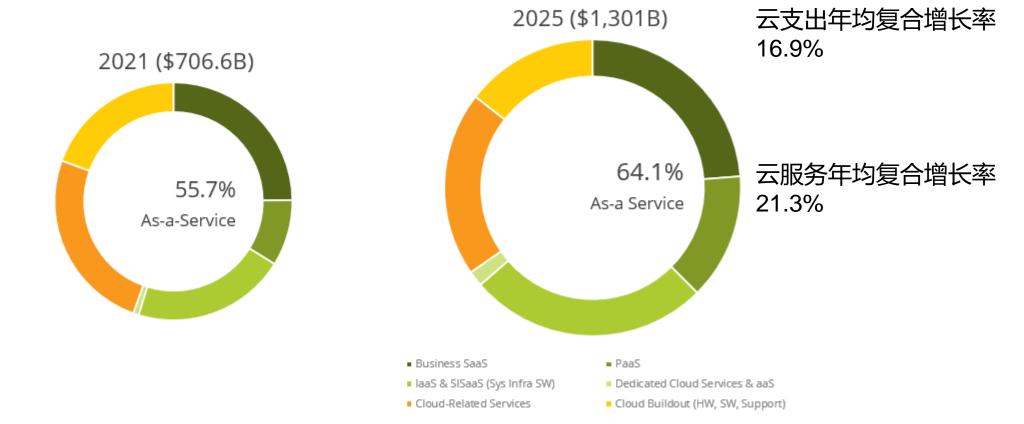
# 云数据中心的性能优化

郭健美 2022年秋

#### Worldwide Whole Cloud Outlook





Source: IDC Whole Cloud Forecast 2021-2025: The Path Ahead for Cloud in a Digital-first World, IDC #US47397521, Sept 2021





阿里巴巴张北数据中心总投资180亿元 建设规模30万台服务器 2017年阿里巴巴"双十一"的成交额1682亿元 张北阿里云基地承担了40%的业务量 支付峰值达到每秒25.6万笔

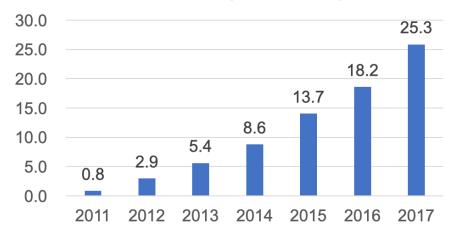




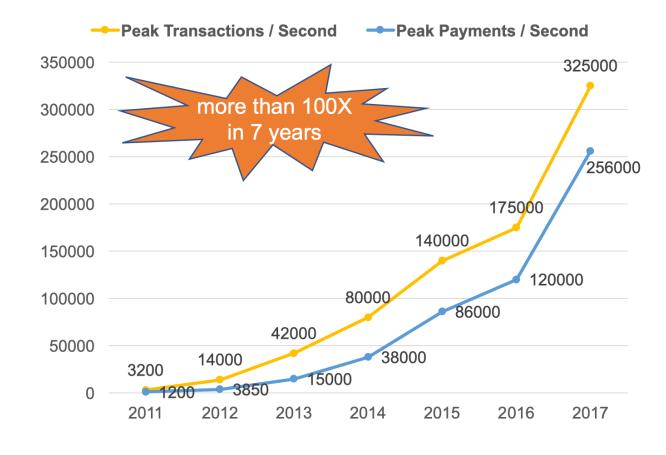


https://blog.csdn.net/weixin\_34174322/article/details/90590041 http://www.gov.cn/xinwen/2018-02/28/content\_5269382.htm

#### **Total Sales (Billion USD)**







GreenTea JUG Java Meetup, 上海 2018



### 中国数据中心耗电量超过三峡大坝发电量



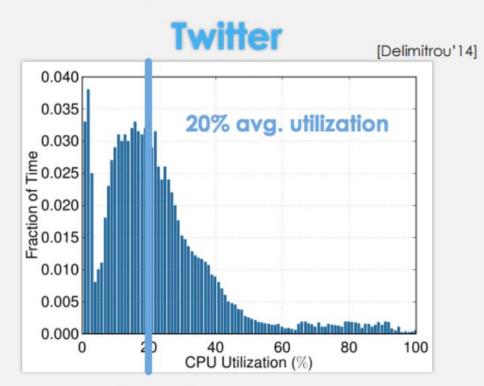
2020年中国数据中心耗电量为**2045亿干瓦时** 预计2022年将达到2700亿千瓦时,2030年达到 4000亿千瓦时

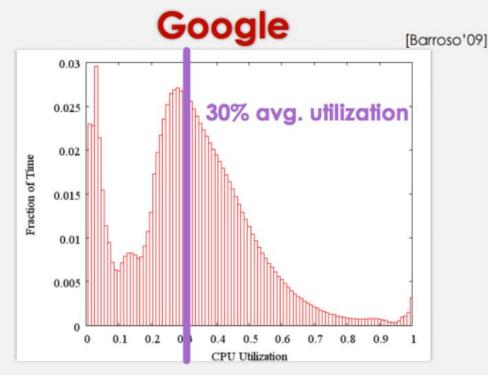


2020年三峡电站全年累计生产清洁电能1118亿千瓦时

https://www.163.com/dy/article/H8ITTKGG0512B07B.html

### But the datacenters are poorly utilized!





 Low utilization in large-scale clouds, even with automated management systems

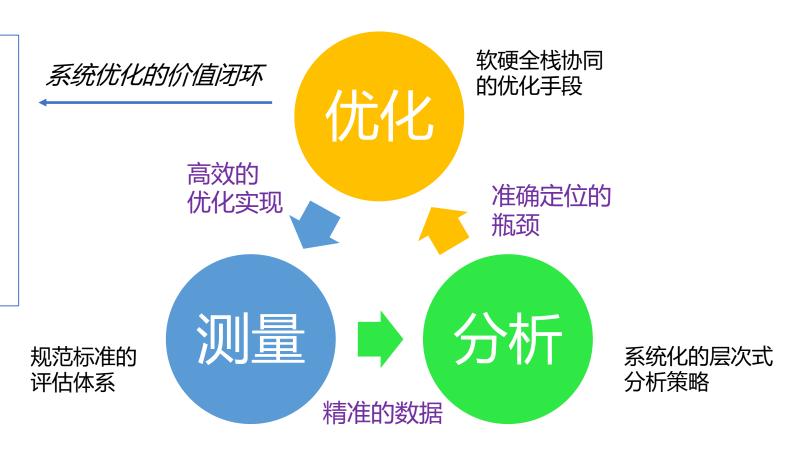
David Lo Oral Defense April 7, 2015



### "软件+硬件+数据"系统优化技术

#### 价值体现

- 性能提升
- 能耗降低
- 存储减少
- 资源利用率提升
- 运营成本降低
- 架构和系统创新



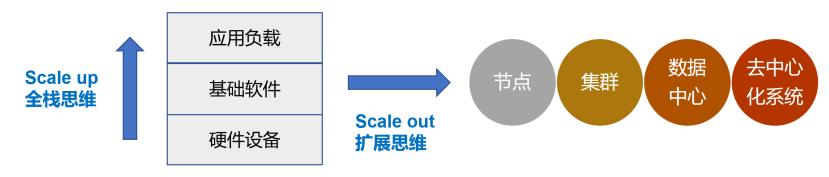
### 性能分析方法论

#### Scale up

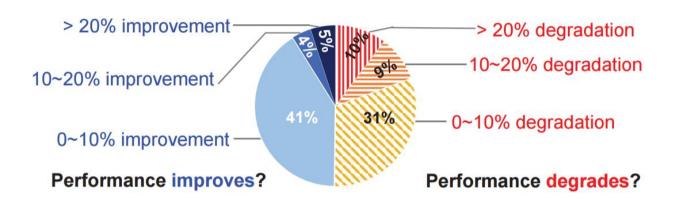
- Hennessy & Patterson, "Computer Architecture: A Quantitative Approach": CPU time's Iron Law & CPI breakdown method, 1990
- Ahmad Yasin, "A Top-Down Method for Performance Analysis and Counters Architecture": TMAM, ISPASS 2014
- Brendan Gregg, "Systems Performance: Enterprise and the Cloud": **USE method**, 2013

#### Scale out

- Google: "Google-Wide Profiling (GWP), a continuous profiling infrastructure for data centers", IEEE Micro, 2010
- Google: "WSMeter: A Performance Evaluation Methodology for Google's Production Warehouse-Scale Computers", ASPLOS 2018
- 数据中心混部系统的性能分析,CCF全国高性能计算学术年会HPC性能建模论坛,2021

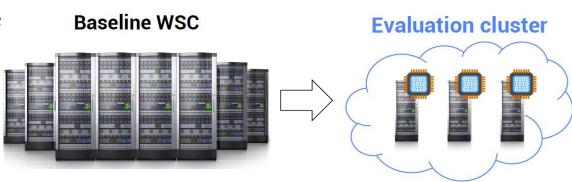


### Google WSMeter



$$WSMeter = \sum_{i} Weight_{i} \times IPC_{i}$$

**Figure 1.** Performance impact of a new DVFS policy on 1000+ production jobs. The pies represent the portion of the jobs falling into the category.

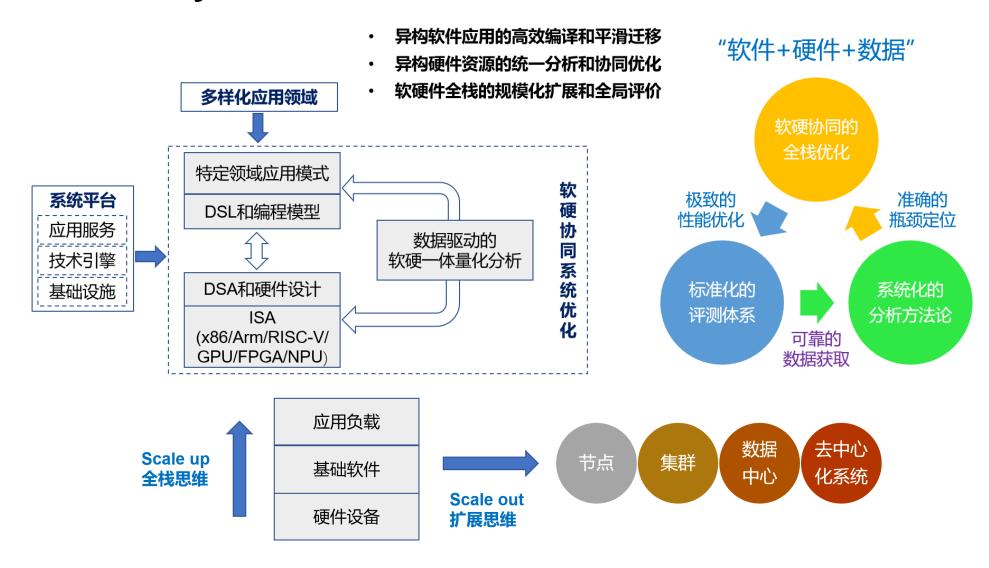


[Jaewon Lee, Changkyu Kim, Kun Lin, Liqun Cheng, Rama Govindaraju, Jangwoo Kim: **WSMeter: A Performance Evaluation Methodology for Google's Production Warehouse-Scale Computers**. *ASPLOS* 2018: 549-563]

### **Talks**

- From SPEC Benchmarking to Online Performance Evaluation in Data Centers, LTB@ICPE 2022 Keynote <a href="https://www.youtube.com/watch?v=dOnpJUZ4mrs&t=295s">https://www.youtube.com/watch?v=dOnpJUZ4mrs&t=295s</a>
- 数据中心混部系统的性能分析,2021 CCF全国高性能计算学术 年会HPC性能建模论坛特邀报告
- SPEED: 大规模数据中心的性能分析平台. 2019 年杭州云栖大会阿里云系统软件开发者专场报告 https://yungi.youku.com/2019/hangzhou/review

## Summary: 数据驱动的系统优化



## Scale up: 软硬件系统全栈

负载特征分析 基准评测和性能评价 应用/服务(教育、金融、人工智能、数据服务等) 应用/服务性能优化 各类应用/服务框架 分布式软件框架优化 程 动态编译/优化 汇编器 序 各类语言虚拟机 / 解释器 各类系统基本库 高性能函数库 开 发 | 异构API 虚拟机管理器 (VMM) 工具链 混部资源管理和调度 程序剖析工具 ■异常检修和瓶颈定位 操作系统(OS) 代码自动生成 干扰建模和资源隔离 **BIOS / Firmware** 数据布局(计算、存储、 多样化算力异构硬件 (系统/芯片互联) (x86, Arm, RISC-V, GPU, FPGA, NPU) 计算系统仿真 性能监控单元 (PMU)

网络)

### Scale out: 云数据中心全域



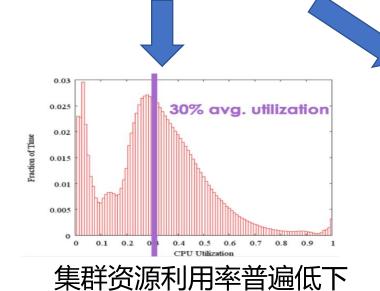


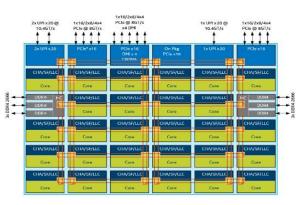
缺少全局性能评价方法

大规模异构云数据中心









众核服务器上混部应用竞争加剧

宕机和服务中断事件频发

SOLE

系统优化实验室 华东师范大学

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