



9 Workload Management



Are database systems just another application running in the virtualized environment?

No! *Virtualization poses several interesting research questions for database systems*

- Understanding the performance of database systems on virtual machines
- Configuring and tuning virtual machines running and tuning virtual machines running database systems
- Taking advantage of virtualization capabilities in the database system

Overhead

- TPC-H / PostgreSQL
 - Direct machine
 - Xen virtual machine
- Overhead of virtualization is not unacceptably high
- Can be made lower with better virtualization support

	Base Runtime (secs)	Xen Runtime (secs)	Abs SlwDwn (secs)	Rel SlwDwn (%)
Q1	14.19	15.30	1.11	7.82
Q3	5.20	6.98	1.78	34.35
Q5	4.53	5.99	1.46	32.21
Q7	4.09	5.32	1.23	30.14
Q9	10.99	12.81	1.81	16.49
Q10	5.04	6.36	1.32	26.17
Q13	14.02	15.27	1.25	8.93
Q18	9.38	11.54	2.17	23.12
Q19	5.26	6.33	1.07	20.41
Q21	2.79	3.65	0.86	31.03



What level of resources to give to each DBMS?

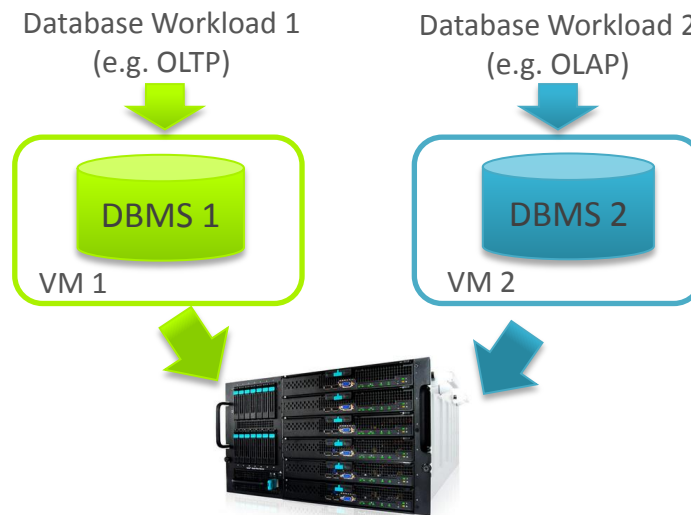
- Configuring VM parameters

How to tune the DBMS for a given level of resources?

- Configuring the DBMS parameters

*Need a **model** of how resource allocation affects database performance*

Need optimization or control algorithms to decide on the optimal resource allocation



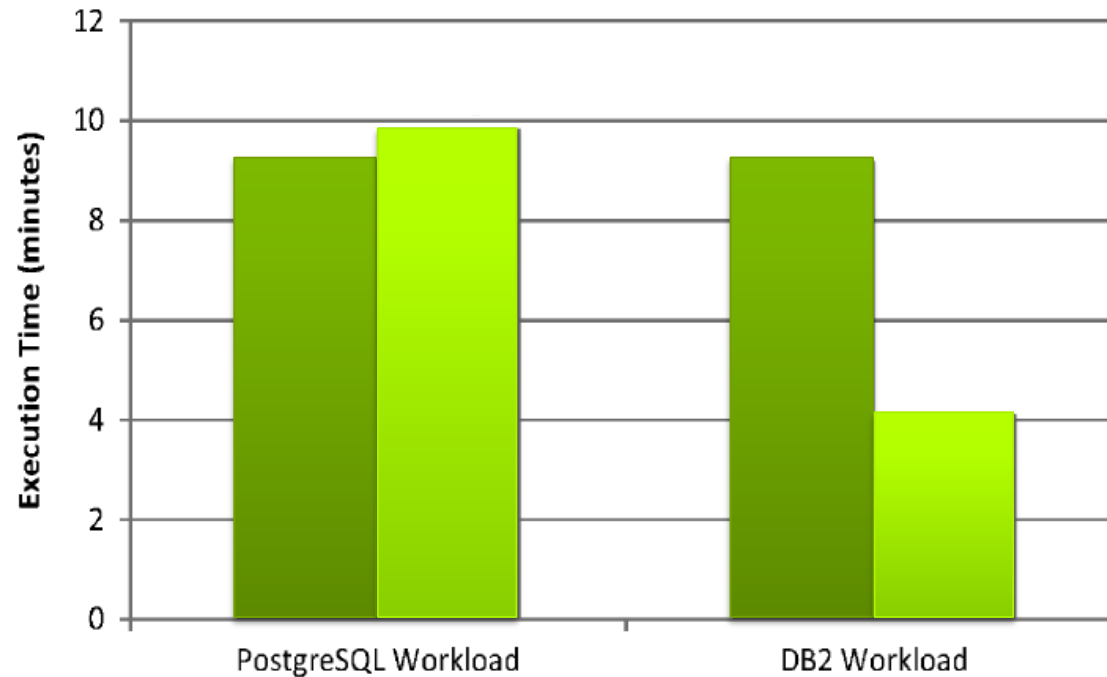


Virtual Machine 1

- PostgreSQL, 10 GB TPC-H, Query 17

Virtual Machine 2

- DB2, 10 GB TPC-H, Query 18



Configuration 1

- CPU: 50/50
- Memory: 50/50

Configuration 2

- CPU: 15/85
- Memory: 20/80



Virtualization Design Advisor



Optimize performance of database management systems by controlling the configurations of the virtual machines in which they run

- *Virtualization Design Advisor* recommends workload-specific configuration using the query optimizer's cost model (offline)
- Runtime information is collected for online refinement and to address changing workloads



Problem Statement

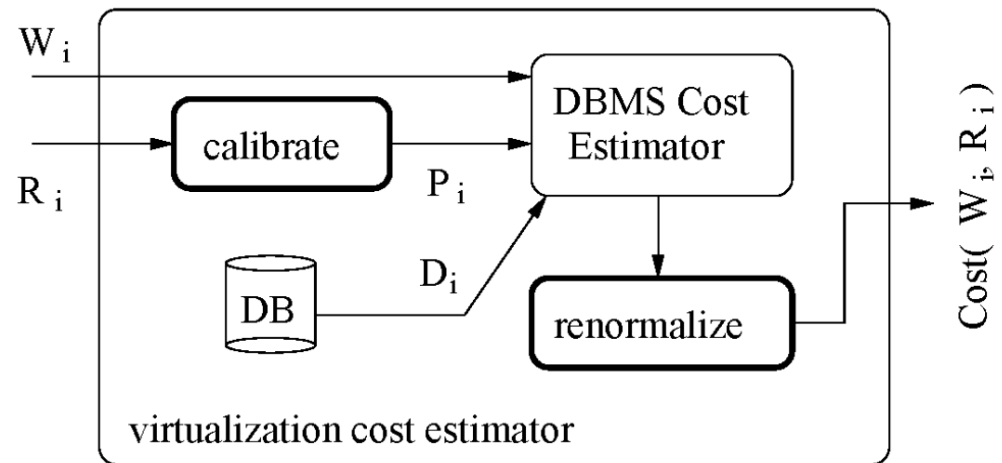
- W_i : set of workloads processed by i-th VM
- R_i : resource shares (here CPU + memory)
- P_i : query optimizer parameters
- D_i : database instance
- Optimization criteria: minimize

$$\sum_{i=1}^N Cost(W_i, R_i)$$

- Constrained by degradation limit

$$Degradation(W_i, R_i) = \frac{Cost(W_i, R_i)}{Cost(W_i, [1, \dots, 1])}$$

$$Degradation(W_i, R_i) \leq L_i$$





Renormalize

- Assumption: all DBMS defines cost as total resource consumption
- Define a mapping to unified cost estimation unit of choice (e.g., seconds)
- Highly dependent on DBMS at hand

Calibrate

- Prescriptive parameters
 - Define the configuration of the DBMS itself
 - E.g. `sortheap`, `bufferpools`, ...
- Descriptive parameters
 - Characterize the execution environment
 - E.g. `cpu tuple cost`, `random page cost`, ...
 - Affect the DBMS only indirectly (through changing cost estimates)
- Find calibration function from resource allocation R_i to set of parameters P_{ik}

Both tasks need to be done once for every DBMS, e.g., by DBMS developers with deep knowledge

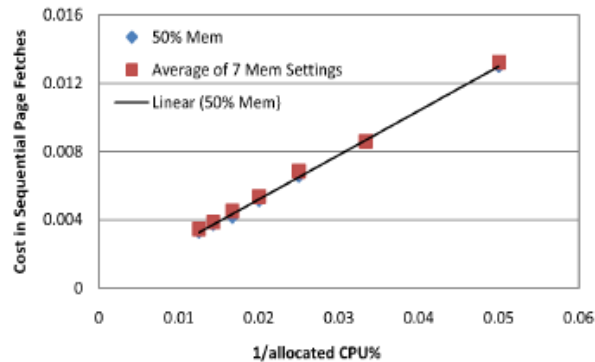


Calibration Problem

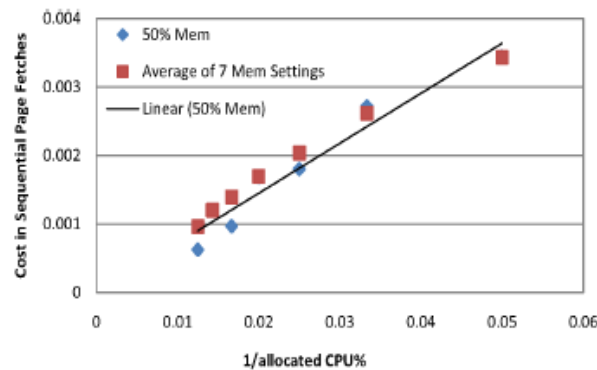
- N CPU settings
- M memory settings
- Really need to execute $N \times M$ virtual machine settings and calibrations?

Observation

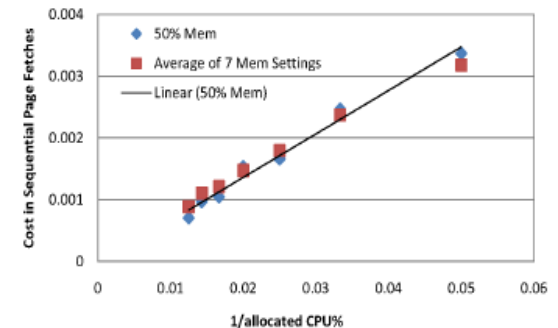
- CPU, IO, and memory optimizer parameters are independent of each other



cpu_tuple_cost



cpu_index_tuple_cost



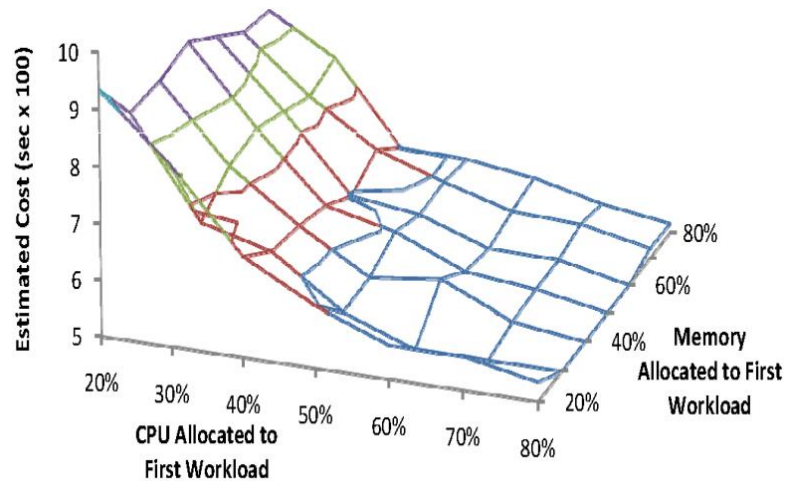
cpu_operator_cost

→ Use regression analysis to find calibration function

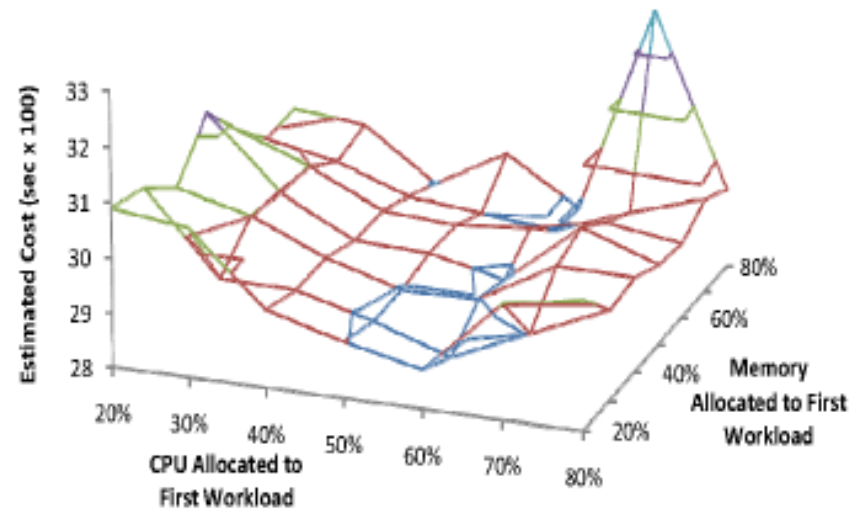


Configuration Enumerator

- Greedy algorithm starting with 1/N share assignment
- Assume “concave and smooth” objective function



Two workloads not competing for CPU



Two workloads competing for CPU

Overhead

- Calibration: 9 minutes (PostgreSQL), 6 minutes (DB2)
- Enumeration: 1 minute (about 8 iterations)

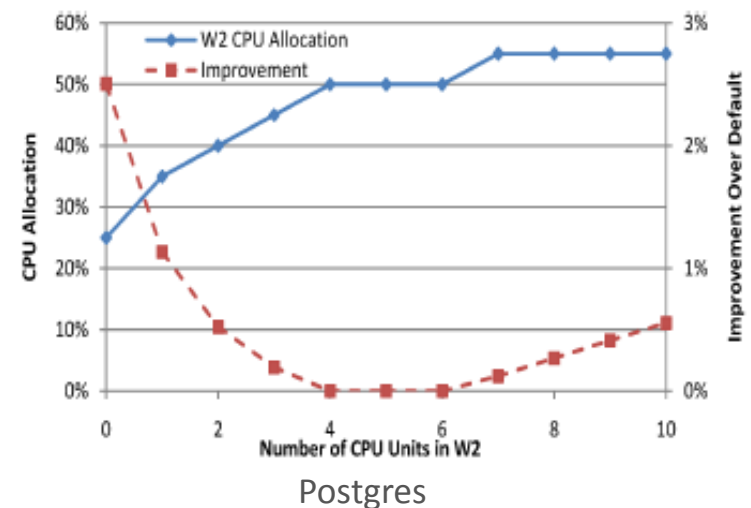
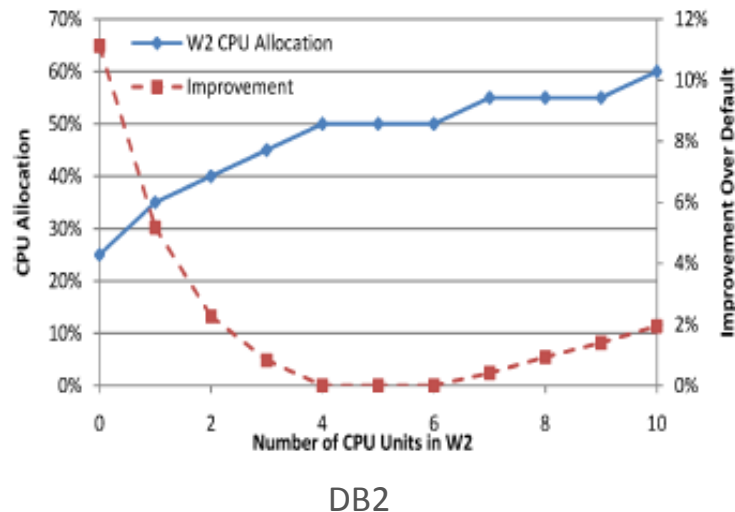


Workload Definition based on TPC-H

- Q_{18} is one of the most CPU intensive queries
- Q_{21} is one of the least CPU intensive queries (execution time much longer than Q_{18})
- Workload units
 - CPU intensive workload unit = C: $25 \times Q_{18}$
 - CPU non-intensive workload unit = I: $1 \times Q_{21}$

Experiment: Sensitivity to workload resource needs

- $W_1 = 5 \cdot C + 5 \cdot I$
- $W_2 = k \cdot C + (10-k) \cdot I$ (increase of $k \rightarrow$ more CPU intensive)

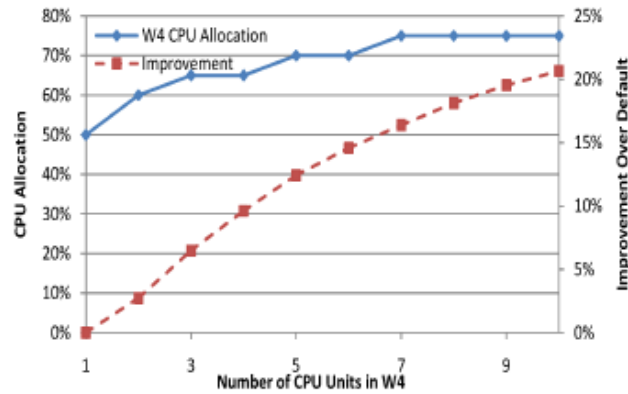


> Experiments (2)

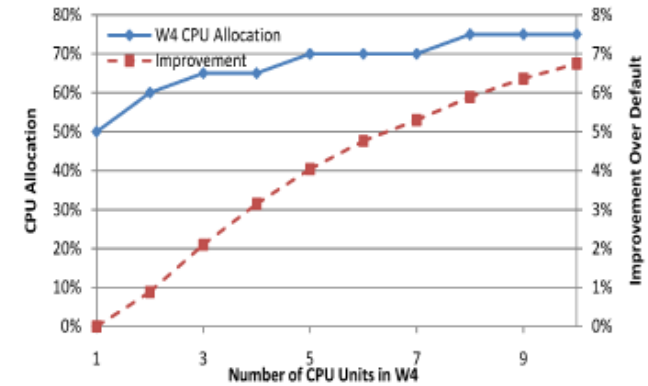


Workload Settings

- $W_3 = 1 \cdot C$
- $W_4 = k \cdot C$



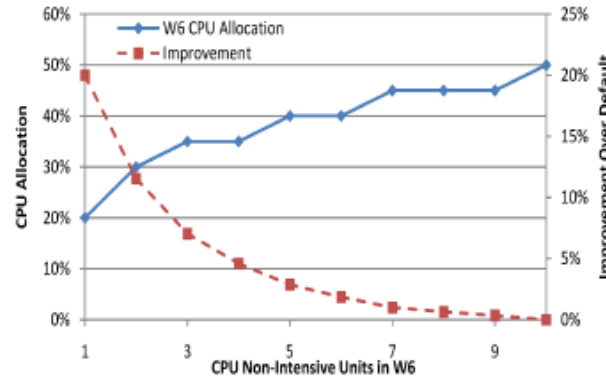
DB2



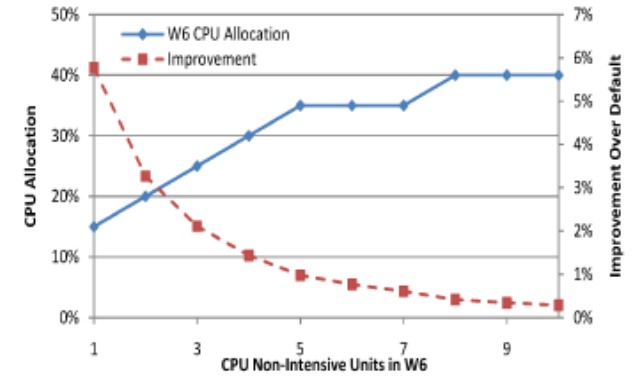
PostgreSQL

Workload Settings

- $W_5 = 1 \cdot C$
- $W_6 = k \cdot I$



DB2



PostgreSQL