#### ADAPTATIVE INDEXES

### Incrementally built self tuning access methods

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#### **SUMARY**

Adaptive Indexing

New Problems

Adaptive vs Offline

Database Cracking

Adaptive index for column stores

Adaptive merging

Adaptive index for tuple based storage

Concurrency





# ADAPTIVE INDEXING

#### FAST DATA, URGENT NEED FOR INSIGHTS

Data must be processed at least as quickly as it is produced!

Ex: LHC produced 25PB a year by 2012, needs the largest computing grid today (2017), Worldwide LHC Computing Grid with more than 170 computing centers worldwide.



Figure: The large hadron collider



#### **OPTIONS**

Fast large data analysis strategies





#### DISTRIBUTED COMPUTING FRAMEWORKS



Figure: Apache Hadoop



#### **VOLUNTEER COMPUTING**



Figure: SETI @ Home





#### LACK OF WORKLOAD KNOWLEDGE

In many modern applications e. g. big data exploration, the query pattern is not known before it is actually processed.





#### TIME FOR PHYSICAL DESIGN TUNING

Indexes and physical design in general take time to be properly tuned. No query can be answered during tuning times.



#### ADAPTIVE VS OFFLINE

#### Offline indexes

- Require a decision on what to index
- One step operation (CREATE INDEX, DROP INDEX)
- Changes in workload demand rebuild





#### ADAPTIVE VS OFFLINE

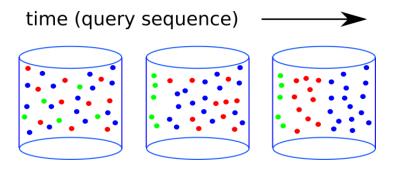
### Adaptive indexes

Index selection is made on first query
Physical design is tuned by incremental actions
Changes occur in response to current query
Changes in workload are naturally handled





#### ADAPTIVE INDEXING CHANGES PHYSICAL LAYOUT





Developed for column stores Partitions an attribute at each query In memory column copy and supporting AVL tree Zero initialization





### SELECT \* FROM t WHERE t.A < 5;







### SELECT \* FROM t WHERE t.A > 7 AND t.A <= 20;



```
algorithm CrackInTwo(Low, High, Med)
    x1 := point at position Low
    x2 := point at position High
    while position(x1) < position(x2) do</pre>
        if value(x1) < Med then
            x1 := point at next position
        else
            while value(x2) >= Med and
            position(x2) > position(x1) do
                x2 := point at previous position
            end while
            Exchange(x1, x2)
            x1 := point at next position
            x2 := point at previous position
        end if
    end while
```

Idreos et. al. 2007 - Database Craking



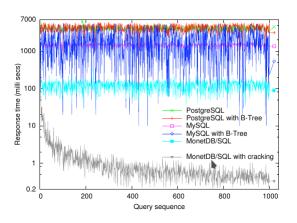
#### **RESULTS**

Response times are expected to decrease from the level of full scans (O(N)) to near the level of a binary search  $(O(\log(n)))$ 





### Database cracking - response times



Idreos et. al. 2007 - Database Cracking



#### ADDITIONAL BENEFIT

## A histogram for free 1

Column partitions contain information on the distribution of the data attribute. i. e. they tell how many records lie in the given range.

<sup>&</sup>lt;sup>1</sup>Idreos et. al. 2007 - Database Craking



#### ADDITIONAL BENEFIT

### Cracking aided joins <sup>2</sup>

The same histogram-like information can be used to exclude partitions to consider while executing joins.

<sup>&</sup>lt;sup>2</sup>Idreos et. al. 2007 - Database Craking



### Stochastic cracking

- Partition ranges are not equal to query ranges
- Adds a random component to cracking
- Eventually cracks big partitions

### Holistic indexing

- Idle CPU cores are used to perform cracks
- Select operators still perform cracks
- Holistic cracks are performed on the biggest partitions

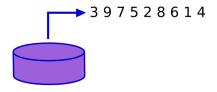


#### **BLOCK STORAGE**

Relational systems are typically stored in disk B-tree based structures are suitable for block storage Full sorting may be prohibitive (time) And demands prior index selection (workload knowledge)









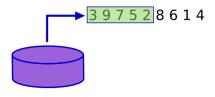


Figure: Collect run



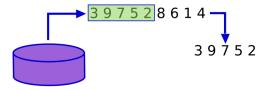


Figure: Collect run



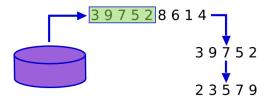
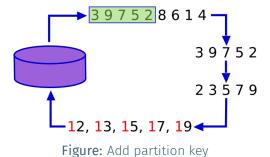


Figure: Sort run







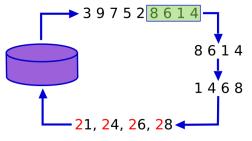


Figure: Repeat for other partitions



12, 13, 15, 17, 19, 21, 24, 26, 28

Figure: Final sorted data

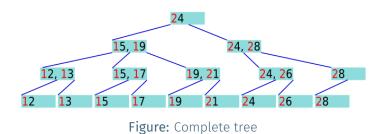


#### Structure creation

- Runs become the data in the leaf level of a B+ tree
- A bulk load procedure is used to build the tree









SELECT \* FROM t WHERE t.A > 5 AND t.A <= 7;

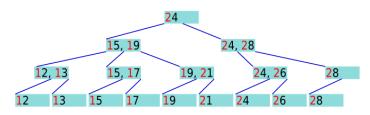


Figure: Answering a query



SELECT \* FROM t WHERE t.A > 5 AND t.A <= 7;

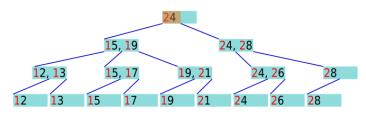


Figure: Answering a query



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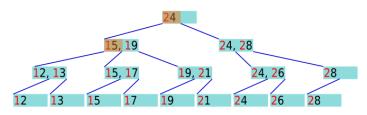


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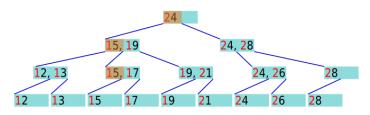


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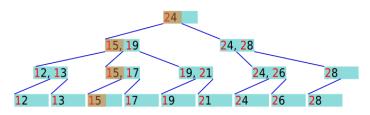


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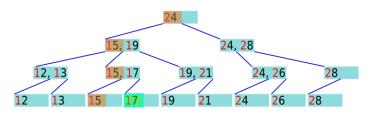


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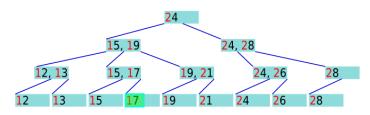


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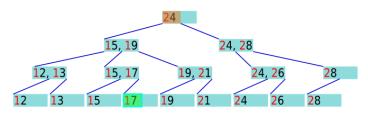


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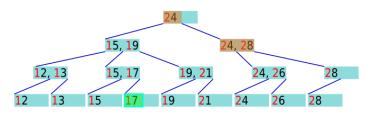


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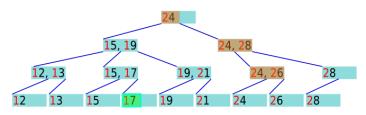


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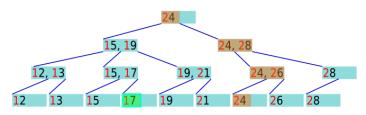


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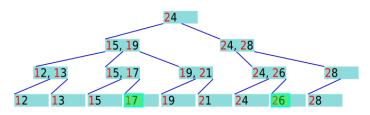


Figure: Answering a query



### **MERGE SELECTIONS**

Each query walks the tree and move the qualifying tuples to the final partition



## **MERGE SELECTIONS**

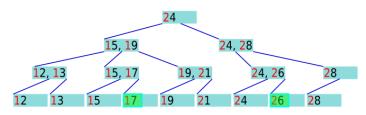


Figure: Adaptive Merging



## **MERGE SELECTIONS**

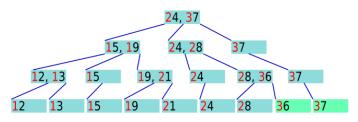


Figure: Short Query Ranges



# Adaptive Merging - overhead per query

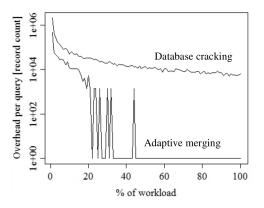


Figure: Short Query Ranges

Grafe et. al. 2010 - Self-selecting, self-tuning incrementally optimized indexes



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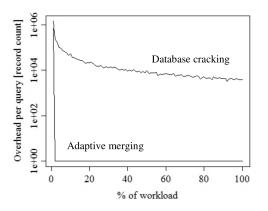


Figure: Long Query Ranges

Grafe et. al. 2010 - Self-selecting, self-tuning incrementally optimized indexes





# The problem

Updating index structures while processing queries requires concurrency control and the system may incur additional lock contention





## Index structure VS index contents <sup>3</sup>

Index logical contents do not change Index refinement is not transactional Lightweight latches instead of locks

<sup>3</sup>Graefe et. al. 2012 - Concurrency Control for Adaptive Indexing



## Locks VS Latches

SeparateLocksLatchesProtectDB ContentIn-memory dataDuringEntire TransactionsCritical sections



Incremental granularity of locking 4

Increasingly smaller key ranges affected Conflicts can be avoided

<sup>&</sup>lt;sup>4</sup>Graefe et. al. 2012 - Concurrency Control for Adaptive Indexing



#### CONCLUSION

# **Adaptive Indexing**

Incremental changes in physical layout
Structure changes based on the current workload
Concurrency issues also improves adaptively





