#### Towards Transparent Combination of Model Management Execution Strategies for Low-Code Development Platforms

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LCDP manipulates model: • At design time

• At runtime



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#### Large models? Modification frequency? Connectivity? NEED OF ADAPTED TECHNIQUES



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**Running example:** Build a LCDP to manipulate social networks

- Large datasets (huge social graph)
- Often modified
- Large number of users

min · 🖨 👻 Hello : Is everybody fine ? קל J'aime Commenter 2 Helene Coullon Yay! J'aime · Répondre · 1 min Gerson Sunye Perfectly 1 J'aime · Répondre · 1 min Massimo Tisi Yes and you? J'aime · Répondre · 1 min Jolan Philippe Yes and you? J'aime · Répondre · 1 min Massimo Tisi Great then J'aime · Répondre · 1 min Helene Coulion Yav! 2 🚹 J'aime · Répondre · 1 min

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Query: What is the most debated post in a social network?

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• Query:

What is the most debated post in a social network?

Score(post) = 10 \* #(post.comments)

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- #(post.comments) = 6
- #(post.comments.likes) = 5

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Score(post) = 10 \* #(post.comments)

+ #(post.comments.likes)

- #(post.comments) = 6
- #(post.comments.likes) = 5
- Score(post) = 65

## **Many execution strategies**

#### Reactivity

- Incrementality
- Laziness

#### Parallelism

- Data-Parallelism
- Task-Parallelism
- Asynchronism

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- Parallelism
  - Data-Parallelism
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  - Asynchronism

- Diversity of solutions
- Many possible implementations
- Adapted for different needs
- Need of knowledge (expertise)
- Need of configuration
- Not lowcode friendly

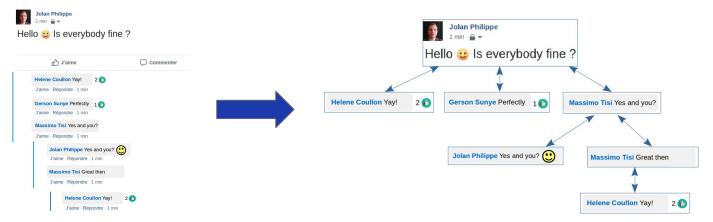
# **Multi-strategy for parallelism** Implementation of strategies using Spork

Support for distributed data structures: 

High-order functions

- MapReduce
- GraphX (+ Pregel)

Model as graphs: A node per class, an edge per relationship.



#### **Direct implementation**

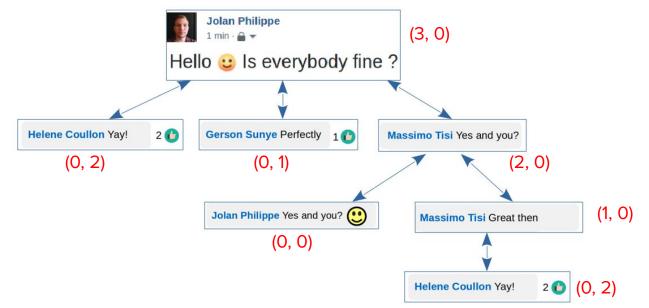
- 1. Get all the comments from a post (recursive DFS)
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- 3. Calculate the score

#### **Direct implementation**

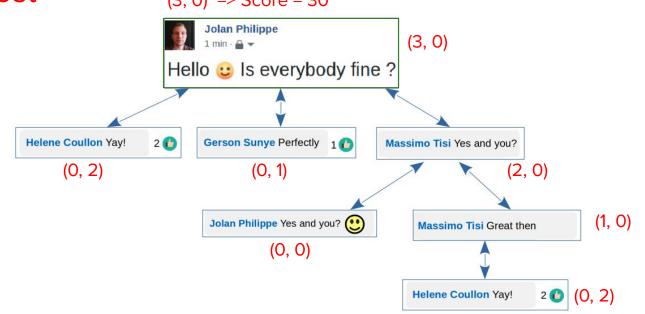
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ProsConsEasy to writeWe do not expectEasy to readgoodperformances

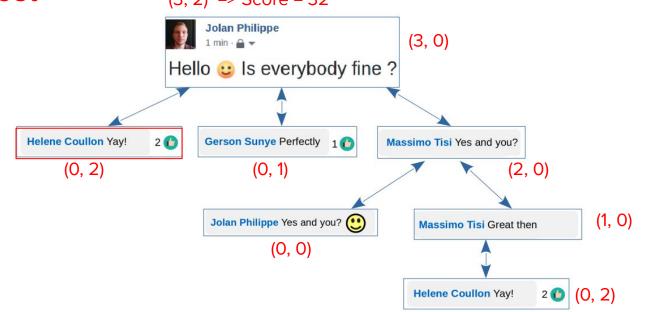
- 1. Parallel Map + Reduce: a score by submission
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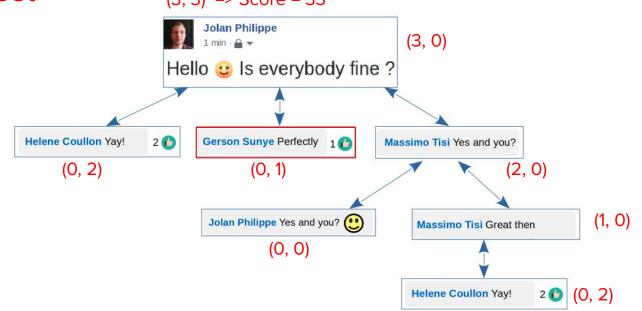
- 1. Parallel Map + Reduce: a score by submission
- 2. Accumulation of sub-scores (recursive DFS) for a given post (3.0) => Score = 30



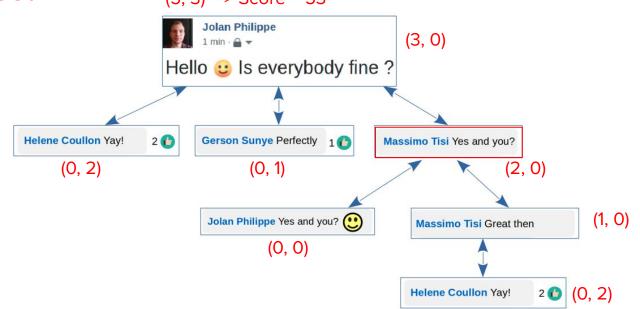
- 1. Parallel Map + Reduce: a score by submission
- 2. Accumulation of sub-scores (recursive DFS) for a given post (3.2) => Score = 32



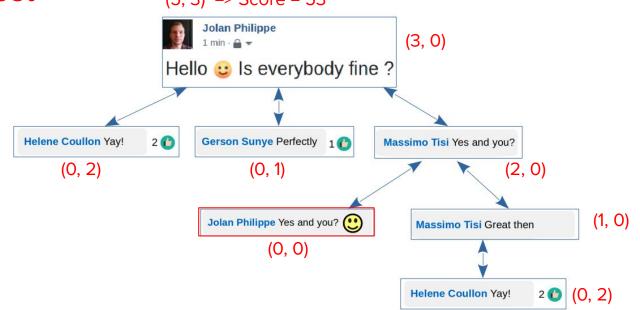
- 1. Parallel Map + Reduce: a score by submission
- 2. Accumulation of sub-scores (recursive DFS) for a given post (3, 3) => Score = 33



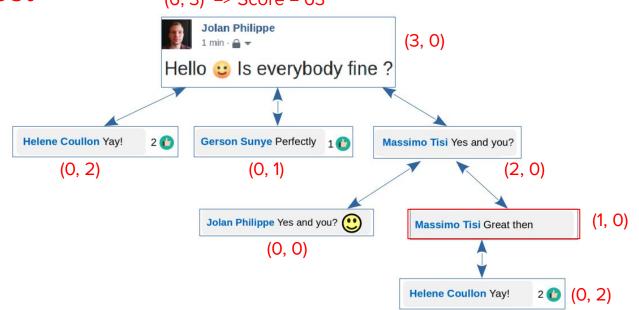
- 1. Parallel Map + Reduce: a score by submission
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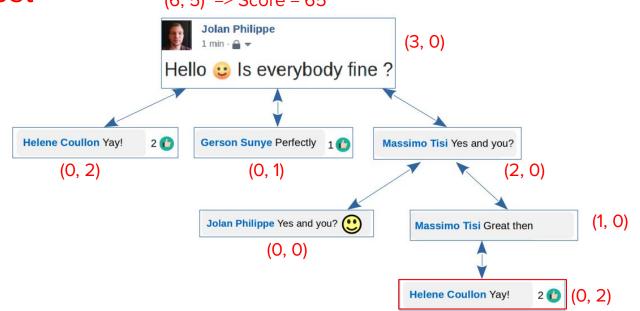
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- 1. Parallel Map + Reduce: a score by submission
- 2. Accumulation of sub-scores (recursive DFS) for a given post (6, 3) => Score = 63



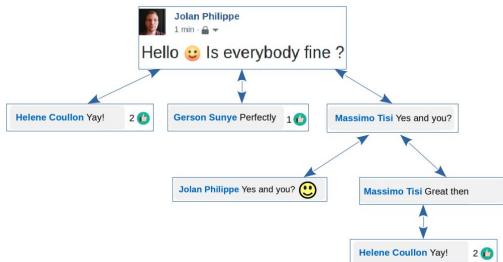
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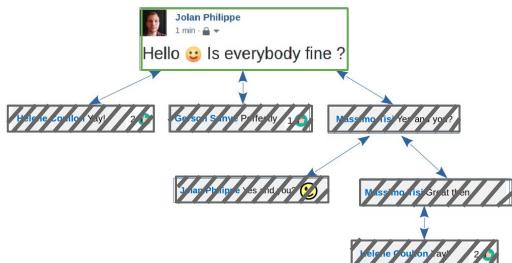
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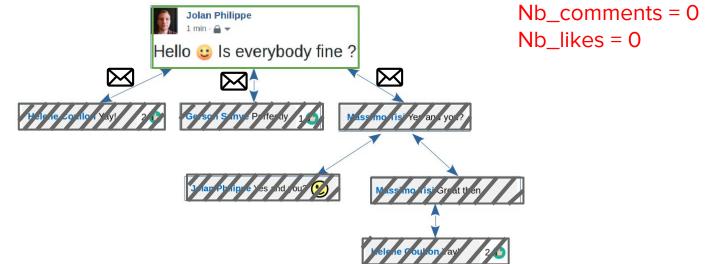
- 1. Initial step: parallel Map
- 2. Reachability by propagation (Pregel) from a post
  - a. message passing
  - b. with accumulators
- 3. Calculate the score from accumulators



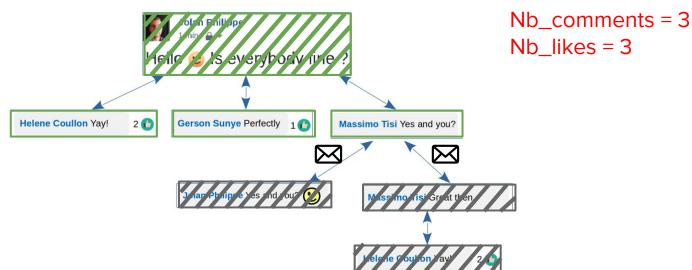
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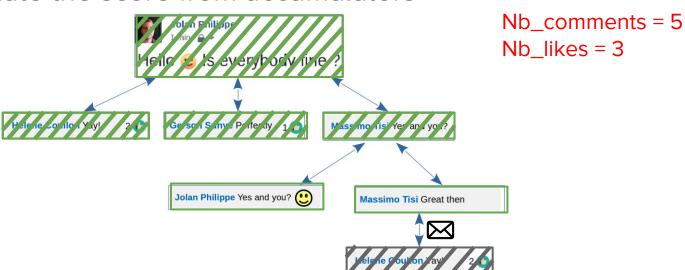
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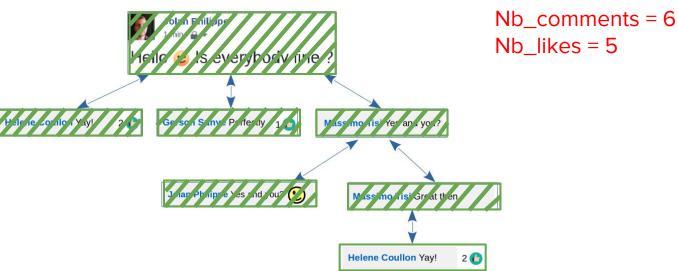
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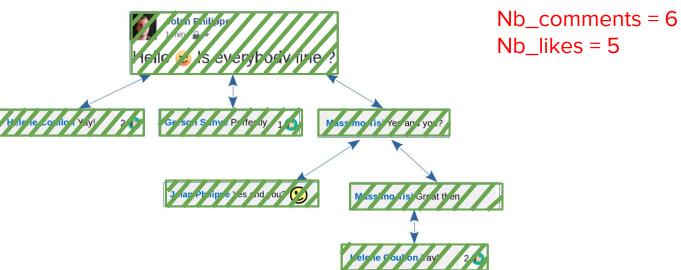


- Initial step: parallel Map 1.
- Reachability by propagation (Pregel) from a post 2.
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- 3. Calculate the score from accumulators

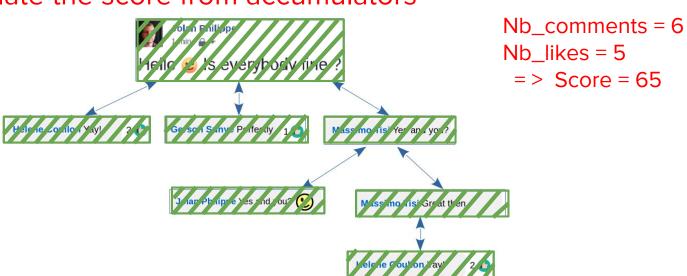


Nb likes = 5

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Easy to writeHard to readStrong engine (perf)Limited parallelism

## **Multi-Strategy implementation**

#### • Direct implementation + Pregel

- 1. Parallel <u>Map + Reduce</u>: a score by comment
- 2. Accumulation of sub-scores (DFS to <u>Pregel</u>) for a given post

#### • MapReduce implementation + Pregel

- 1. Get all the comments from a post (DFS to Pregel)
- 2. Count the likes (from previous comments)
- 3. Calculate the score

#### Experiments

#### **Execution of the score functions on all posts:**

- 5 Strategies
- 30 executions each
- 8 datasets ((1274 nodes, 2533 edges) to (115121 nodes, 286502 edges))

#### Single machine configuration:

- Java 1.8 with Scala 2.13.2 (Spark 3.0.1)
- Intel(R) Core(TM) i7-8650U CPU
  - 8 cores
  - 1.90GHz
- Memory of 32 GB



#	Dataset				Speed-up (compared to Naive Sequential)						
	# users	# posts	# comments	# likes	Naive Sequential	Naive Parallel	Pregel	MapReduce	OCL + Pregel	MapReduce + Pregel	
1	80	554	640	6	1x	0.40x	10.30x	5.82x	9.40x	4.63x	
2	889	1064	118	24	1x	0.39x	0.36x	0.46x	0.44x	0.46x	
3	1845	2315	190	66	1x	0.51x	0.68x	0.85x	0.66x	0.71x	
4	2270	5056	204	129	1x	0.27x	0.35x	2.34x	0.15x	2.96x	
5	5518	9220	394	572	1x	4.25x	5.21x	4.17x	4.68x	4.03x	
6	10929	18872	595	1598	1x	4.68x	2.83x	2.39x	1.97x	3.91x	
7	18083	39212	781	4770	1x	4.07x	4.12x	4.58x	5.17x	3.27x	
8	37228	76735	1158	13374	1x	7.28x	9.52x	7.61x	9.66x	9.22x	



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#### **Solution**

- Several strategies for model management: Example with <u>parallelism</u> Not all adapted for every situation
- Need of additional metadata
  - Size and topology of model
  - Kind of operation and their frequency
  - (Available architecture)
- Adaptive engine based on a multi-strategy approach

#### Conclusion

- Many execution strategies
- As a concrete example: several parallel strategies (TTC18)
- There is no solution adapted in every situation
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- Implement and experiment reactive (incremental and lazy) aspects
- Conduct additional experiments:
  - Larger dataset
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#### **Questions ?**