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# **Modeling Big Data Systems by Extending the Palladio Component Model**

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# Agenda

- Motivation
- Development Process and Characteristics of Big Data Systems
- Palladio Component Model (PCM) Meta-model Extension
- Related Work
- Conclusion and Future Work

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# Motivation



- Various big data technologies with different characteristics
- Casado and Younas (2015) list two main techniques that are common for big data systems, namely, batch and stream processing

# Motivation

- The added value of big data systems for organizations depends on the performance of such systems (Barbierato et al. 2014)
- Performance models allow for proactive evaluations of these systems
- Existing performance meta-models for big data systems, however, focus on either ...
  - ... one processing paradigm such as stream processing  
e.g., Ginis and Strom (2013)
  - ... or one technology such as Apache Hadoop MapReduce  
e.g., Ge et al. (2013)
- We propose a general performance meta-model to specify shared characteristics of big data systems

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# Development Process of Big Data Systems

## Component developers

- Batch processing (e.g., using Apache MapReduce)

```
public void map(Object key, Text value, ..){
    StringTokenizer itr = new StringTokenizer(value.toString());
    while (itr.hasMoreTokens()) {
        word.set(itr.nextToken());
        context.write(word, one); } }
```

```
public void reduce(Text key, Iterable<IntWritable> values,..){
    int sum = 0;
    for (IntWritable val : values) {
        sum += val.get(); }
    result.set(sum);
    context.write(key, result); }
```

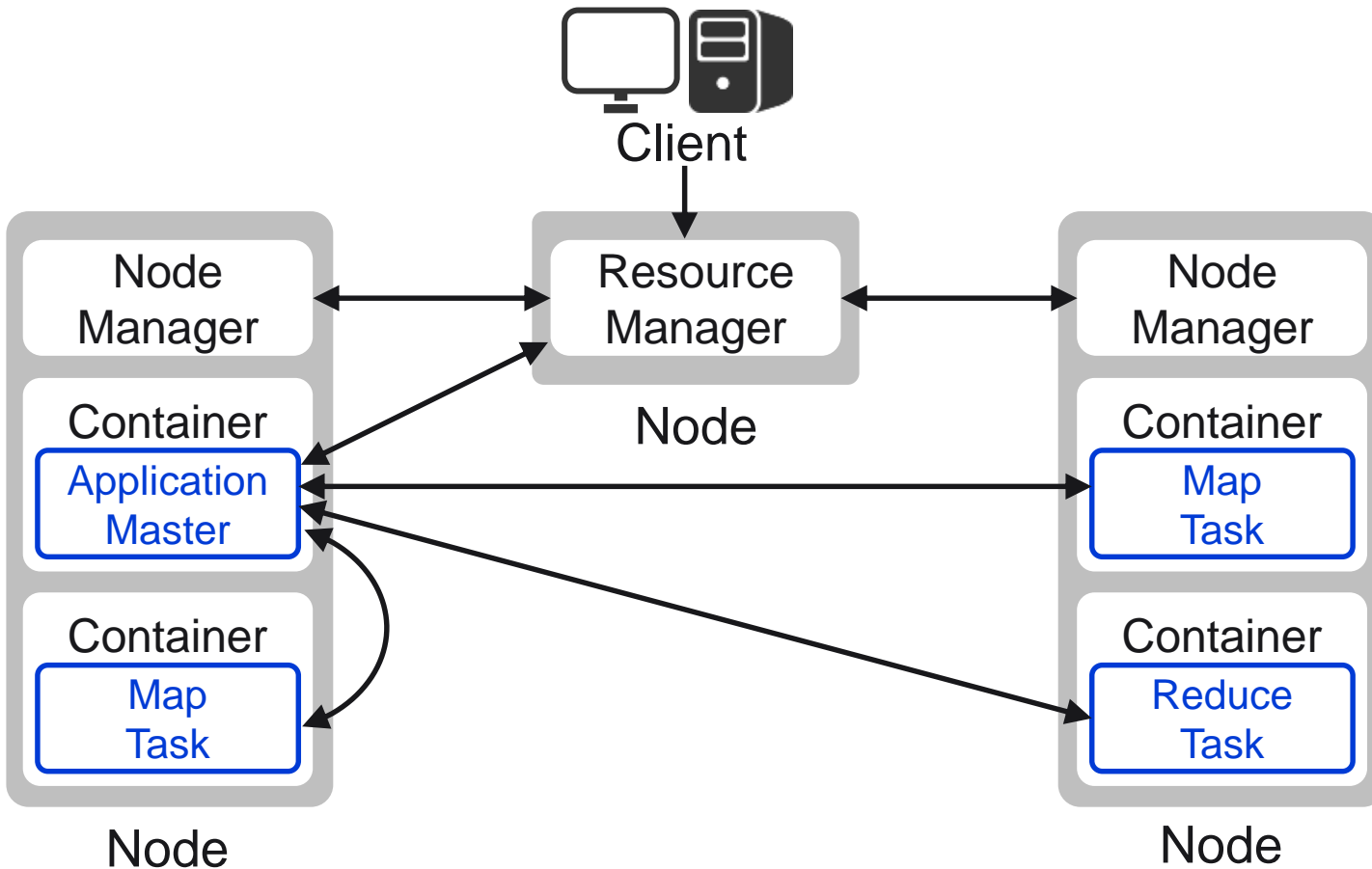
- Stream processing (e.g., using Apache Storm)

```
public void execute(Tuple tuple, BasicOutputCollector collector) {
    String word = tuple.getString(0);
    Integer count = counts.get(word);
    if (count == null) count = 0;
    count++;
    counts.put(word, count);
    collector.emit(new Values(word, count)); }
```

# Development Process of Big Data Systems

## System deployers

- Resource environment (e.g., Apache YARN)





# Characteristics of Big Data Systems

- We derive the following requirements of big data systems that we propose to implement based on the finding of previous work (Kroß et al. 2015)

## 1. Distribution and parallelization of operations

- Component developers specify reusable software components consisting of operations using software frameworks like Apache Spark.
- In doing so, they may specify, but also may not know the definite number of simultaneous and/or total executions of an operation.

## 2. Clustering of resource containers

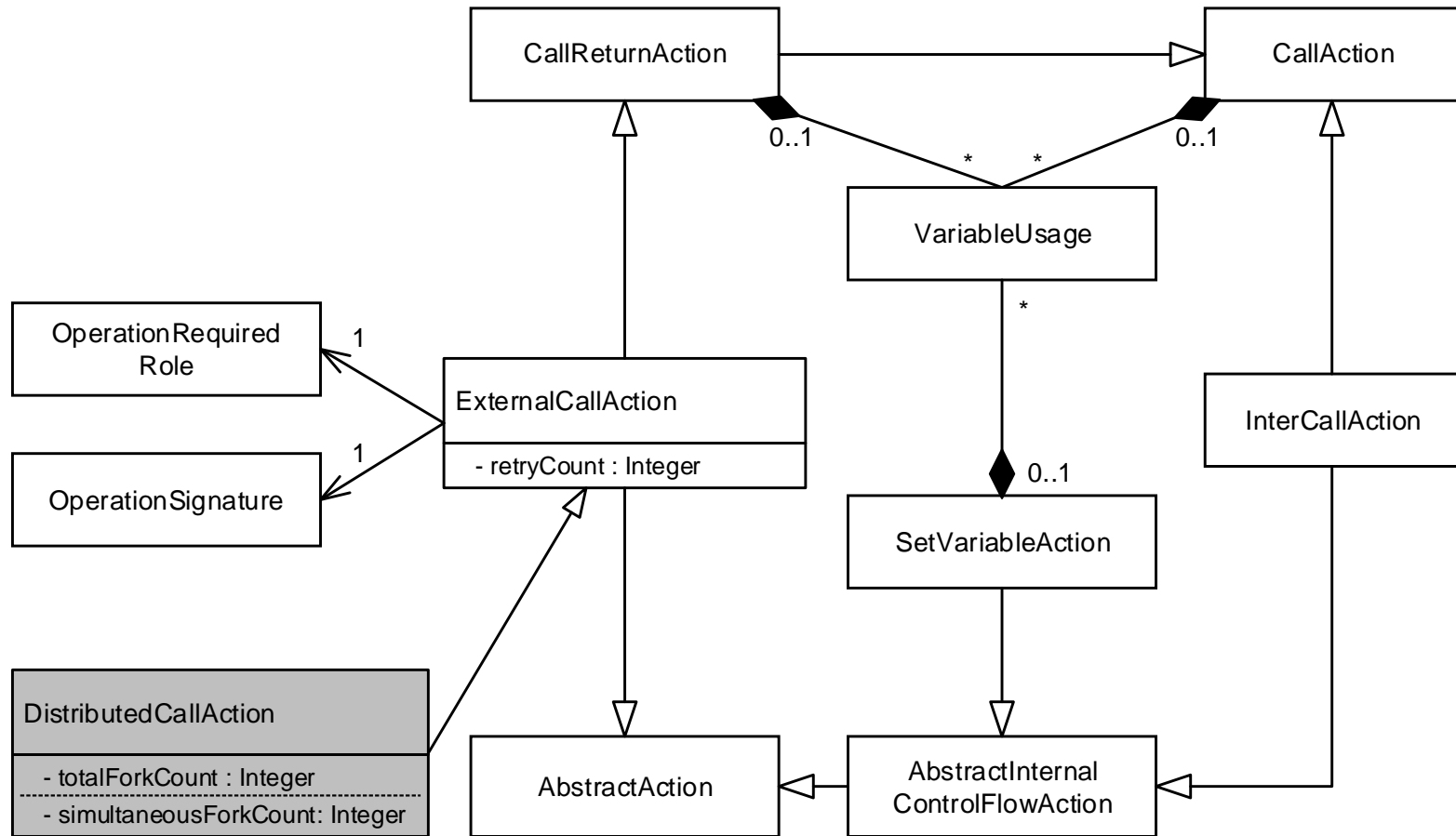
- System deployers specify resource containers with resource roles (e.g., master or worker nodes), link them to a mutual network and logically group them to a computer cluster.

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# PCM Meta-model Extension

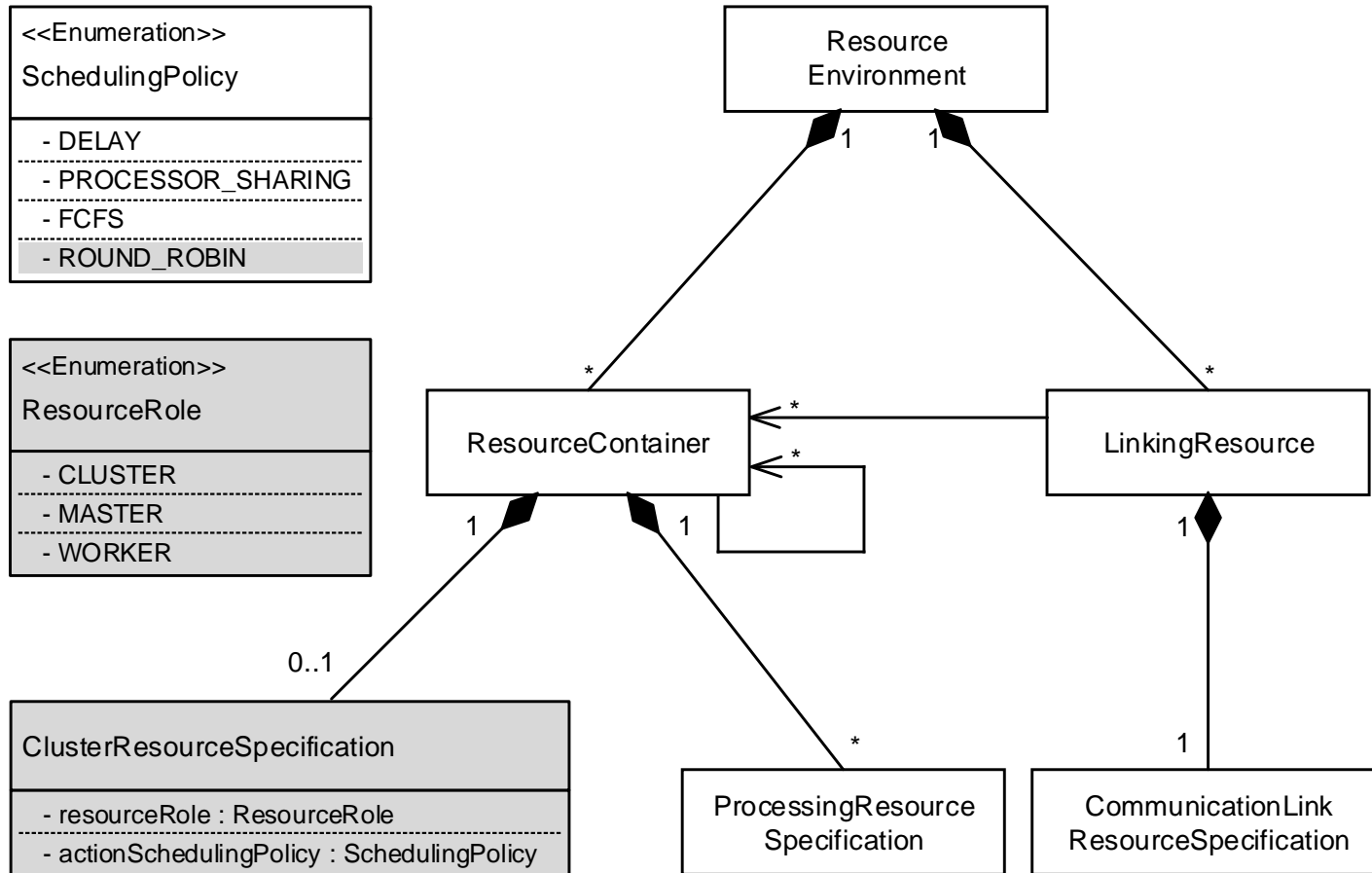
## Service effect specification (SEFF) actions



PCM Version 3.4.1

# PCM Meta-model Extension

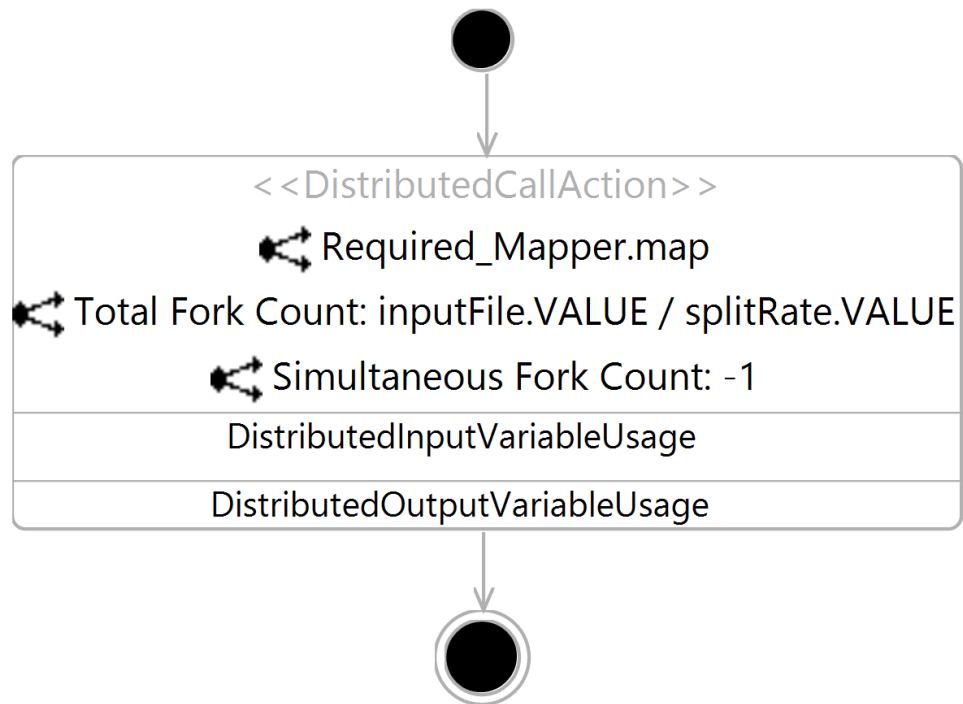
## Resource environment



PCM Version 3.4.1

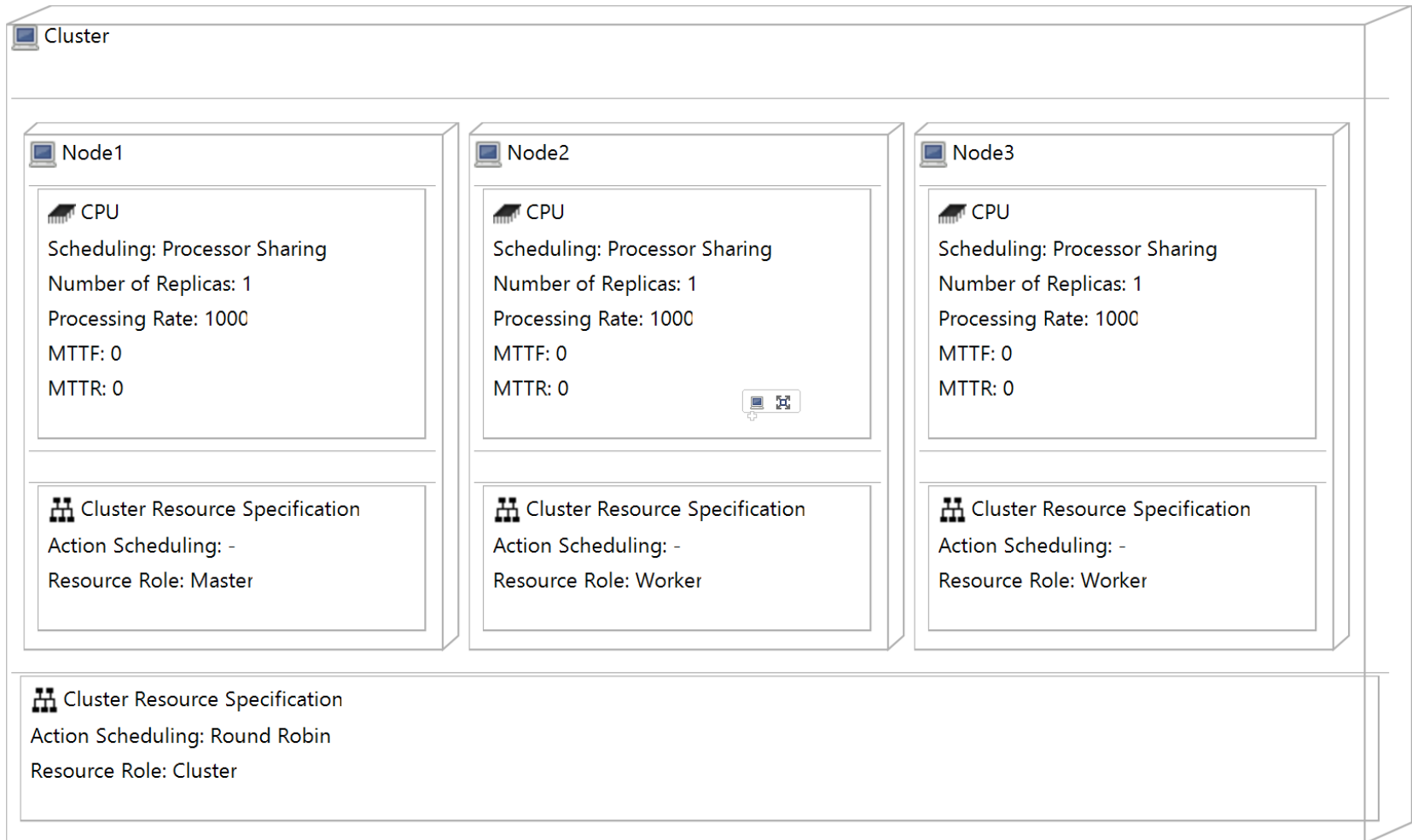
# PCM Meta-model Extension

## Service effect specification (SEFF) diagram



# PCM Meta-model Extension

## Resource environment diagram



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# Related Work

- Ginis and Strom (2013) present a method for predicting the response time of stream processes in distributed systems
- Verma et al. (2011) introduce the ARIA framework which specifies on strategy scheduling of single Apache MapReduce jobs
- Vianna et al. (2013) propose an analytical performance model which focuses on the pipeline between map and reduce jobs
- Barbierato et al. (2013) and Ge et al. (2013) present modeling techniques for Apache MapReduce which allow to estimate response times only
- Castiglione et al. (2014) use Markovian agents and mean field analysis to model big data batch applications and to provide information about performance of cloud-based data processing architectures



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# Conclusion and Future Work

- We introduced a modeling approach that allows to model essential characteristics of data processing as found in big data systems
- We presented to meta-model extensions for PCM ..
  - ...to model a computer cluster and
  - ...to apply distributed and parallel operations on this cluster
- We plan to ...
  - ... complete extending the simulation framework SimuCom
  - ... fully evaluate our extensions for up- and downscaling scenarios
  - ... automatically derive performance models based on measurement data

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