

# Nondeterministic Asynchronous Dataflow in Isabelle/HOL

Rafael Castro G. Silva, Laouen Fernet and Dmitriy Traytel

`razi@di.ku.dk`

Department of Computer Science  
University of Copenhagen

14/05/2025

# Motivation

## Context:

- Stream Processing: programs that compute (possibly) unbounded sequences of data (streams)
- A common problem in the industry
- Frameworks:  
Apache Flink, Apache Samza, Apache Spark, Google Cloud Dataflow, and Timely Dataflow



- Why use frameworks?
  - Highly Parallel
  - Low latency (output as soon as possible)
  - Incremental computing (re-uses previous computations)

# Motivation

## Context:

- Stream Processing: programs that compute (possibly) unbounded sequences of data (streams)
- A common problem in the industry
- Frameworks:  
Apache Flink, Apache Samza, Apache Spark, Google Cloud Dataflow, and Timely Dataflow



- Why use frameworks?
  - Highly Parallel
  - Low latency (output as soon as possible)
  - Incremental computing (re-uses previous computations)

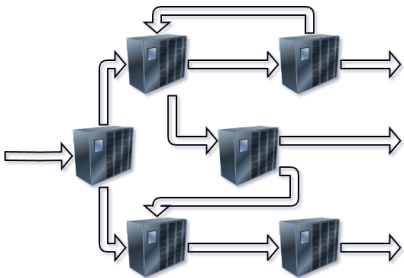
## Our goal:

Mechanically Verify Timely Dataflow algorithms

# A Good Foundation

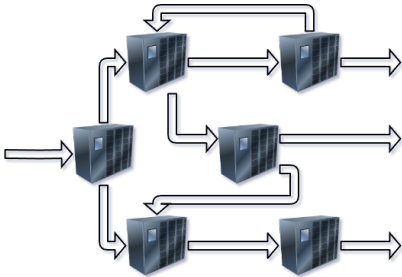
# A Good Foundation

- Nondeterministic Asynchronous Dataflow

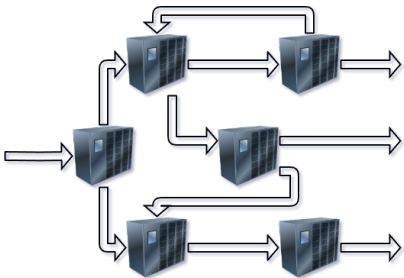


# A Good Foundation

- Nondeterministic Asynchronous Dataflow
  - Dataflow: Directed graph of interconnected operators



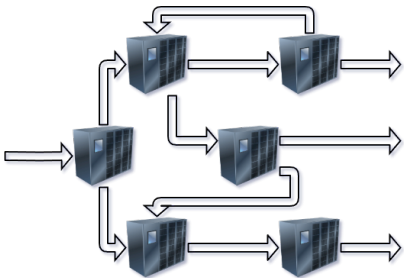
# A Good Foundation



- Nondeterministic Asynchronous Dataflow
  - Dataflow: Directed graph of interconnected operators
  - Asynchronous:
    - Operators execute independently: processes without an orchestrator
    - Operators can freely communicate with the network (read/write); do silent computation steps
    - Networks are unbounded FIFO queues



# A Good Foundation



- Nondeterministic Asynchronous Dataflow
  - Dataflow: Directed graph of interconnected operators
  - Asynchronous:
    - Operators execute independently: processes without an orchestrator
    - Operators can freely communicate with the network (read/write); do silent computation steps
    - Networks are unbounded FIFO queues
  - Nondeterministic:
    - Operators can make nondeterministic choices
    - Operators are relations between inputs and outputs sequences

# The Algebra for Nondeterministic Asynchronous Dataflow

- Bergstra et al. presents an algebra for Nondeterministic Asynchronous Dataflow
- Primitives:  
sequential and parallel composition; feedback loop...
- The 52 axioms
- An process calculus instance

## Network Algebra for Asynchronous Dataflow\*

J.A. Bergstra<sup>1,2,†</sup> C.A. Middelburg<sup>2,3,§</sup> Gh. Ştefănescu<sup>4,‡</sup>

<sup>1</sup>Programming Research Group, University of Amsterdam  
P.O. Box 41882, 1009 DB Amsterdam, The Netherlands

<sup>2</sup>Department of Philosophy, Utrecht University  
P.O. Box 80126, 3508 TC Utrecht, The Netherlands

<sup>3</sup>Department of Network & Service Control, KPN Research  
P.O. Box 421, 2260 AK Leidschendam, The Netherlands

<sup>4</sup>Institute of Mathematics of the Romanian Academy  
P.O. Box 1-764, 70700 Bucharest, Romania

E-mail: janb@fwi.uva.nl - keesm@phil.ruu.nl - ghstef@inar.ro

# Isabelle/HOL Preliminaries

- Classical higher-order logic (HOL):  
Simple Typed Lambda Calculus + axiom of choice + axiom of infinity + rank-1 polymorphism

# Isabelle/HOL

- Classical higher-order logic (HOL):  
Simple Typed Lambda Calculus + axiom of choice + axiom of infinity + rank-1 polymorphism
- Isabelle: A generic proof assistant



- Isabelle/HOL: Isabelle's flavor of HOL

- Classical higher-order logic (HOL):  
Simple Typed Lambda Calculus + axiom of choice + axiom of infinity + rank-1 polymorphism
- Isabelle: A generic proof assistant



- Isabelle/HOL: Isabelle's flavor of HOL

## Why Isabelle/HOL?

- Codatatypes: (possibly) infinite data structures (e.g., lazy lists, streams)
- Corecursion: always eventually produces some codatatype constructor
- Coinductive predicate: infinite number of introduction rule applications
- Coinduction: reason about coinductive predicates

# Operators as a Codatatype

- Codatatypes



- Codatatypes

# Operators Equivalences: Motivation

- foo

# Operators Equivalences: Strong Bisimilarity

- foo

# Operators Equivalences: Weak Bisimilarity

- foo

# Asynchronous Dataflow Operators

- foo

# Asynchronous Dataflow Properties

## Conclusion



- Isabelle/HOL has a good tool set to formalize and reason about stream processing:
  - Codatatypes, coinductive predicates, corecursion with friends, reasoning up to friends (congruence),
    - Coinduction up to congruence principle is automatically derived for codatatypes (but not for coinductive principles)
- Next step: Feedback loop

Questions, comments and suggestions