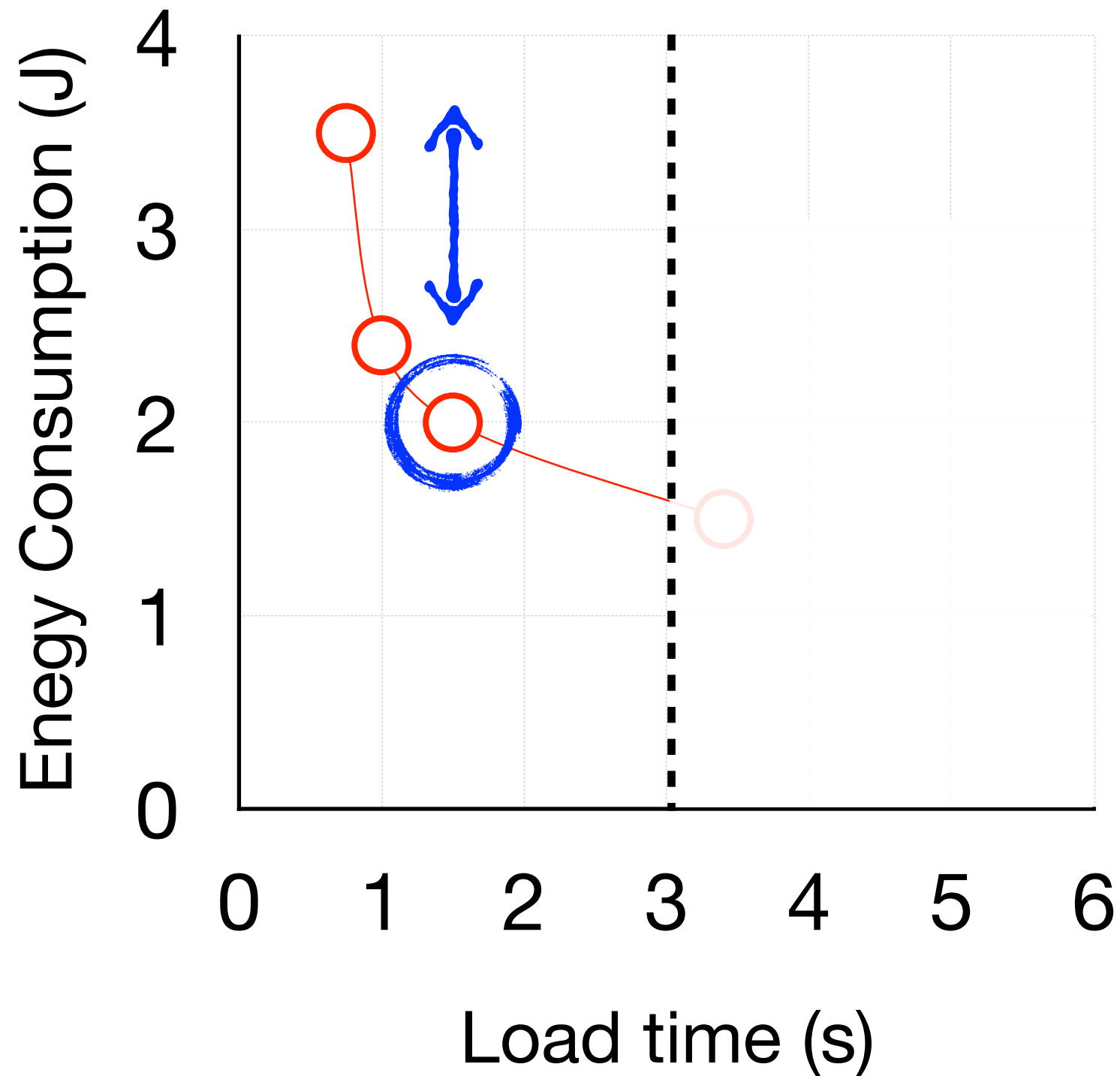
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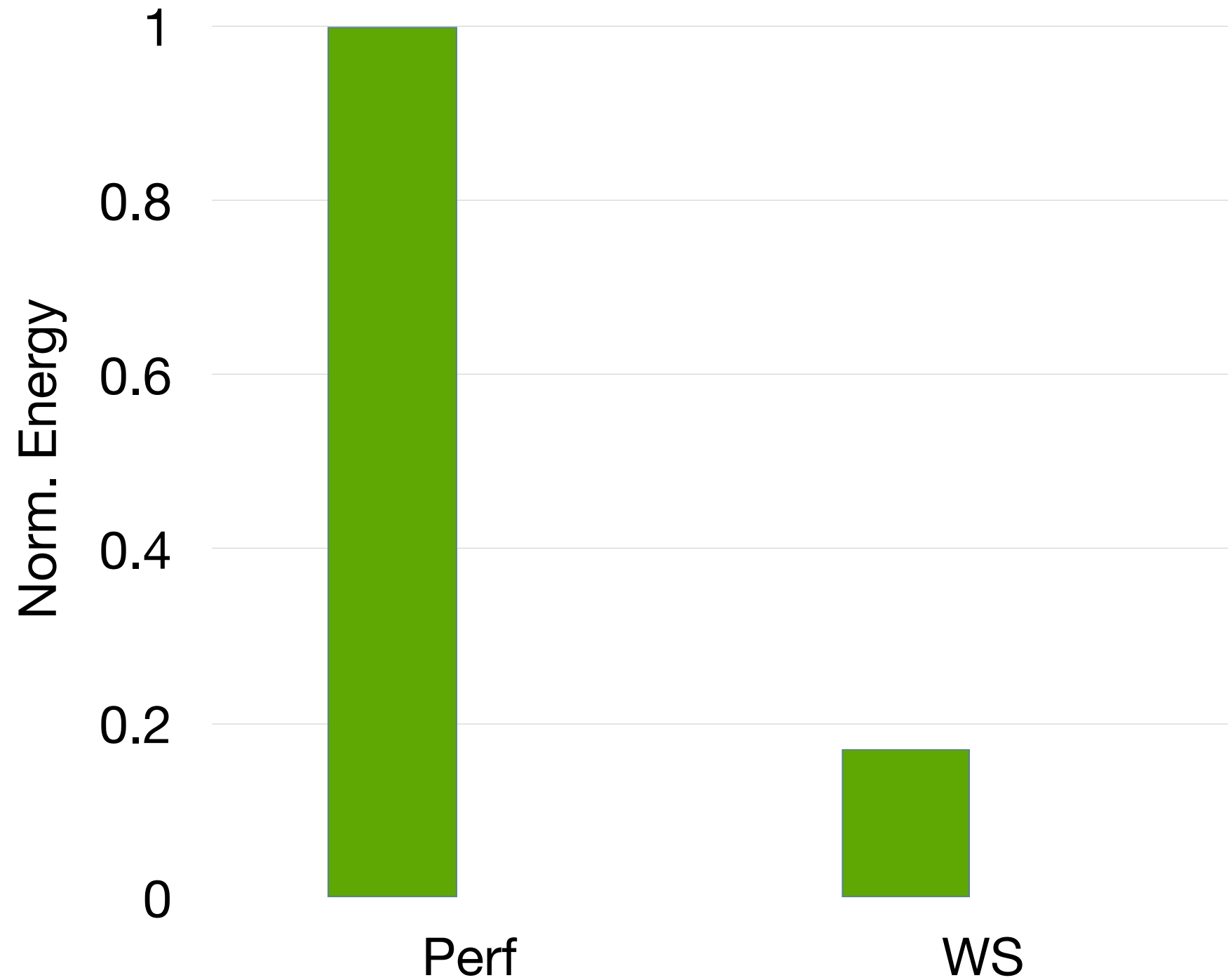
# Energy-Efficiency Optimizations

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# Scheduling Results

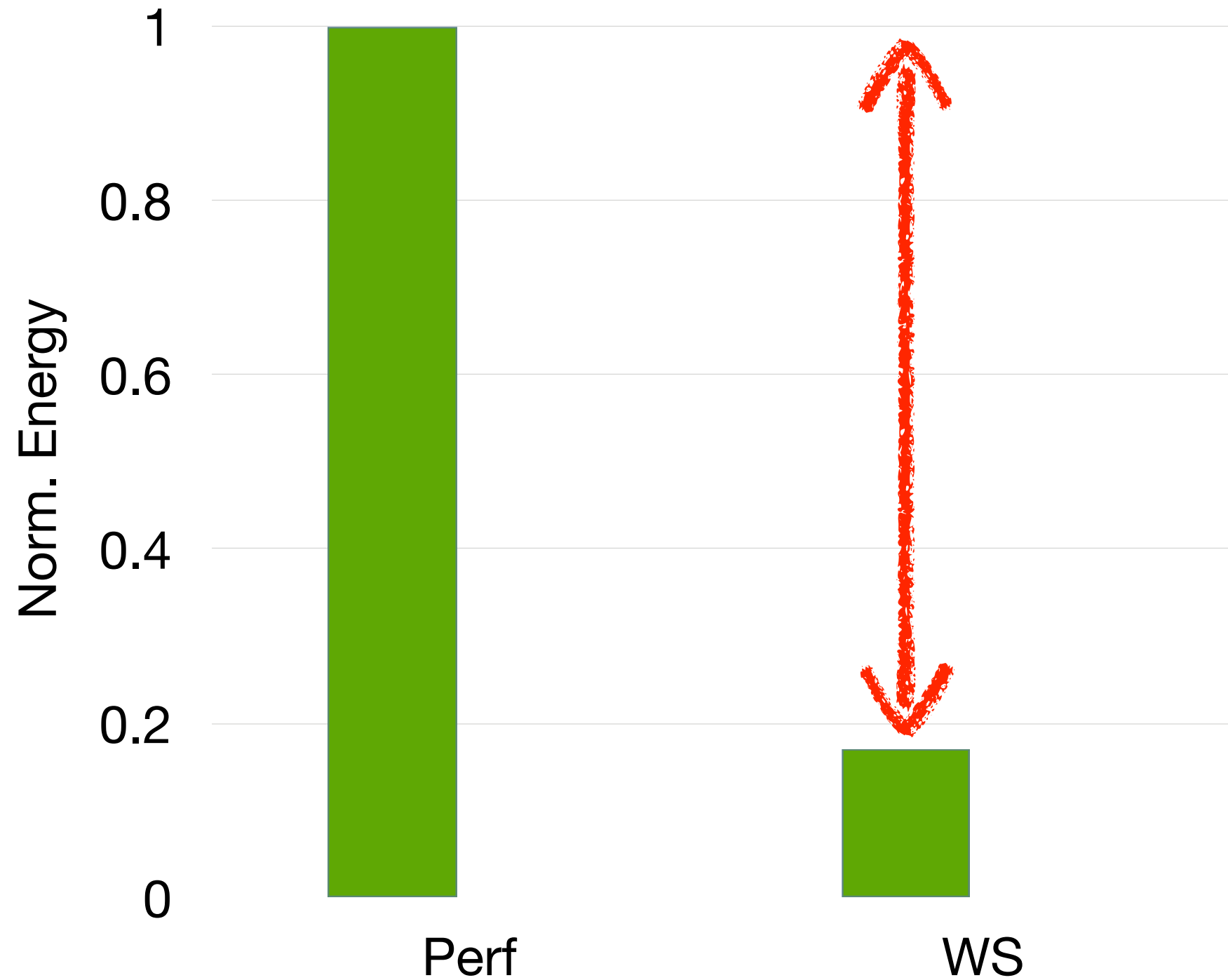
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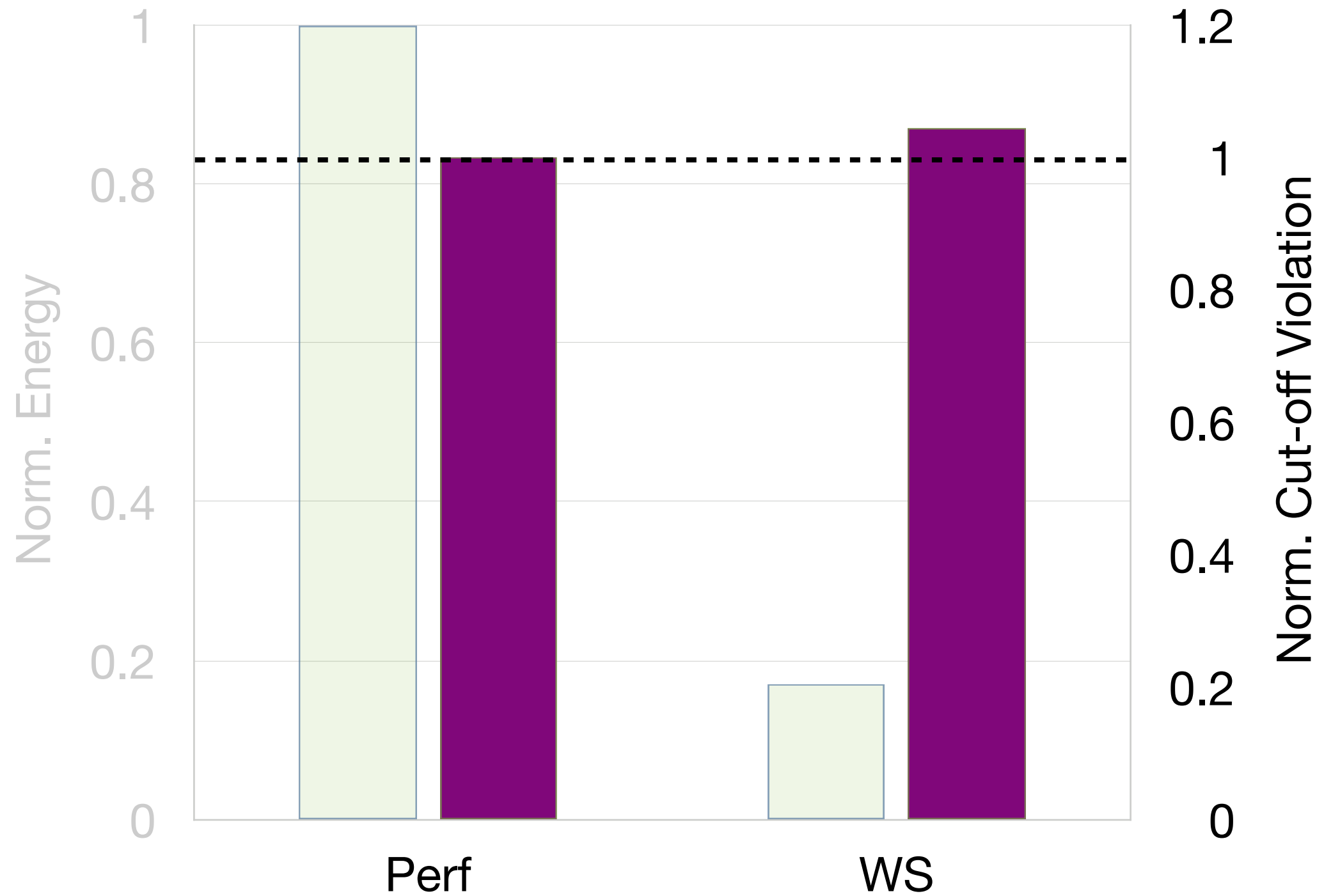
# Scheduling Results

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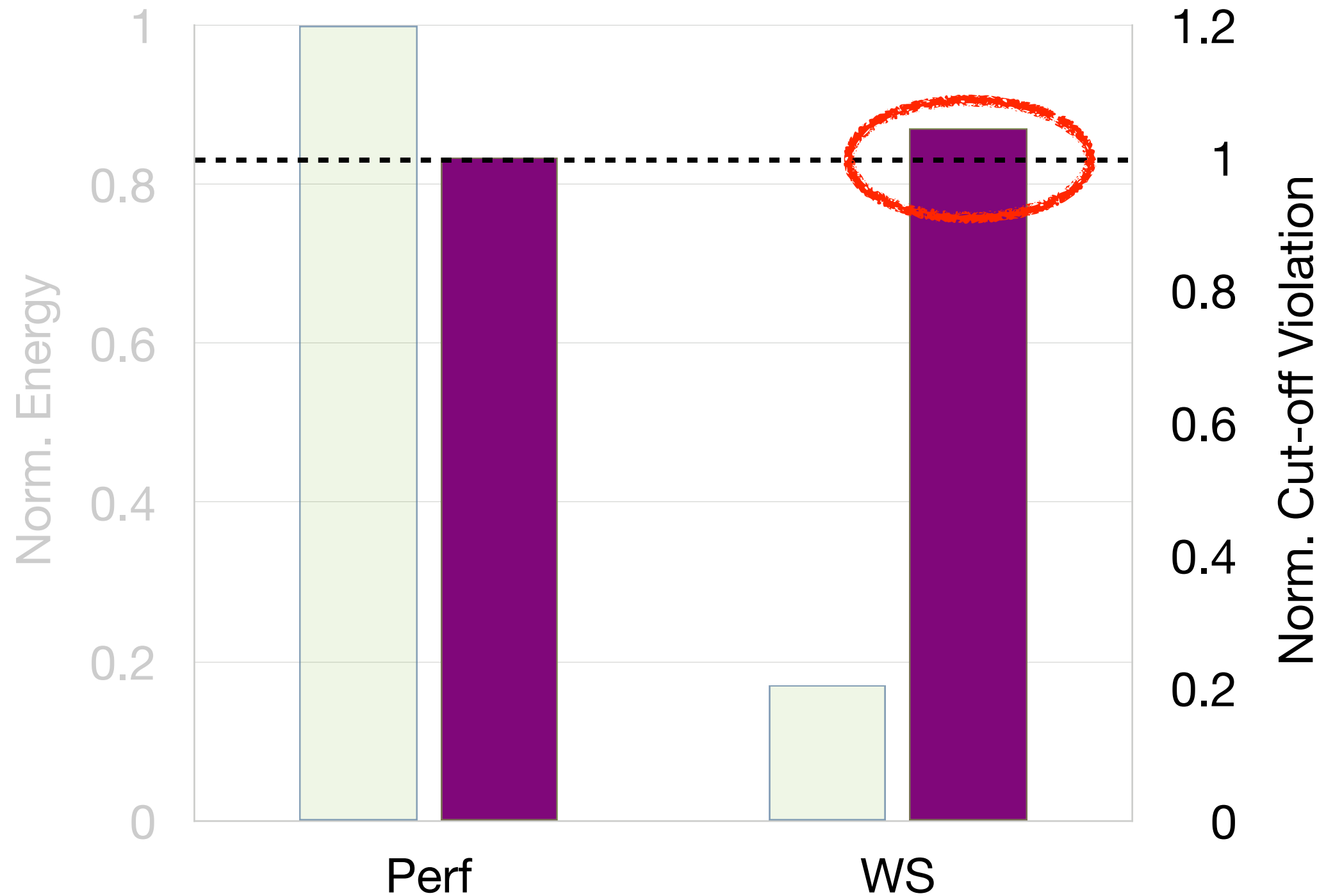


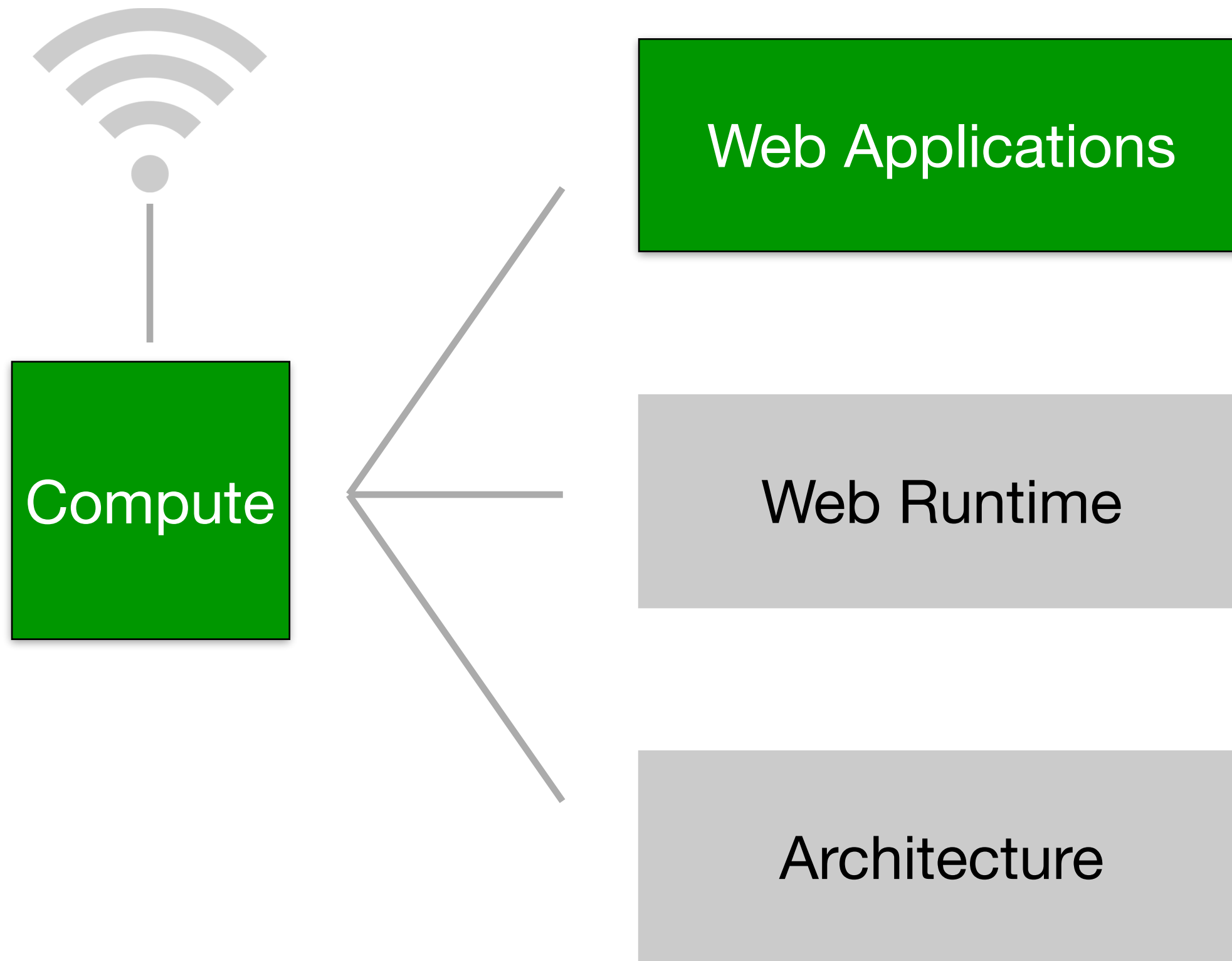
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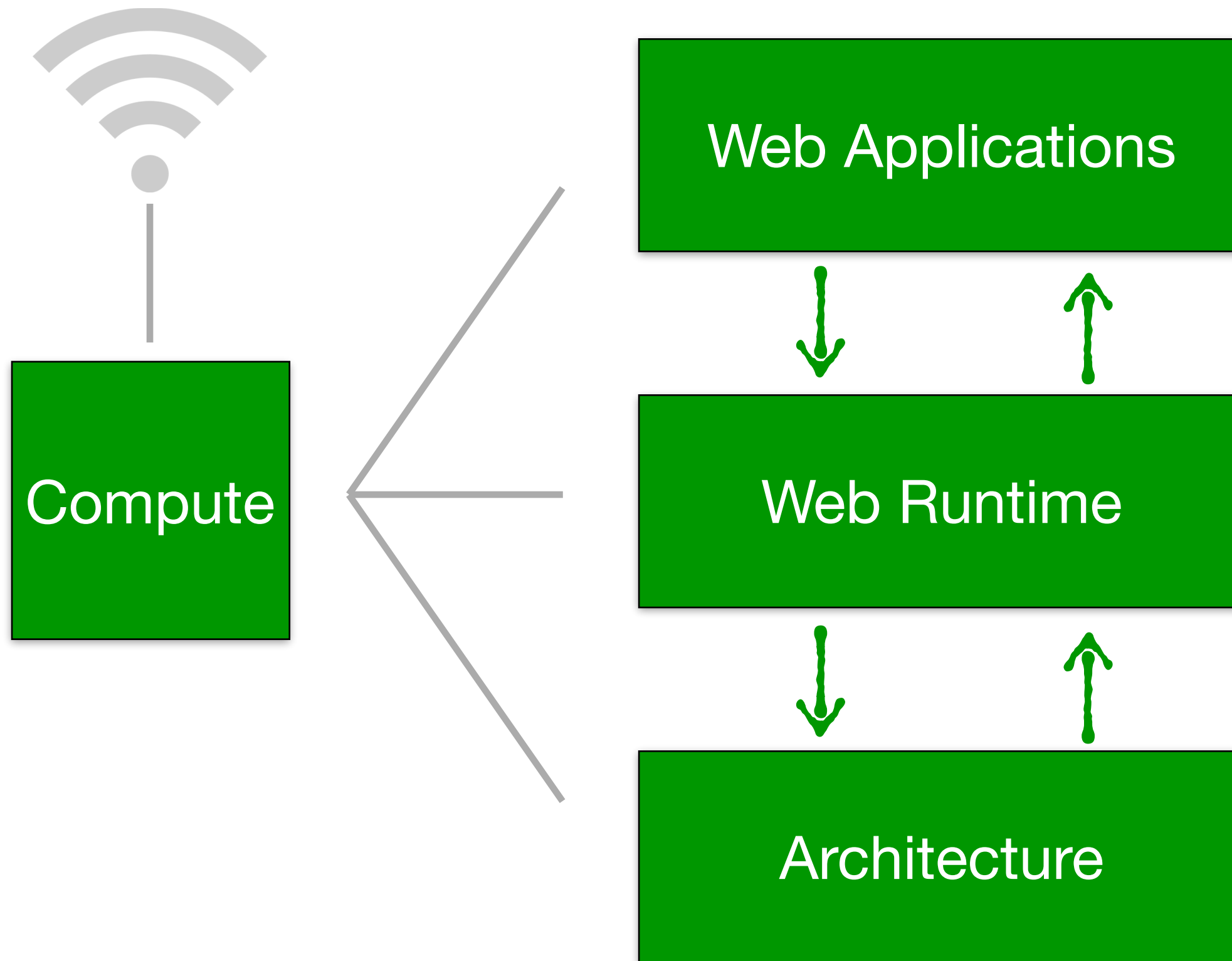
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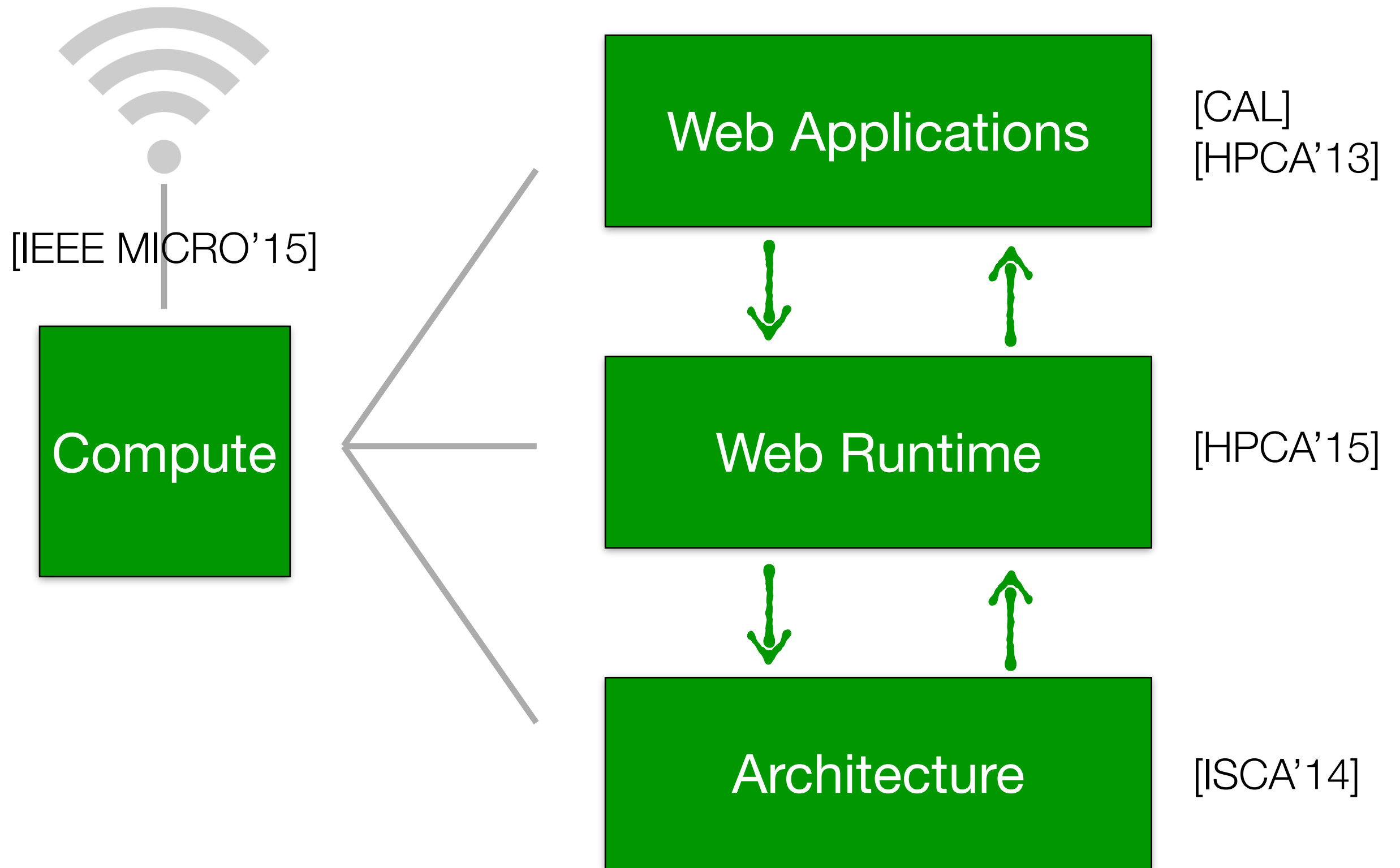


# Scheduling Results









# Web-Based Technology is Everywhere

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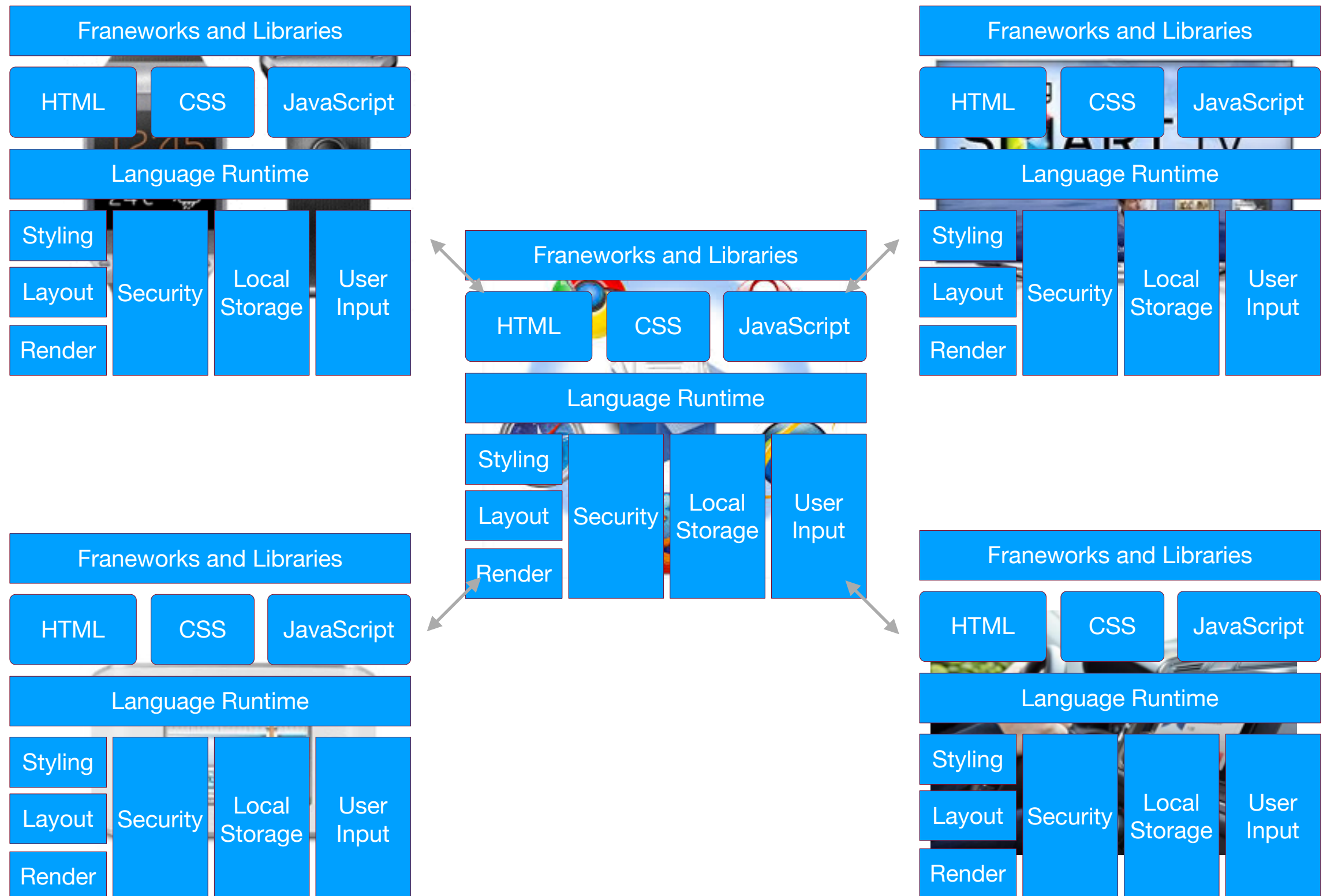


# Web-Based Technology is Everywhere





# Web-Based Technology is Everywhere



**Watt-Wise Web**