

# Apache Nemo: A Framework for Building Distributed Dataflow Optimization Policies

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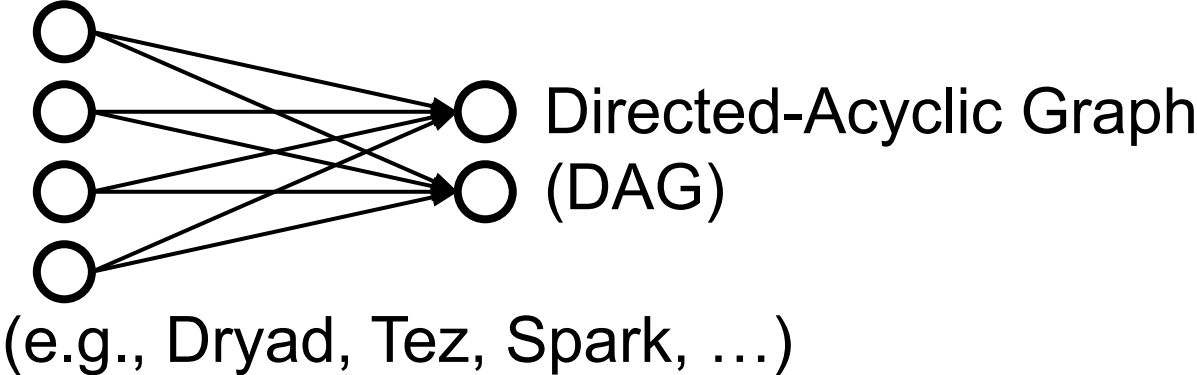
# Distributed data processing applications and runtime

**Application**

`dataCollection.map(..).reduce(..)`  
(e.g., DryadLINQ, Spark RDD, Beam)



**Runtime**



# Policy interfaces for scheduling/communication

**Application-level**    `register(stat,`                    - Correctness: O  
(e.g., Optimus)       `subqueryA, subqueryB)` - Fine Control: X

**Runtime-level**        `onEvent(event) {`                    - Correctness: X  
(e.g., Dryad)           `modify(DAG, event)`               - Fine Control: O  
                          `}`

# Our idea: Transform an intermediate representation

- **IR DAG:** Provides both correctness and fine control
- **Optimization pass:** A function to transform the IR DAG
- **Runtime extensions:** Apply the optimizations

# Experimental Evaluation

- **Deployment scenarios**

- Resources: Transient, Geo-distributed
- Data: Large, Skewed

- **Results**

- Nemo is on par with specialized runtimes
- Nemo further improves performance for scenarios with combinations of resource/data characteristics

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<https://nemo.apache.org/>

