

# Streamulus

A language for real-time event stream processing

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# Event Stream

An infinite, ordered sequence of discrete elements



# Event Stream Processing

A stream arrives as a sequence of calls to a  
**HandleEvent** function

**HandleEvent(**  **)**

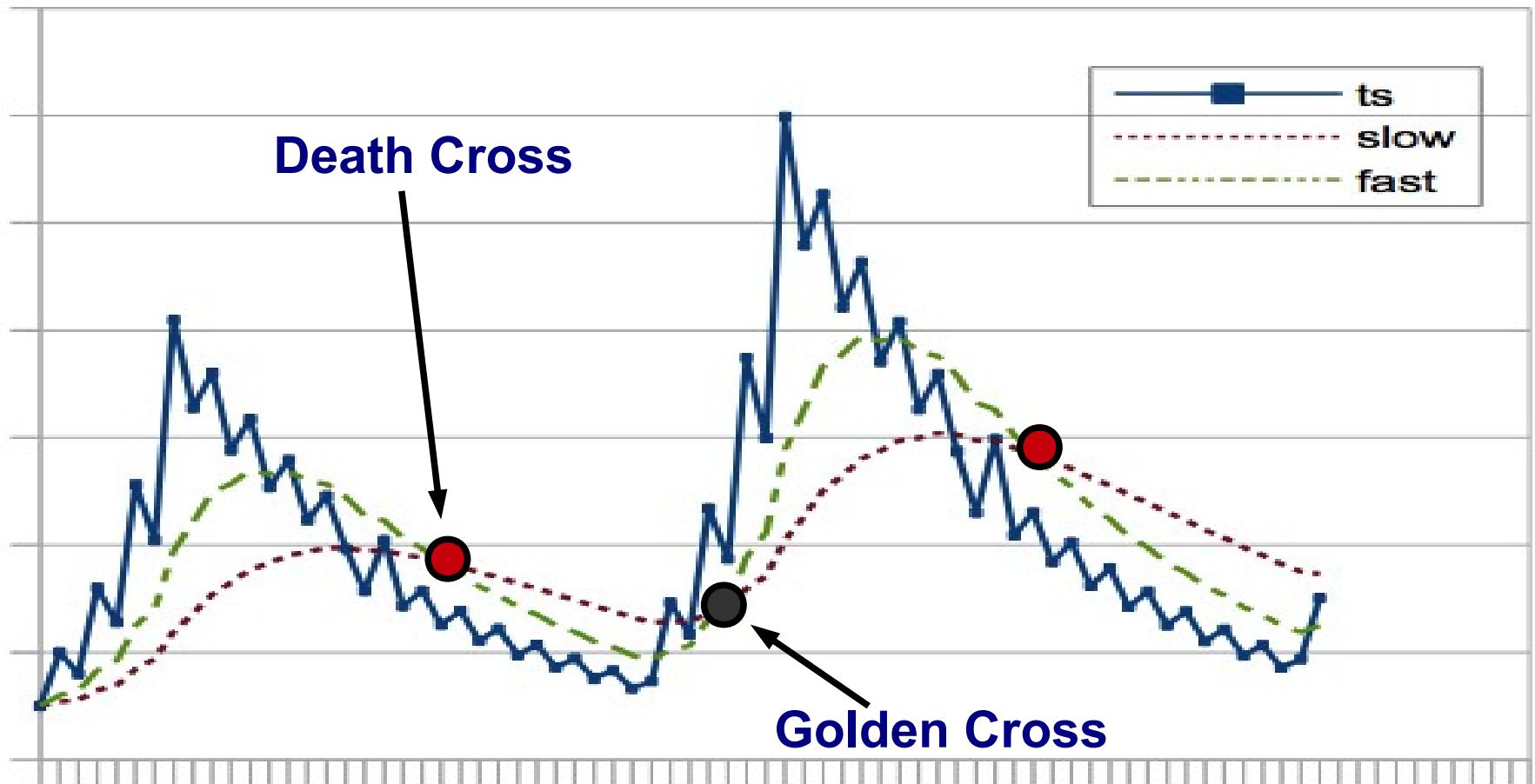
**HandleEvent(**  **)**

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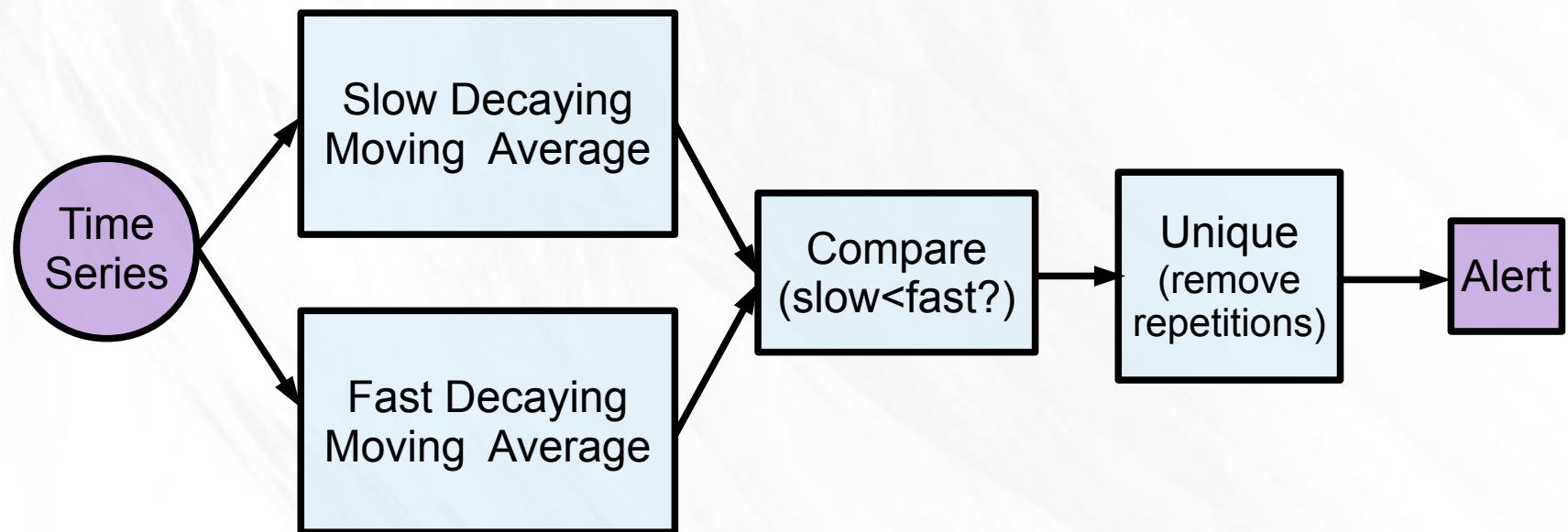
**We need to  
reason about  
the forest**

*We focus on **how to write programs** (not on algorithms)*

# Motivating Example: Crossings of Moving Averages



# Cross Detection



Let's implement this object-orientedly...

# Moving Average

```
template<int DecayFactor>
```

```
class Mavg {
```

```
...
```

```
    double Tick(value) {
        double alpha = 1-exp(-DecayFactor*(now-prev_time));
        prev_time = now;
        return mavg = alpha*value + (1-alpha)*mavg;
    }
```

```
    double Get() {
        return mavg;
    }
```

```
};
```

```
    double mavg;
    clock_t prev_time;
```

# Cross Detection Class

```
class CrossDetection {
```

```
....
```

```
void Tick(value) {
    bool comp = (slow.Tick(value) < fast.Tick(value));
    if (comp != prev_comp)
        IssueCrossingAlert(comp);
    prev_comp = comp;
}
```

```
Mavg<1> slow;
```

```
Mavg<10> fast;
```

```
bool prev_comp;
```

```
};
```

# Cross Detection Class

```
class CrossDetection {
```

```
....
```

```
void Tick(value) {
    bool comp = (slow.Tick(value) < fast.Tick(value));
    if (comp != prev_comp)
        IssueCrossingAlert(comp);
    prev_comp = comp;
}
```

```
Mavg<1> slow;
Mavg<10> fast;
bool prev_comp;
};
```

What if the moving averages are also needed elsewhere?

# Refactored Cross Detection Class

```
class CrossDetection {
```

```
    CrossDetection(Mavg<1>& slow_, Mavg<10>& fast_)
        : slow(slow_), fast(fast_) {}
```

```
    void UpdateValue() {
        bool comp = (slow.Get() < fast.Get());
        if (comp != prev_comp)
            IssueCrossingAlert(comp);
        prev_comp = comp;
    }
```

```
};
```

```
Mavg<1>& slow;
Mavg<10>& fast;
bool prev_comp;
```

Construct mavs elsewhere and pass in references.

Update mavs elsewhere. Here only probe.

# Using the Refactored Class

```
Mavg<10>    fast_mavg;  
Mavg<1>      slow_mavg;  
CrossDetection cross_detection(slow_mavg, fast_mavg);  
SomethingElse  something_else(slow_mavg, fast_mavg);
```

} *setup*

# Using the Refactored Class

Mavg<10>

Mavg<1>

CrossDetection

SomethingElse

fast\_mavg;

slow\_mavg;

cross\_detection(slow\_mavg, fast\_mavg);

something\_else(slow\_mavg, fast\_mavg);

*setup*

```
HandleEvent(double value) {  
    slow_mavg.Tick(value);  
    fast_mavg.Tick(value);  
    cross_detection.UpdateValue(); // implicit data  
    something_else.UpdateValue(); // dependencies  
}
```



*process  
an event*

# This was noticed before

From “The 8 requirements of real-time stream processing”,  
Stonebraker, Çetintemel, Zdonik. SIGMOD Record, 2005:

*"Historically, for streaming applications, general purpose languages such as C++ or Java have been used as the workhorse development and programming tools. Unfortunately, relying on low-level programming schemes results in long development cycles and high maintenance costs."*

And they conclude with the requirement:

*"Query using StreamSQL"*

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From “The 8 requirements of real-time stream processing”,  
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*"Historically, for streaming applications, general purpose languages such as C++ or Java have been used as the workhorse development and programming tools. Unfortunately, relying on low-level programming schemes results in long development cycles and high maintenance costs."*

And they conclude with the requirement, where they probably meant:

*"Query using ~~StreamSQL~~"*

*A Domain-Specific Language*

# StreamSQL

```
SELECT avg(some_column) as AvgValue  
FROM input [rows 20]  
WHERE some_condition  
GROUP BY another_column
```

*Sliding window.  
Last 20 entries.*

**Can include  
user-defined  
operators**

- StreamBase
- Esper
- Sybase Aleri
- Microsoft StreamInsight
- ...

# Returning to Our Problem

```
Mavg<10>      fast_mavg;  
Mavg<1>        slow_mavg;  
CrossDetection  cross_detection(slow_mavg, fast_mavg);  
SomethingElse   something_else(slow_mavg, fast_mavg);
```

*setup*

```
HandleEvent(double value) {  
    slow_mavg.Tick(value);  
    fast_mavg.Tick(value);  
    cross_detection.UpdateValue(); // implicit data  
    something_else.UpdateValue(); // dependencies  
}
```



*process  
an event*

# The Streamulus Way

```
InputStreamT ts = NewInputStream<double>("TS");
SubscriptionT slow = Subscribe<double>(Mavg<1>(ts));
SubscriptionT fast = Subscribe<double>(Mavg<10>(ts));
Subscribe( cross_alert( unique( slow < fast ) ) );
Subscribe( something_else(slow,fast) );
```

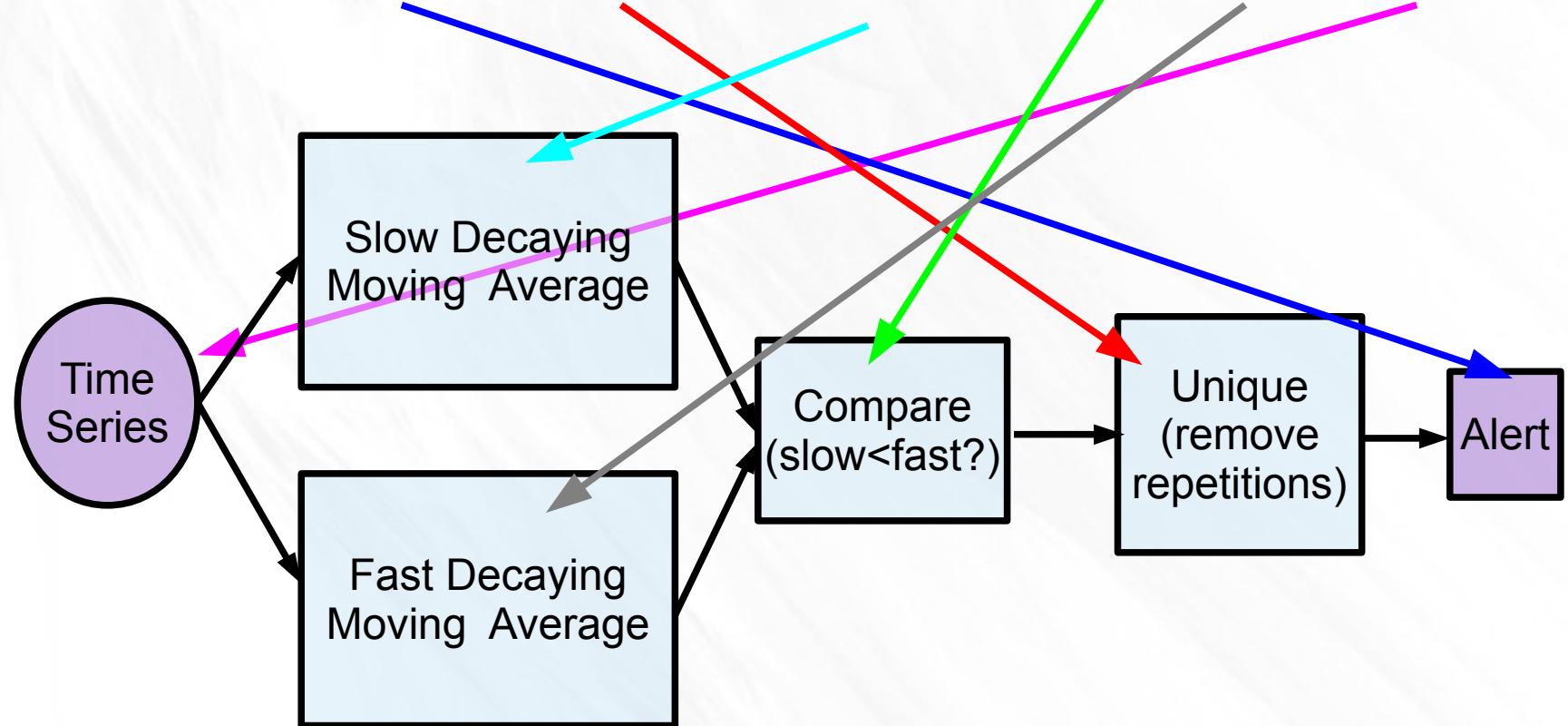
*setup*

```
HandleEvent(double value) {
    InputStreamPut(ts, value);
}
```

*process  
an event*

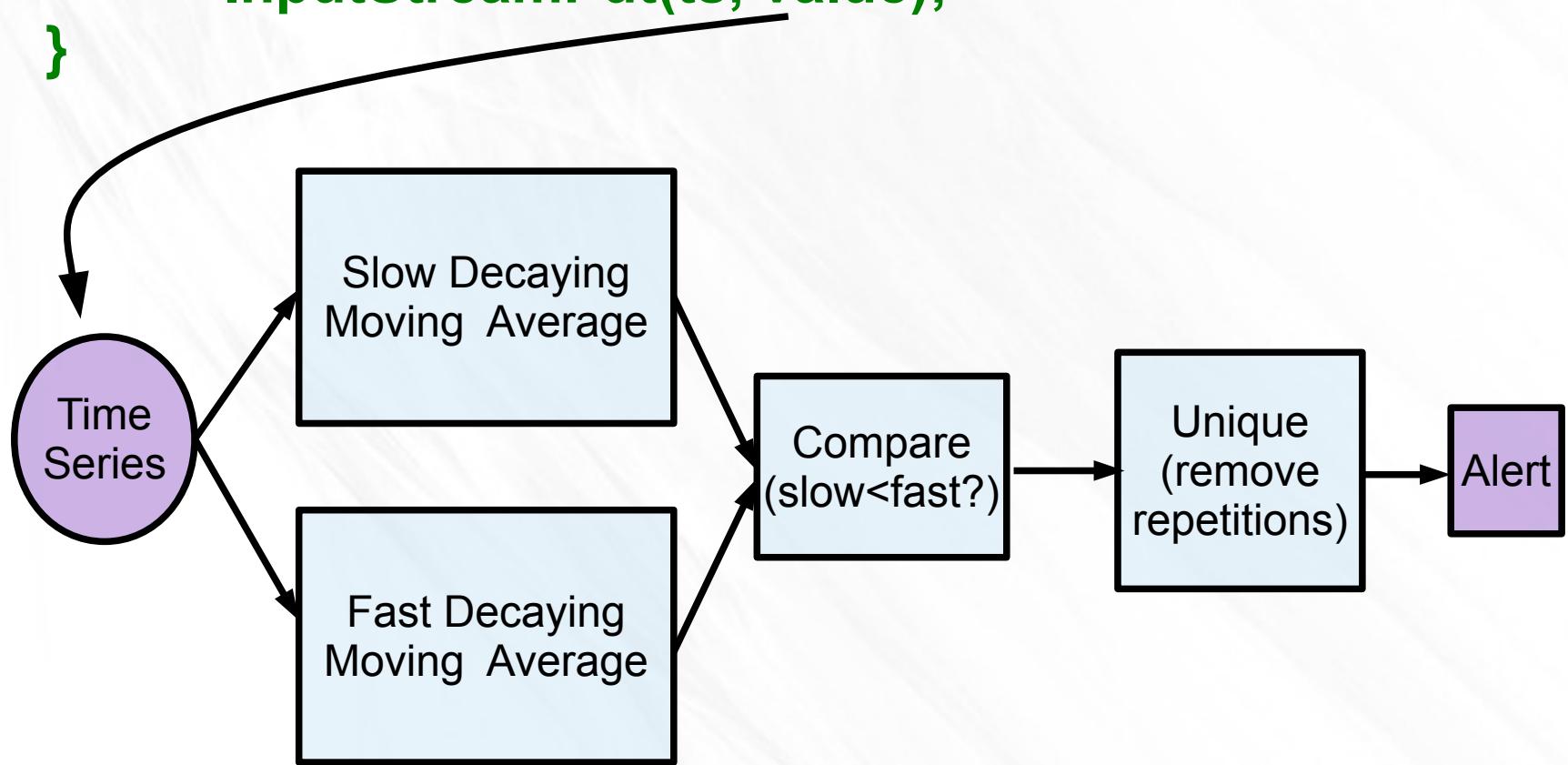
# Setup Constructs the Graph

```
Subscribe( cross_alert( unique( slow_mavg(ts) < fast_mavg(ts) ) ) );
```



# Inputs Propagate Automatically Through the Graph

```
HandleEvent(double value) {  
    InputStreamPut(ts, value);  
}
```



# User-Defined Functions

What are **Mavg**, **unique** and **cross\_alert**?

- Write a functor **F** that handles a single event
- **Streamify** it.

# cross\_alert is Streamify<cross>

```
struct cross {  
    template<class Sig>  
    struct result {  
        typedef bool type;  
    };
```

}

Boost result\_of  
protocol (not  
needed in C++11)

```
bool operator()(bool golden)  
{  
    std::cout << (golden ? “Golden” : “Death”);  
    std::cout << “ Cross” << std::endl;  
    return golden;  
}  
};
```

}

Process  
event

# unique is Streamify<unique\_func>

```
struct unique_func {  
    unique() : mFirst(true) {}  
  
    template<class Sig>  
    struct result {  
        typedef bool type;  
    };
```

Boost result\_of  
protocol (not  
needed in C++11)

```
bool Filter(bool value) const {  
    return mFirst || (value != mPrev);  
}
```

Will there be an  
output? (optional)

```
bool operator()(bool value) {  
    mFirst = false;  
    return mPrev = value;  
}
```

Value of the  
next output

```
private:  
    bool mFirst; bool mPrev;  
};
```

# How does it work?

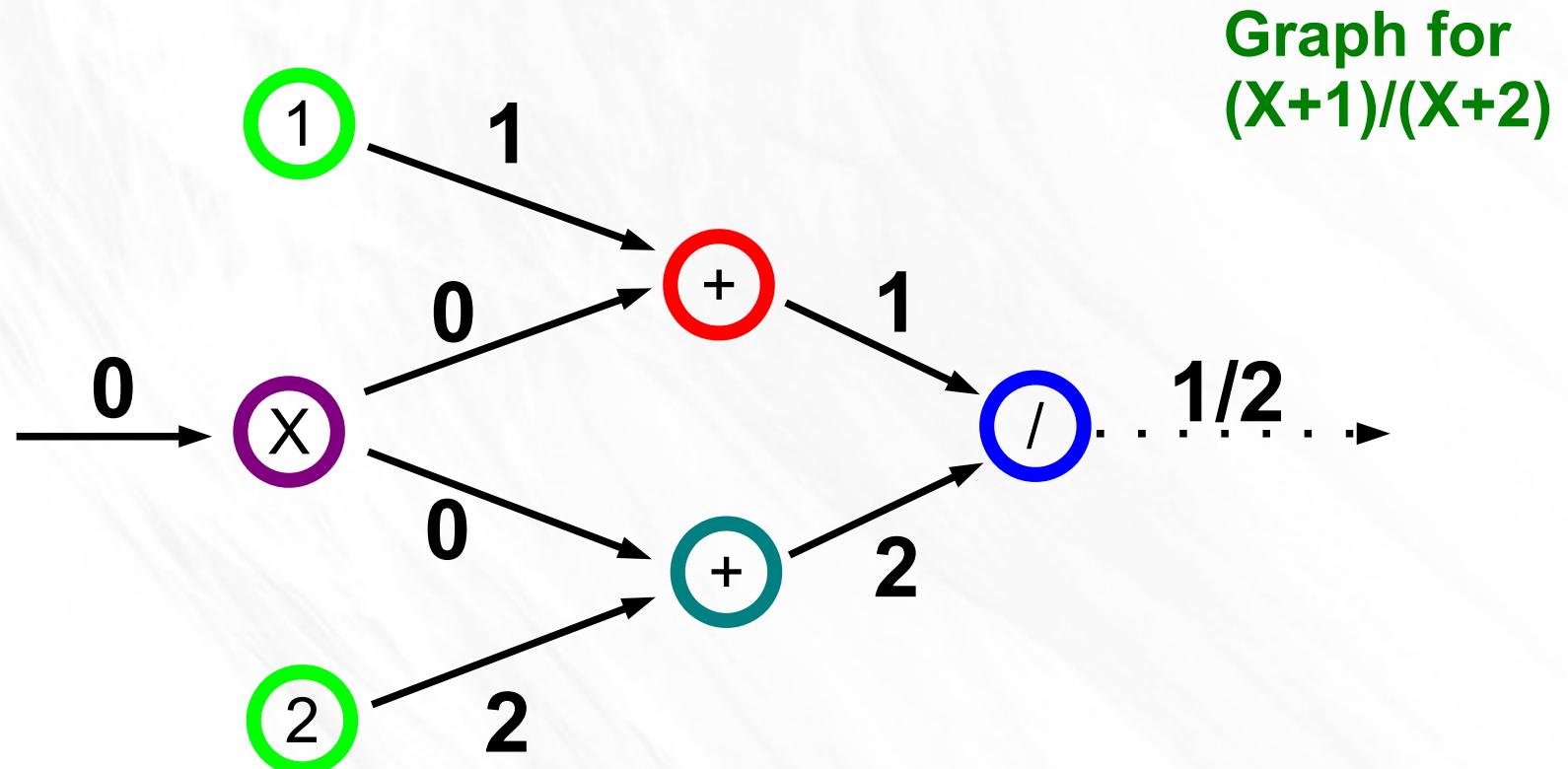
There are two things to talk about:

- The graph data structure
  - How the data propagates through it
- The `Subscribe()` function
  - How it turns expressions into a graph

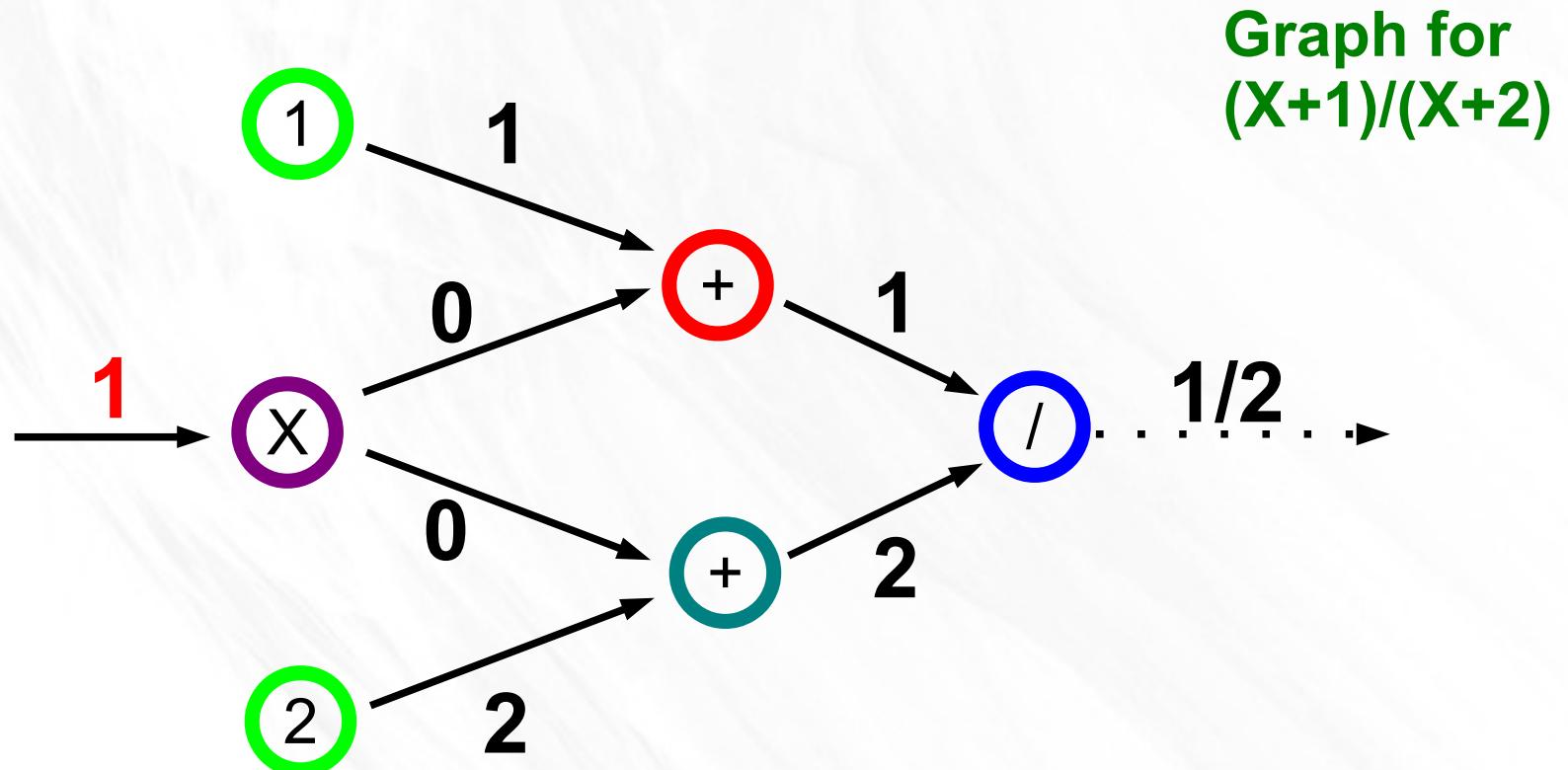
# The Streamulus Engine

- Maintains the Graph
  - Nodes have operators
  - Edges have buffers
- Propagates inputs by activating nodes in a safe order

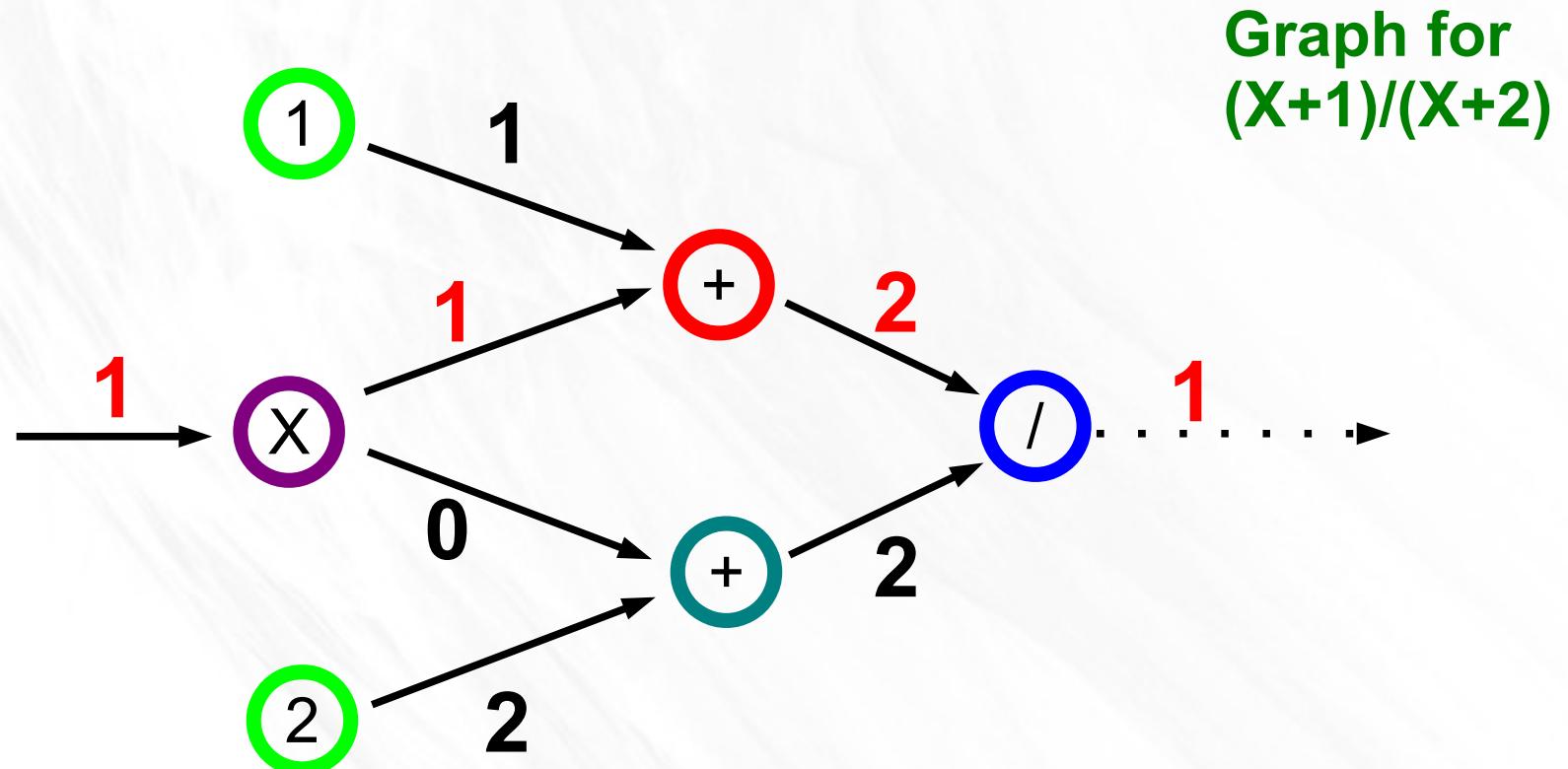
# What is a safe order?



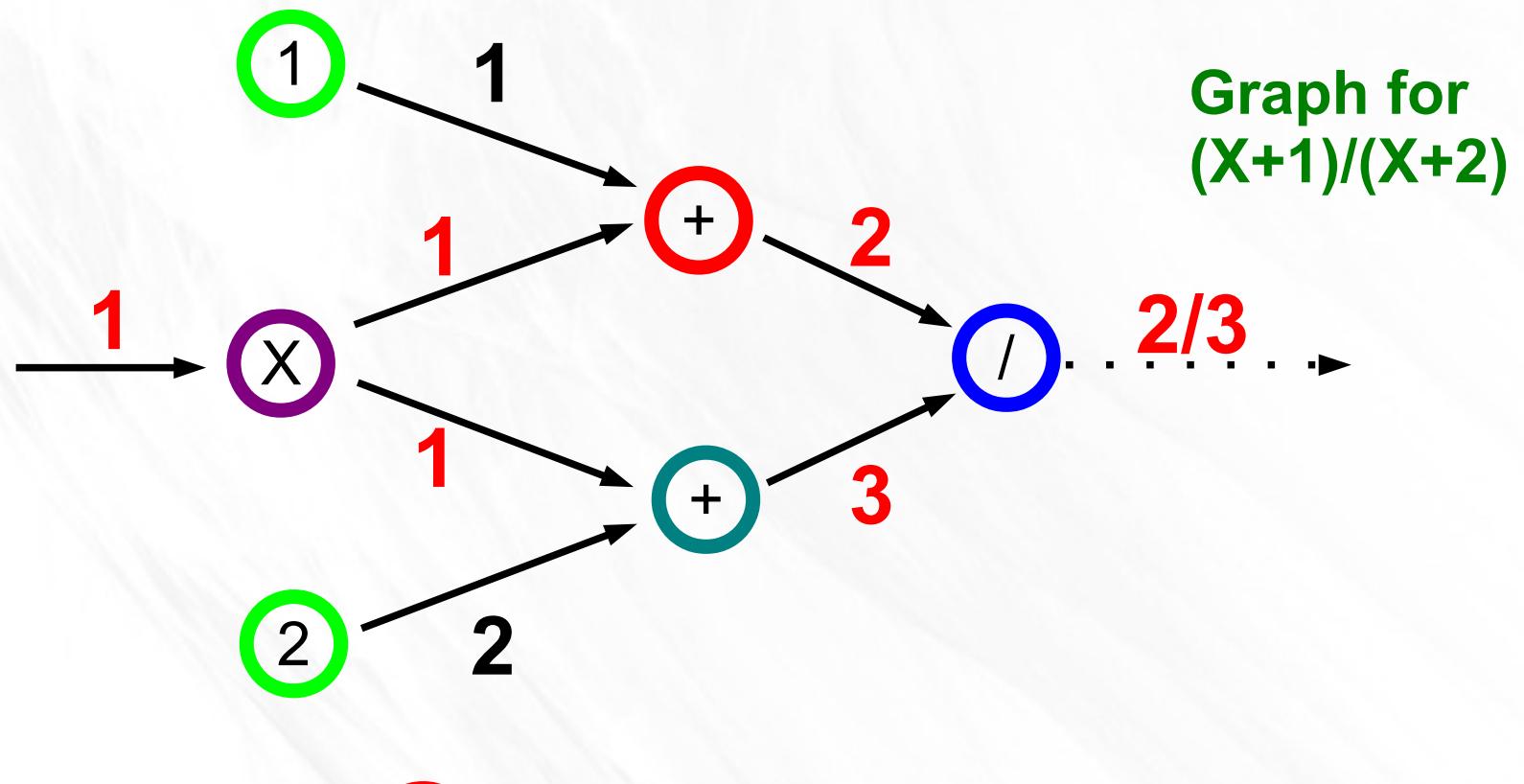
# What is a safe order?



# What is a safe order?



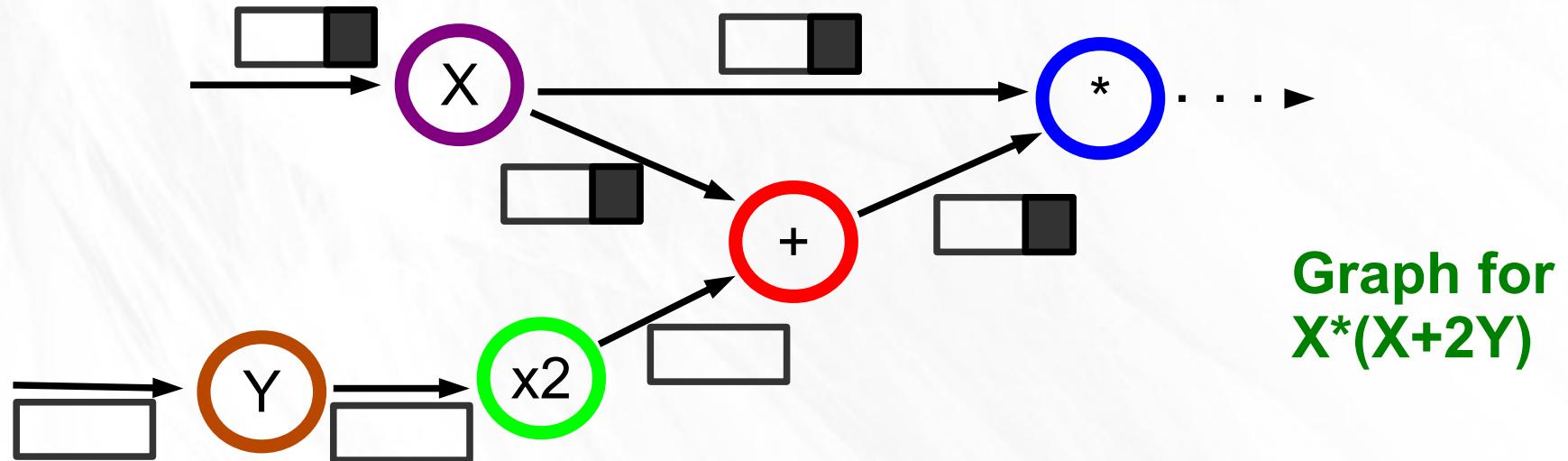
# What is a safe order?



both and should be activated before

**in other words: topological order**

# The Streamulus Data Structure



Priority Queue of Active Nodes



Priority = { TimeStamp, Index }

TimeStamp of oldest incoming data,  
Index of the node in topological order

# What's in a Node?

```
class Strop // for STReam Operator
{
    ...
    virtual bool Work()=0; // return true if emitted output
}
```

Also has *context* data members:

- Pointer to the engine
- Identifier of its node in the graph
- It's topological order index

# Streamify<f>

We had:

**unique is Streamify<unique\_func>**

Streamify takes a single-event functor (or object) and creates a strop that *does the right thing*.

You can create your own strops directly

- but for most purposes Streamify should suffice.

# InputStream

- A special kind of Strop.
- Has a `Tick(value)` function
  - Called from outside of Streamulus
  - Causes the node to emit *value* to its output

```
InputStream<double>::type ts=NewInputStream<double>("TS");
```

```
InputStreamPut(ts, value);
```



Calls ts's Tick function

# How Data Propagates

- Engine's Main Loop (single threaded):

**While ActiveNodes is not empty:**

**v = ActiveNodes.Pop()**

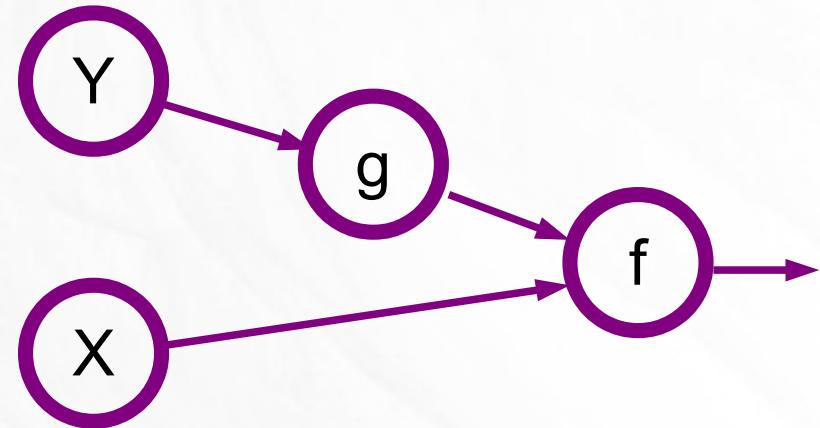
**v.Work()**

Might insert  
nodes to  
ActiveNodes

- When the queue is empty, the engine idles
  - No busy waiting
- When an input Tick()s, the engine is activated
  - Resumes its main loop

# Subscribe()

“f(x,g(y))”

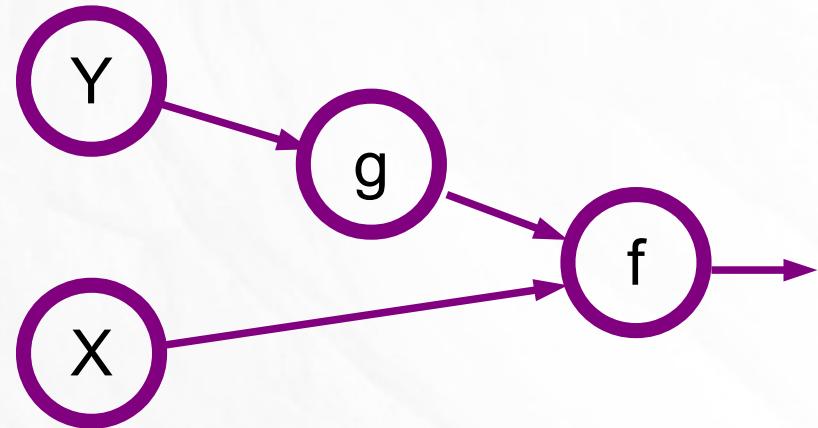


Easy. Anyone with a parser and a stack can do it.

*If all the edges carry the same type.*

# Subscribe()

“f(x,g(y))”



But what is the type of  $g(y)$

- When  $y$  is int?
- When  $y$  is a user-defined type?

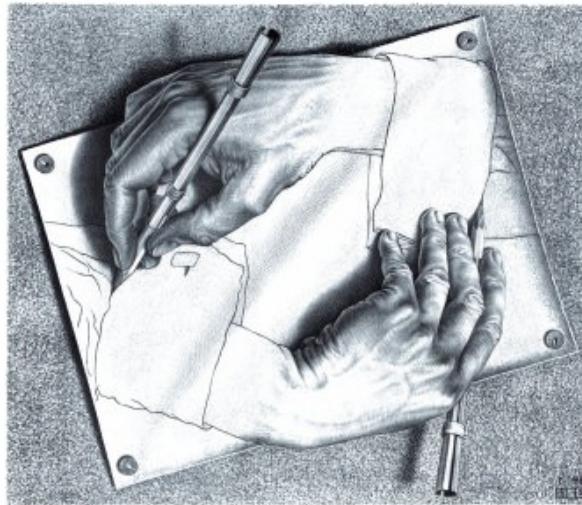
# Two Options

- Avoid the problem
  - Generic container (union, variant): waste space
  - Serialisation: waste time
  - void pointers: unsafe
- Solve the problem
  - Compute the data type of each edge
  - Allocate a buffer for that type
  - How? *C++ Template Metaprogramming*

# Metaprogramming

Writing code that generates  
or manipulates code

- Compilers
- Source code generators
- Self-modifying programs



# C++ Templates

Designed for Generic Programming

```
template<typename T>
T max(T a, T b) {
    return a > b ? a : b;
}
```

| Paradigm            | Type resolution    |
|---------------------|--------------------|
| Generic Programming | During compilation |
| Polymorphism        | At runtime         |

# C++ Template Metaprogramming

“Programming with types”

Metafunctions map types to types:

```
template<typename T>
struct VectorOfPairs {
    typedef std::vector<std::pair<T>> type;
};
```

typedef is an assignment:

```
typedef VectorOfPairs<double>::type my_vector;
```

# C++ Template Metaprogramming

Recursive metafunctions make the compiler compute stuff:

```
template<int i>
struct Factorial {
    static const int value = i * Factorial<i-1>::value;
};
```

```
struct Factorial<1> {      // base case
    static const int value = 1;
};
```

```
int five_factorial = Factorial<5>::type;
```

# C++ Template Metaprogramming

## Control flow via template specialization:

```
template<typename T>
struct IntToDouble {
    typedef T type;
};
```

```
struct IntToDouble<int> {
    typedef double type;
};
```

|  |                                     |
|--|-------------------------------------|
| <code>IntToDouble&lt;int&gt;::type</code>  | <code>// == double</code>           |
| <code>IntToDouble&lt;char&gt;::type</code> | <code>// == char (unchanged)</code> |

# C++ Template Metaprogramming

## Compile-Time Data Structures

### Linked List of Types

```
struct End {};  
  
template<typename T, typename NEXT>  
struct Node {  
    typedef T type;  
    typedef NEXT next;  
};  
  
typedef Node<int, Node<bool, Node<char, End>>> List;
```

# C++ Template Metaprogramming

Insert types to a list:

```
template<typename LIST, typename T>
struct Push {
    typedef Node<T, LIST> type;
};
```

```
typedef Push<End, int>::type L1;
typedef Push<L1, bool>::type L2;
typedef Push<L2, char>::type L3;
```

# C++ Template Metaprogramming

Insert types to a list:

```
template<typename LIST, typename T>
struct Push {
    typedef Node<T, LIST> type;
};
```

```
typedef Push<End, int>::type L1;
typedef Push<L1, bool>::type L2;
typedef Push<L2, char>::type L3;
```

# C++ Template Metaprogramming

Compute the length of a list:

```
template <typename T>
struct Size;

template<typename T, typename NEXT>
struct Size<Node<T, NEXT> > {
    static const int value = 1 + Size<NEXT>::value;
};

Template <>
struct Size<End> {
    static const int value = 0;
};
```

# Useful Boost Libraries

MPL (Aleksey Gurtovoy and David Abrahams)

- Utilities, Data Structures, Sequences, Iterators

Fusion (Joel de Guzman, Dan Marsden, Tobias Schwinger)

- Heterogenous containers

```
fusion::vector<int, char, bool> my_vector;
```

Proto (Eric Niebler + Joel Falcou, Christophe Henry)

- A framework for building Domain-Specific Embedded Languages in C++

# Using Proto

- Define a grammar
  - Which expression are valid?
- Define transformations
  - What should become of each sub-expression?
- Activate the grammar on an expression

# Operator Overloading in C++

```
class MyType { ... };  
class YourType { ... };  
class OurType { ... };
```

```
OurType operator+(MyType mine, YourType yours) {  
    return .... ; // Compute an OurType from the inputs  
}
```

```
MyType mine;  
YourType yours;  
OurType ours = mine + yours;
```

# Expression → Tree

Proto defines a static expression type

**proto::expr**

and overloads all operators for it.

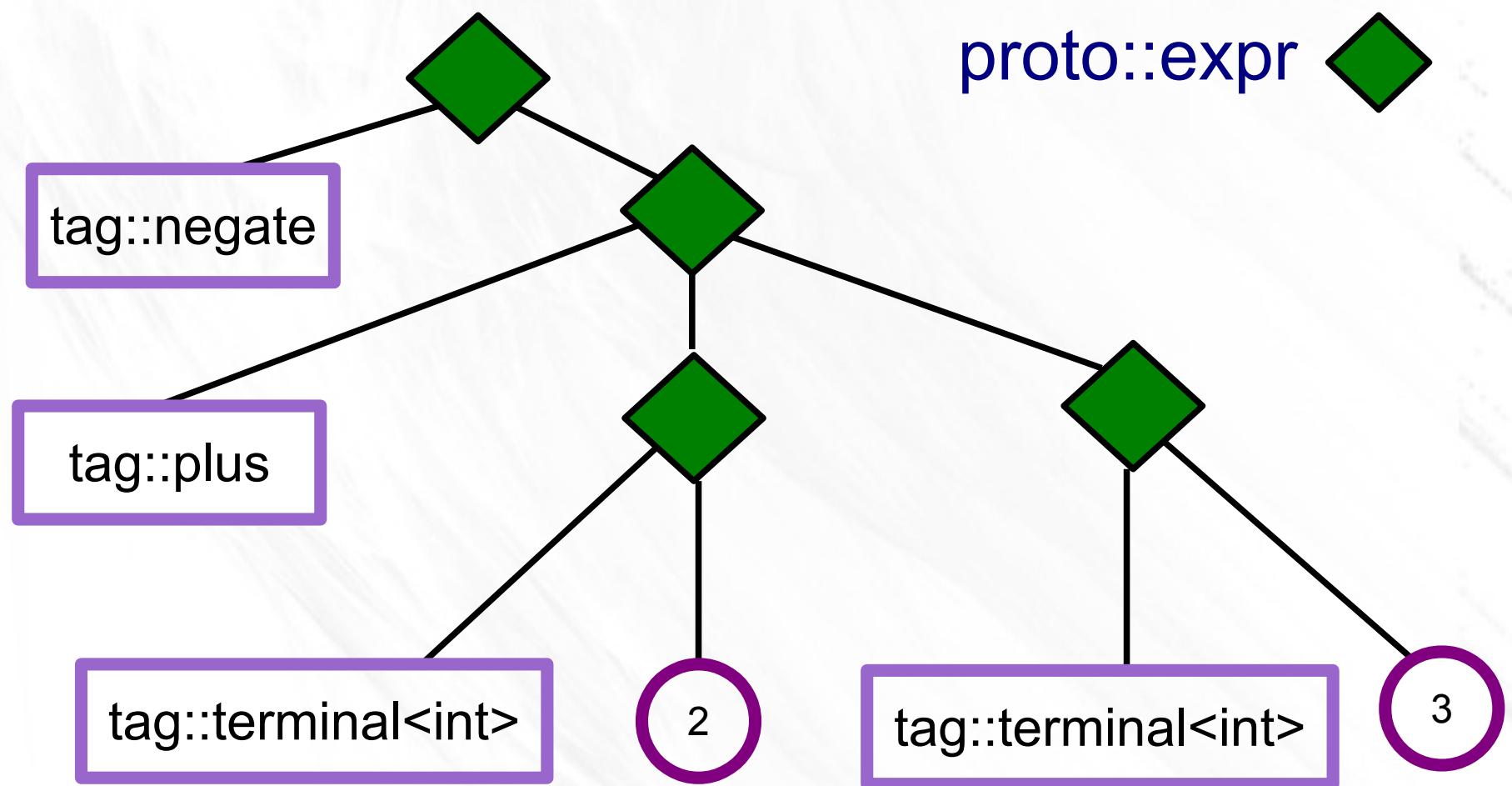
For example:

**expr1 - expr2**

returns something like

**proto::expr<tag::minus, list<expr1,expr2>,2>**

# Expression Tree for -(2+3)



# The proto::expr Type

```
template<typename Tag,  
        typename Args,  
        long Arity = Args::arity >  
struct expr;
```

```
template< typename Tag, typename Args >
struct expr< Tag, Args, 1 > {           // unary expression
    typedef typename Args::child0 proto_child0;
    proto_child0 child0;
    // ...
};

...
// specialisations for other arities
```

# Creating Proto Expressions

- Define proto terminals

```
proto::terminal<int>::type x = {12};
```

- x is a proto expression
  - So is any expression involving x

```
~((x+12)/x & 0xff)
```

# Function call expressions

**proto::expr<tag::function, Args, ... >**

- First arg is a proto::terminal<func>::type
  - Identifies the function
- Then the function's arguments
  - Arbitrary proto::expr's

# A Proto Grammar

## Recursive definition of valid expressions

```
struct arithmetic
: proto::or_<
    proto::plus          <arithmetic, arithmetic>
    , proto::minus        <arithmetic, arithmetic>
    , proto::multiplies   <arithmetic, arithmetic>
    , proto::divides      <arithmetic, arithmetic>
    , proto::terminal     <proto::_, anything>
> {};
```

# A Grammar With Transforms

```
struct arithmetic
: proto::or_<
  proto::when<
    proto::plus<arithmetic, arithmetic>,
    Plus(arithmetic(proto::_left),
          arithmetic(proto::_right))>
  , proto::when<
    proto::minus<arithmetic, arithmetic>,
    Minus(arithmetic(proto::_left),
          arithmetic(proto::_right))>
  ...
  , proto::when<
    proto::terminal  <proto::_>,
    proto::_value>
> {};
```

# A Transform

A functor that publishes its return type as `result_type`

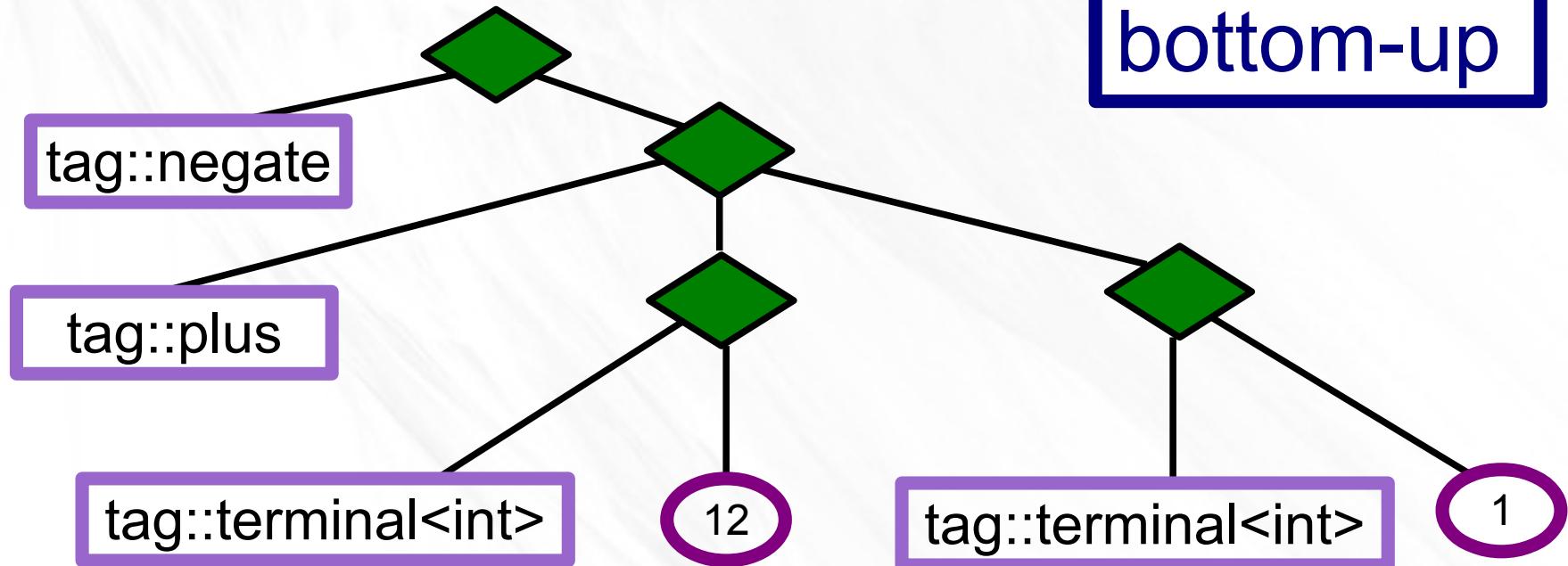
```
struct Plus : proto::callable
{
    typedef int result_type;

    int operator()(int left, int right) {
        return left+right;
    }
};
```

# Invoking a Grammar

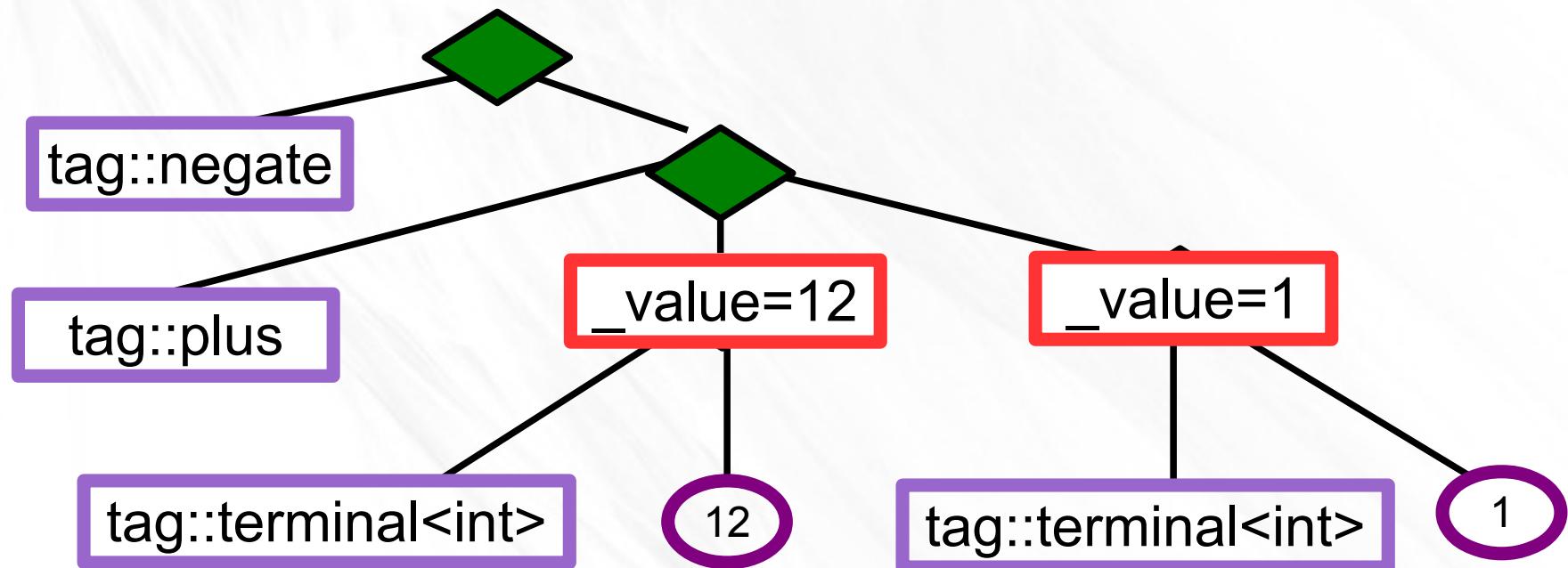
```
proto::terminal<int> x = {12};  
int result = arithmetic() ( -(x+1) );
```

Apply the  
transforms  
bottom-up



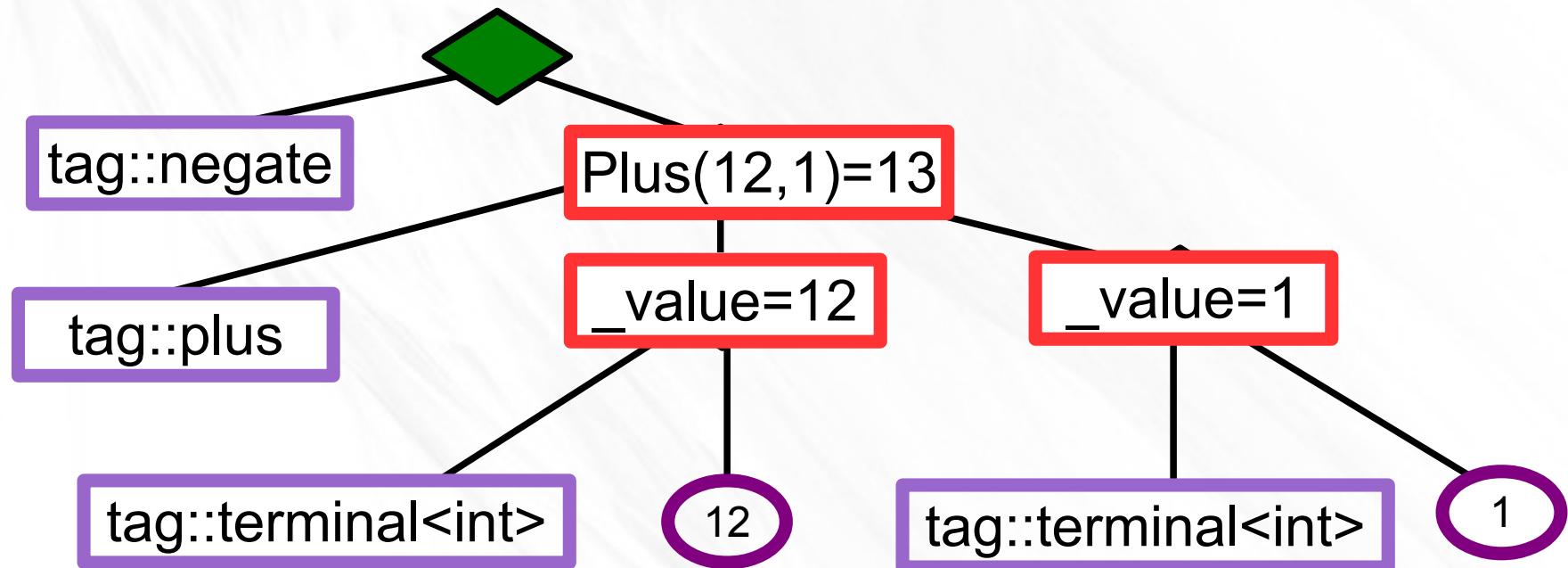
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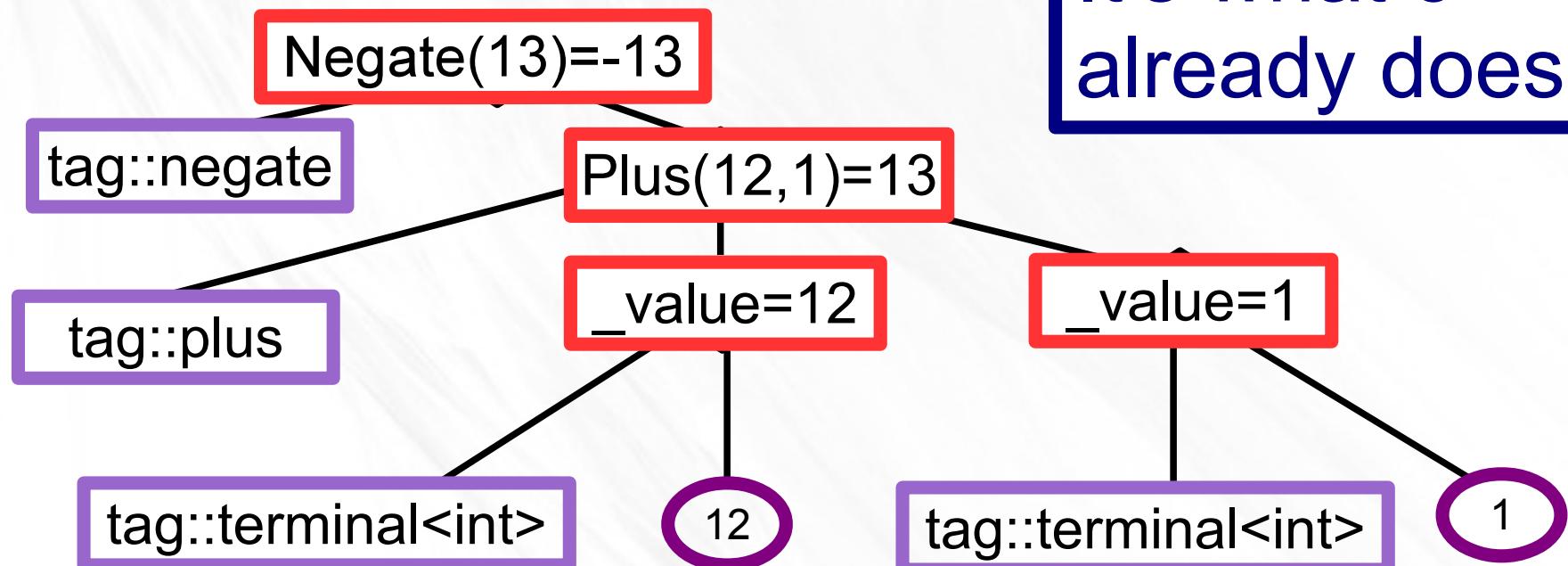
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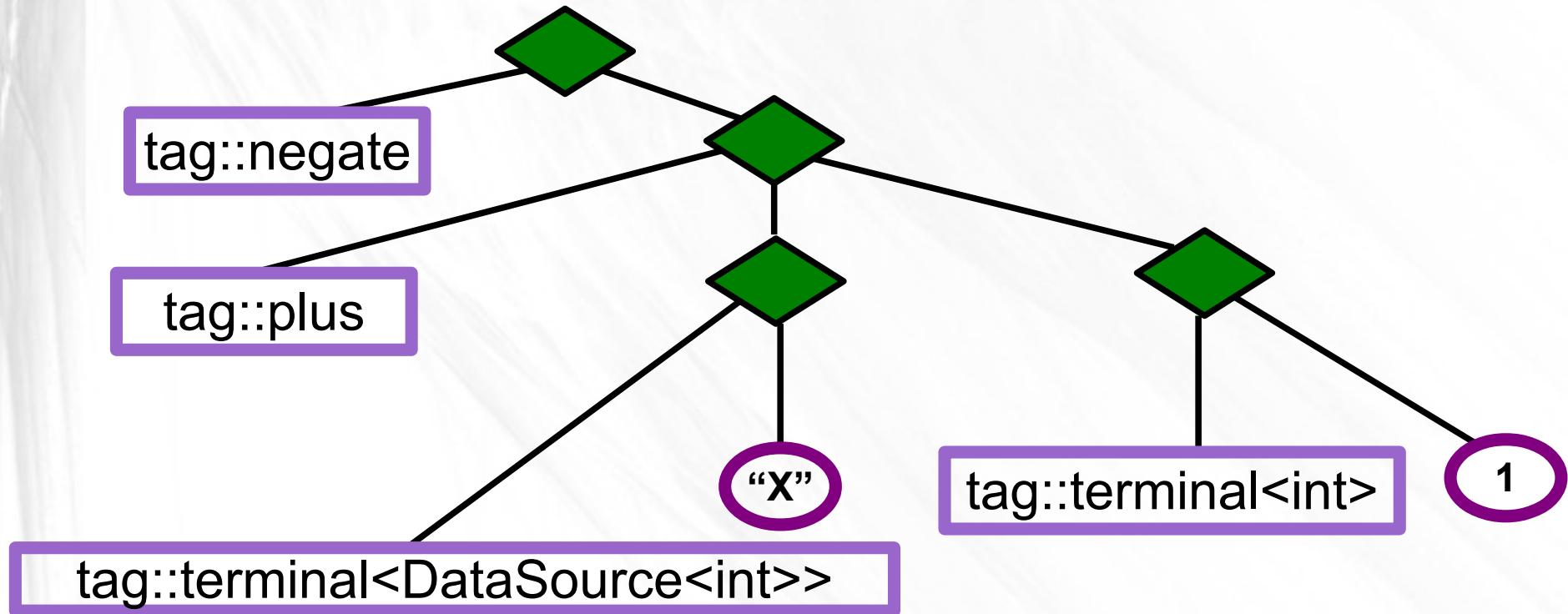
This example is  
not very useful.  
It's what C++  
already does.

# The Streamulus Grammar

- Identifies all operators, as well as user-defined functions.
- Each transform
  - Creates a strop for the node's operator/func
  - Inserts it to the graph
  - Connects it to child-nodes' strops
    - Which were created recursively
  - Returns a pointer to the new strop

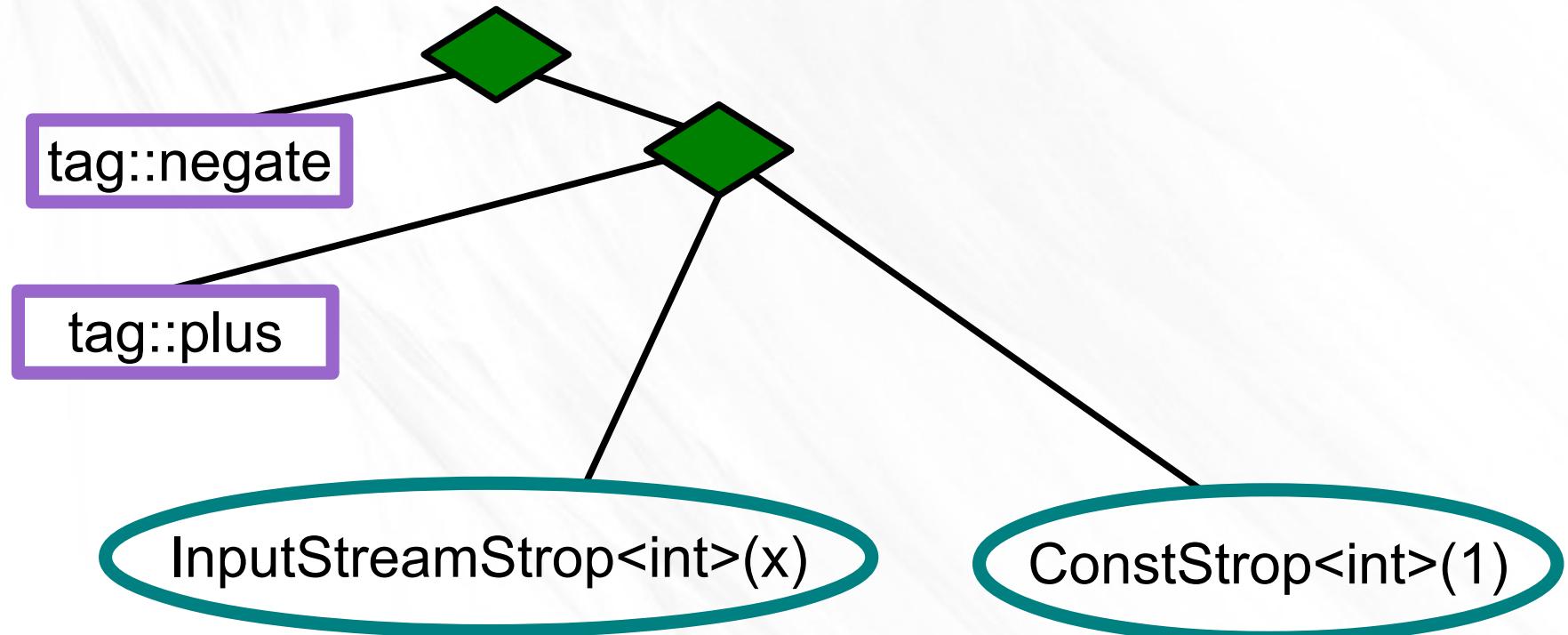
# Subscribe()

```
InputStream<int>::type x = NewInputStream<int>("X");
Subscribe ( -(x+1) );
```



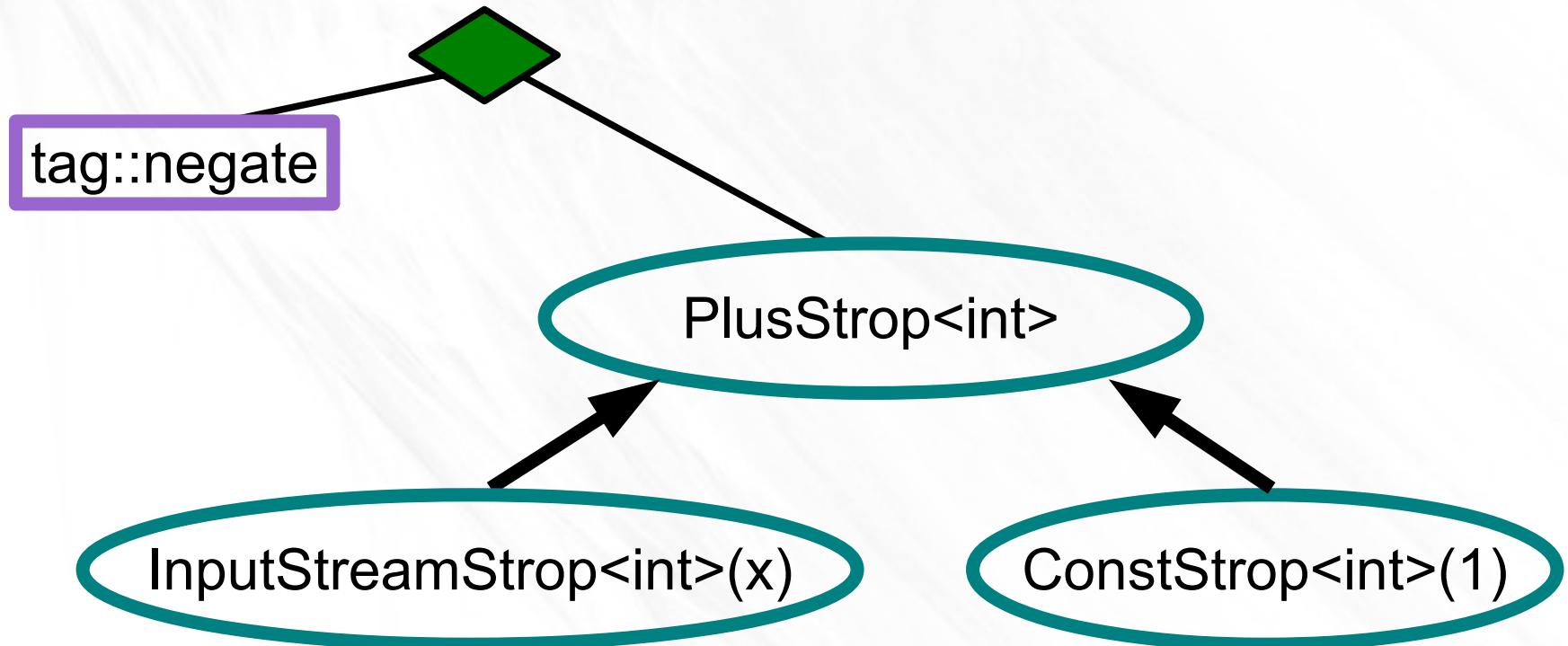
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InputStream<int>::type x = NewInputStream<int>("X");
Subscribe ( -(x+1) );
```



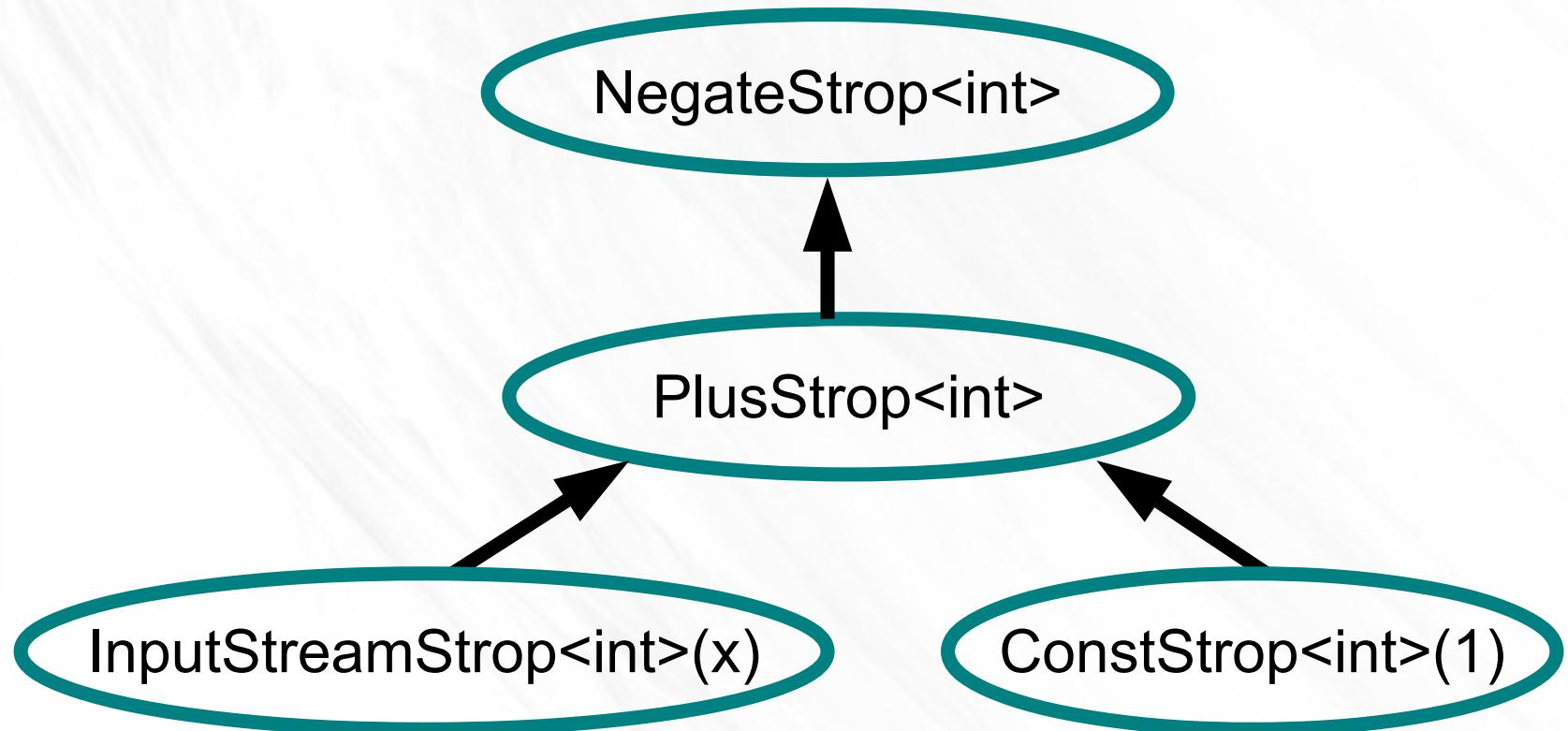
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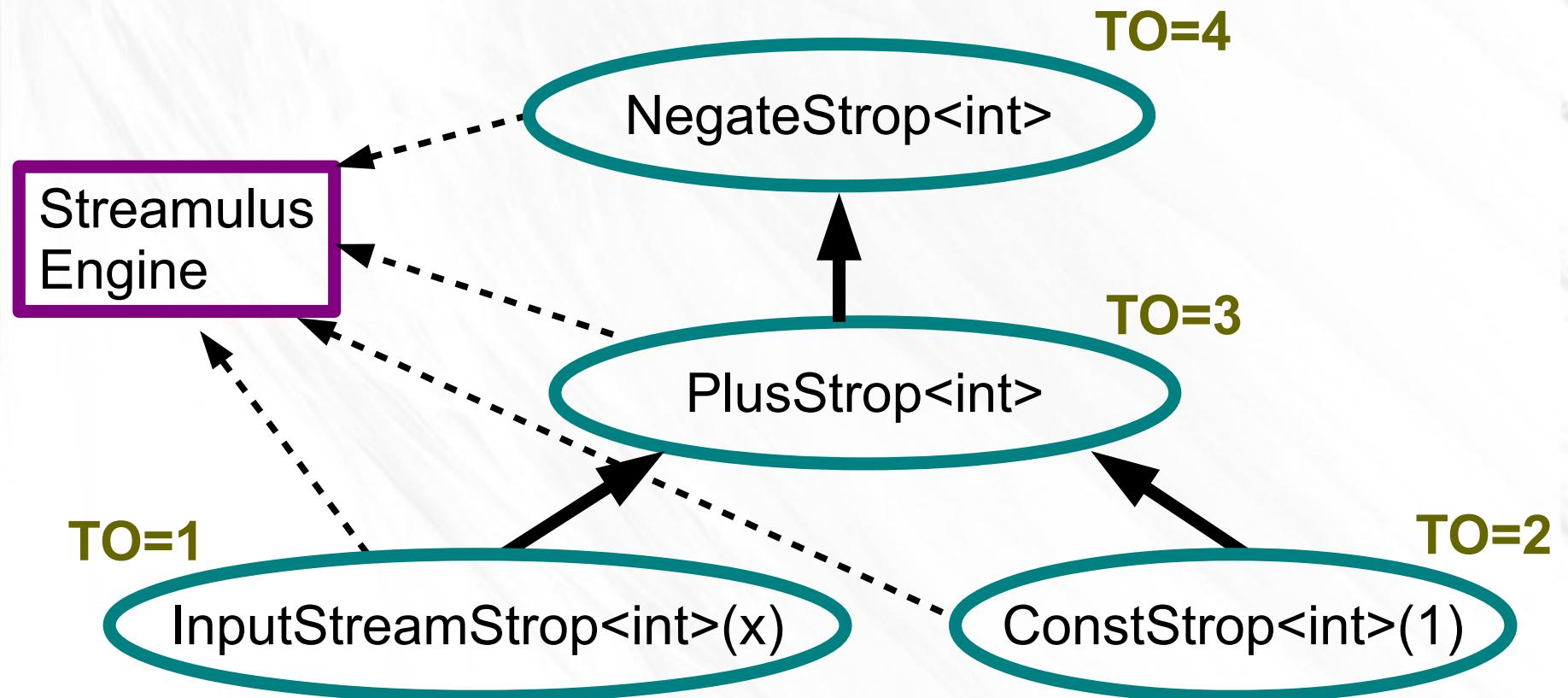
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```
InputStream<int>::type x = NewInputStream<int>("X");
Subscribe ( -(x+1) );
```



# Subscribe()

**Finally: Compute topological order  
Link the nodes to the engine**



# Status

- First Release - soon
- User Manual – eventually
  - Nagging will help
- There's a lot to do
  - Improve it (e.g., multi-core version)
  - Apply it
- It's open-source, join in.

# Links

- [www.streamulus.com](http://www.streamulus.com)
  - Link to github from there
- Follow @streamulus on twitter
  - Infrequent notifications (releases, news, etc)