



## Thesis Presentation

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WORLD CHANGING GLASGOW







### Thesis Title: <u>QUERY-DRIVEN LEARNING</u> FOR AUTOMATING <u>EXPLORATORY</u> <u>ANALYTICS</u> IN LARGE-SCALE DATA MANAGEMENT SYSTEMS



Heterogeneous

data are

initially

ingested





















#### How can we expedite this process ?







<u>Main Idea</u>: Take advantage of <u>past</u> queries and their answers (query, answer) to build predictive models.









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# Contributions in this thesis were focused on three pillars















<b>ML-AQP</b>
for
Estimation



- 1. How to represent SQL queries as vectors ?
- 2. How to *estimate* aggregate queries ?
- 3. How to *estimate* GROUP-BY queries ?
- 4. What kind of Query-Driven Learning models to use ?
- 5. How to perform error estimation ?



**Explanations** for *Exploration* 



- 1. How to explain aggregate queries ?
- 2. How can explanations assist exploration ?
- 3. What kind of models to use ?
- 4. How to identify the best model for each subspace ?
- 5. How can we use explanation functions effectively ?







- 1. How can we automatically pinpoint regions of interest ?
- 2. What's a baseline algorithm for this task ?
- 3. How can we identify multiple regions effectively ?
- 4. How can Query-Driven Learning help expedite this task ?



### Dynamic Data & Workload Adaptation



- Query-Driven Learning can be used for many tasks.
  (Estimation, Exploration, Exploitation)
- 2. What do we do when underlying data change ?
- 3. What do we do when query workloads change ?
- 4. Introduction of adaptation mechanisms.







- <u>Savva, Fotis</u>, Christos Anagnostopoulos, and Peter Triantafillou."ML-AQP:Query-Driven Approximate Query Processing based on Machine Learning."arXiv preprint arXiv:2003.06613 (2020)
- <u>Savva, Fotis</u>, Christos Anagnostopoulos, and Peter Triantafillou. "SuRF: identification of interesting data regions with surrogate models." 2020 IEEE 36<sup>th</sup> International Conference on Data Engineering (ICDE). IEEE, 2020.
- <u>Savva, Fotis</u>, Christos Anagnostopoulos, and Peter Triantafillou. "Adaptive learning of aggregate analytics under dynamic workloads." **Future Generation Computer Systems** (2020).
- <u>Savva, Fotis</u>, Christos Anagnostopoulos, Peter Triantafillou, and Kostas Kolomvatsos. "Large-scale data exploration using explanatory regression functions." ACM Transactions on Knowledge Discovery from Data (2020).
- <u>Savva, Fotis</u>. "Query-Driven Learning for Next Generation Predictive Modelling & Analytics. "Proceedings of the **2019 International Conference on Management of Data. (SIGMOD SRC)** 2019. Recipient of 2<sup>nd</sup> place.
- <u>Savva, Fotis</u>, Christos Anagnostopoulos, and Peter Triantafillou. "Aggregate query prediction under dynamic workloads." **2019 IEEE International Conference on Big Data (Big Data).** IEEE, 2019.
- <u>Savva, Fotis</u>, Christos Anagnostopoulos, and Peter Triantafillou. "Explaining aggregates for exploratory analytics." **2018 IEEE International Conference on Big Data (Big Data).** IEEE, 2018.





## Thank You. Questions ?

http://www.dcs.gla.ac.uk/essence/