# **Cloud Computing Tutorial Session 4**



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Complex and Distributed IT-Systems

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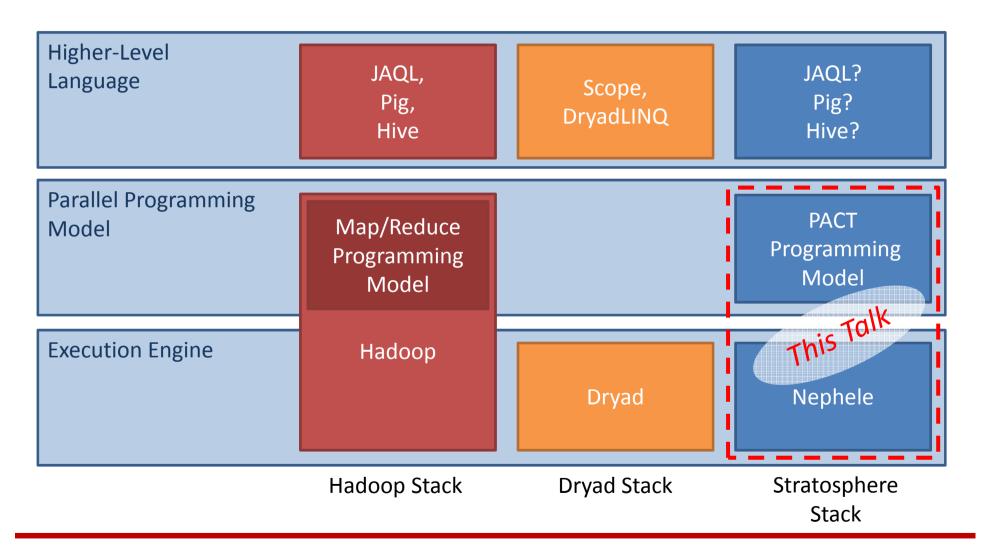


### **Agenda**

- Architecture of the Stratosphere System
  - The PACT Programming Model
  - The Nephele Execution Engine
- Project Assignment #4
- TPC-H benchmark data



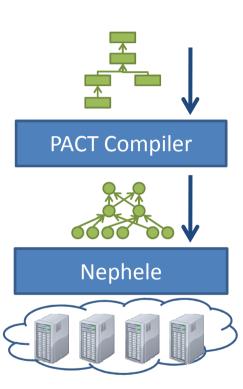
#### **Architecture Overview**





### Stratosphere in a Nutshell

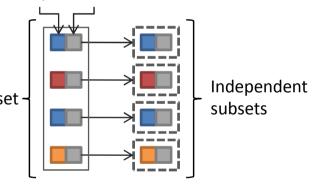
- PACT Programming Model
  - Parallelization Contract (PACT)
  - Declarative definition of data parallelism
  - Centered around second-order functions
  - Generalization of map/reduce
- Nephele
  - Dryad-style execution engine
  - Evaluates dataflow graphs in parallel
  - Data is read from distributed filesystem
  - Flexible engine for complex jobs
- Stratosphere = Nephele + PACT
  - Compiles PACT programs to Nephele dataflow graphs
  - Combines parallelization abstraction and flexible execution
  - Choice of execution strategies gives optimization potential



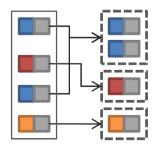


# An Intuition for Parallelization Contracts (PACTs)

- Map and reduce are second-order functions
  - Call first-order functions (user code)
  - Provide first-order functions with subsets of the input data
- Map and reduce are PACTs in our context<sub>Key Value</sub>
- Map
  - All pairs are independently processed Input set -



- Reduce
  - Pairs with identical key are grouped
  - Groups are independently processed





### What is a PACT?

 Second-order function that defines properties on the input and output data of its associated first-order function

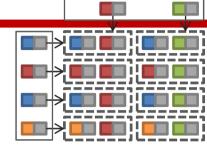


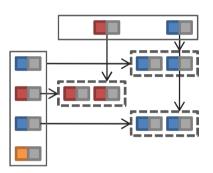
- Input Contract
  - Generates independently processable subsets of data
  - Generalization of map/reduce
  - Enforced by the system
- Output Contract
  - Describes properties of the output of the first-order function
  - Use is optional but enables certain optimizations
  - Guaranteed by the user
- Key-Value data model

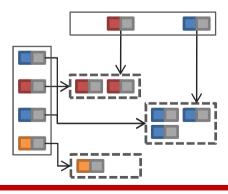


# PACTs beyond Map and Reduce

- Cross
  - Multiple inputs
  - Cartesian Product of inputs is built
  - All combinations are processed independently
- Match
  - Multiple inputs
  - All combinations of pairs with identical key over all inputs are built
  - All combinations are processed independently
  - Contract resembles an equi-join on the key
- CoGroup
  - Multiple inputs
  - Pairs with identical key are grouped for each input
  - Groups of all inputs with identical key are processed together









### Output Contracts (examples)

- Same-Key
  - User Function does not alter the key
  - For Multi-Input PACTs specify whose input-key remains



- Super-Key
  - Key generated by UF is a super-key of the input key
  - For Multi-Input PACTs specify from which input the key is a super-key



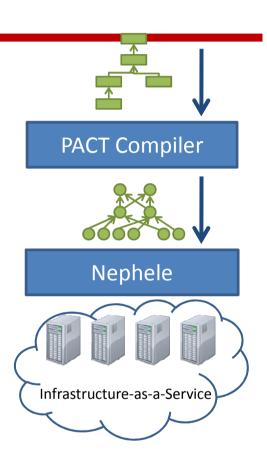
- Unique-Key
  - UF produces unique keys





## **Nephele Execution Engine**

- Executes Nephele schedules
  - compiled from PACT programs
- Design goals
  - Exploit scalability/flexibility of clouds
  - Provide predictable performance
  - Efficient execution on 1000+ nodes
  - Introduce flexible fault tolerance mechanisms
- Inherently designed to run on top of an laaS Cloud
  - Can exploit on-demand resource allocation
  - Heterogeneity through different types of VMs possible
  - Knows Cloud's pricing model





### **Nephele Architecture**

Workload over time Standard master worker pattern Workers can be allocated on demand Client Public Network (Internet) **Compute Cloud** Cloud Controller Persistent Storage Master Private / Virtualized Network Worker Worker Worker



### **Project Assignment #4**

- Goal
  - Compare Hadoop and PACT programming models for a simple query
  - Use Hadoop and Stratosphere frameworks
- Test data
  - TPC-H benchmark tools
  - Generates relational data model in ASCII format



#### **TPC-H Data Model**

- Relations relevant for assignment
  - Customers
    - Have key, name and other attributes
  - Orders
    - Customers create orders
    - Has key, totalprice and other attributes
    - Has foreign key on customer
  - Lineitems
    - Orders consist of lineitems
    - Has foreign key on order