In-situ Visual Exploration and Analytics over Big Data*



Introduction

Scenario

A user wishes to visually interact & analyze large data files that do not fit in main memory using commodity hardware

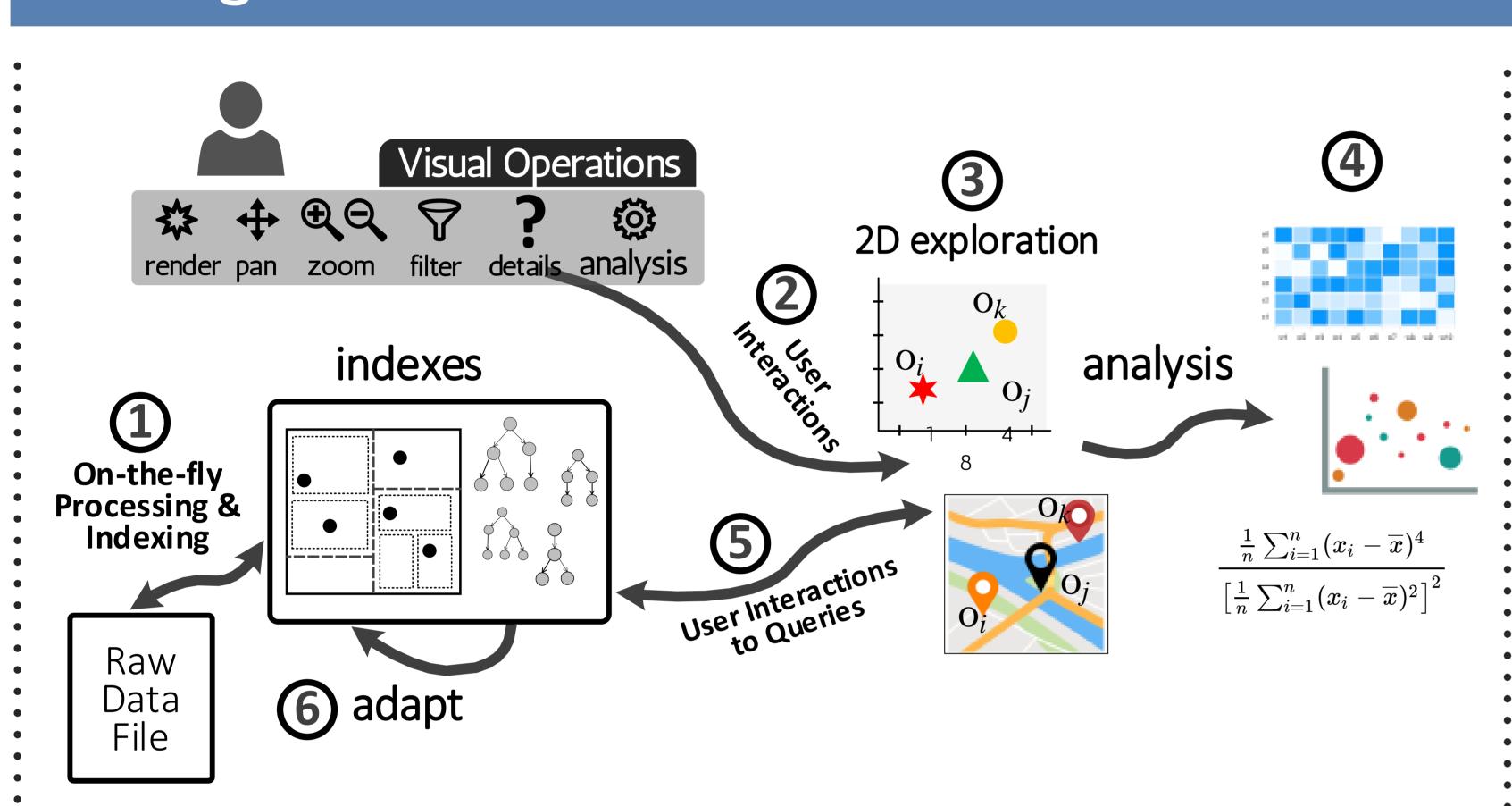
Setting

- > Big raw data in files, e.g., csv that do not fit in main memory
- > Limited hardware resources-commodity hardware, e.g., scientist's laptop

_ Main Challenges

- > Minimize Data-to-analysis time
- no preprocessing phase, e.g., DBMS loading & indexing
- > Support interactive environment: response time < 1sec
 - ♣ I/O's + computations

Working Scenario



- > Data: numeric, spatial, categorical
- > 2D Visual Exploration: map, scatter plot, etc.
- > Visual Interactions: Pan, Zoom, Filter, Details, Analyze
- > Visual Analysis: bar charts, heatmaps, scatter plots, parallel coordinates, etc.
- > Statistics: e.g., variance, Pearson correlation, covariance

RawVis System

Exploration Model

- > User interactions ⇒ Data-access operators over the index
- _ Hybrid main-memory indexing scheme
- > Combines tile & tree structures
- > Constructed on-the-fly

Adaptive techniques

- > Based on user interaction methods progressively adjust the index structure, update & enrich index metadata
- > Adaptive-based query processing
- _ Resource-aware index initialization

_ Efficient & Scalable

- > Response time: < 0.04sec (e.g., 45GB Data / 2GB RAM)
- > vs. competitors: ~ 100× faster & 2 orders of magn. fewer I/O's
- Open-source system & Online tool

More info

- > Resource-Aware Adaptive Indexing for In-situ Visual Exploration and Analytics, VLDB Journal, 2023
- > RawVis: A System for Efficient In-situ Visual Analytics, ACM SIGMOD, 2021
- > In-Situ Visual Exploration over Big Raw Data, Information Systems Journal, 2021
- > Home page: www.rawvis.net

Index Initialization

- > Index is constructed on-the-fly based on the first user interaction
- > Initially a crude index is constructed to allow fast construction
- > More fine-grained near the initial query to improve query evaluation during the initial stages of the exploration
- > Resource-aware initialization mechanism
- The initial structure (e.g., number of tiles, stored metadata) of the index is adjusted based on the available memory
- NP hard problem: efficient approximation algorithms

Hybrid Indexing Scheme

- VETI Index (Visual Exploration Tile-Tree Index)
- > Combines a multilevel tile-based index with a categorical-based tree
- > Constructed on the fly
- > Stores metadata, e.g., statistics
- > Exploits metadata: 1 memory-based computations

I/O's (sequential I/O's)

- > Incrementally adapted based on user interactions
- index structure & metadata are updated

_ Multilevel Tile Structure

- > In-memory 2D tile-based multilevel index
- > Organizes data objects into hierarchy of tiles
- > Enables efficient interactive exploration in the 2D plane, e.g., Pan, Zoom

Categorical-based tree Structure

- > Lightweight, memory-oriented, trie-like tree structure
- > Organizes data objects & computes statistics based on categorical attributes
- > Enable efficient categorical-based operations & analytics, e.g., group-by, filter

Index Adaptation

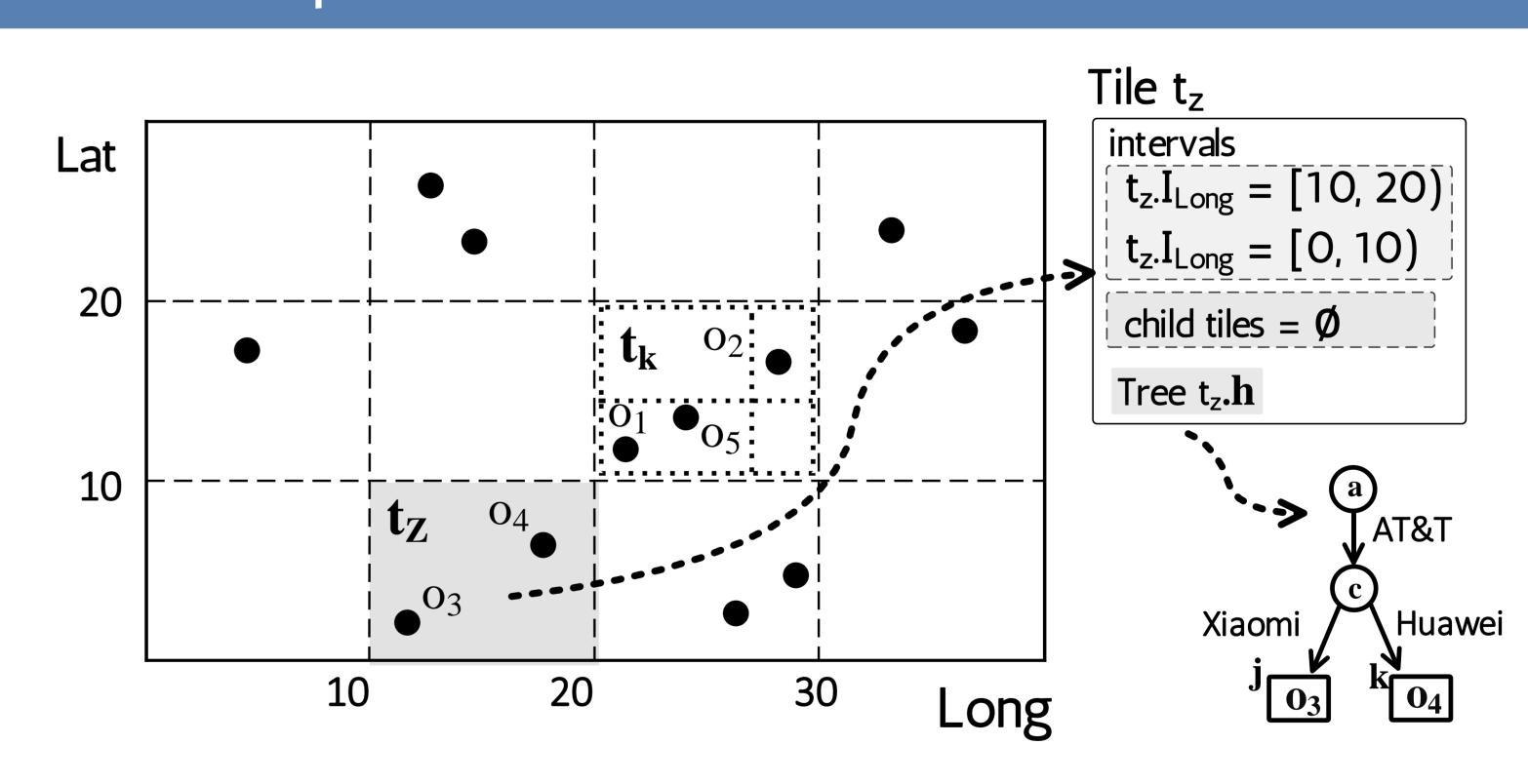
_ Index Adaptation Types

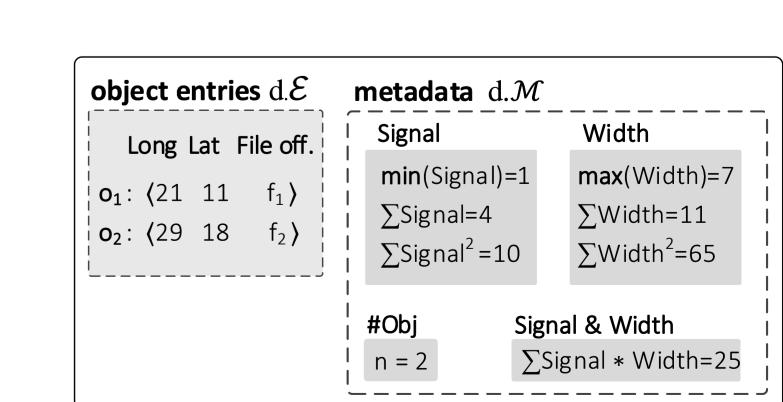
- > Structure Adaptation: split & merge Tiles & Trees, expand trees, etc.
- > Metadata Adaptation: enrich & update

_ Interactive User-based Adaptation

- > Considering the locality-based characteristics of the exploration scenarios, adaptations are performed around the areas that the user exploration focuses
 - ⇒ more fine-grained indexing & rich metadata in these areas







Sample Data

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Objects

Long	Lat	Signal	Width	Brand	Provider	Net
21	11	3	7	Samsg	Veriz	3G
29	18	1	4	Samsg	Veriz	4G
11	1	7	6	Xiaomi	AT&T	4G
19	7	2	3	Huawei	AT&T	5G

Huawei Veriz 5G

Attributes

Leaf Example