

# Applicative invariants for Lustre

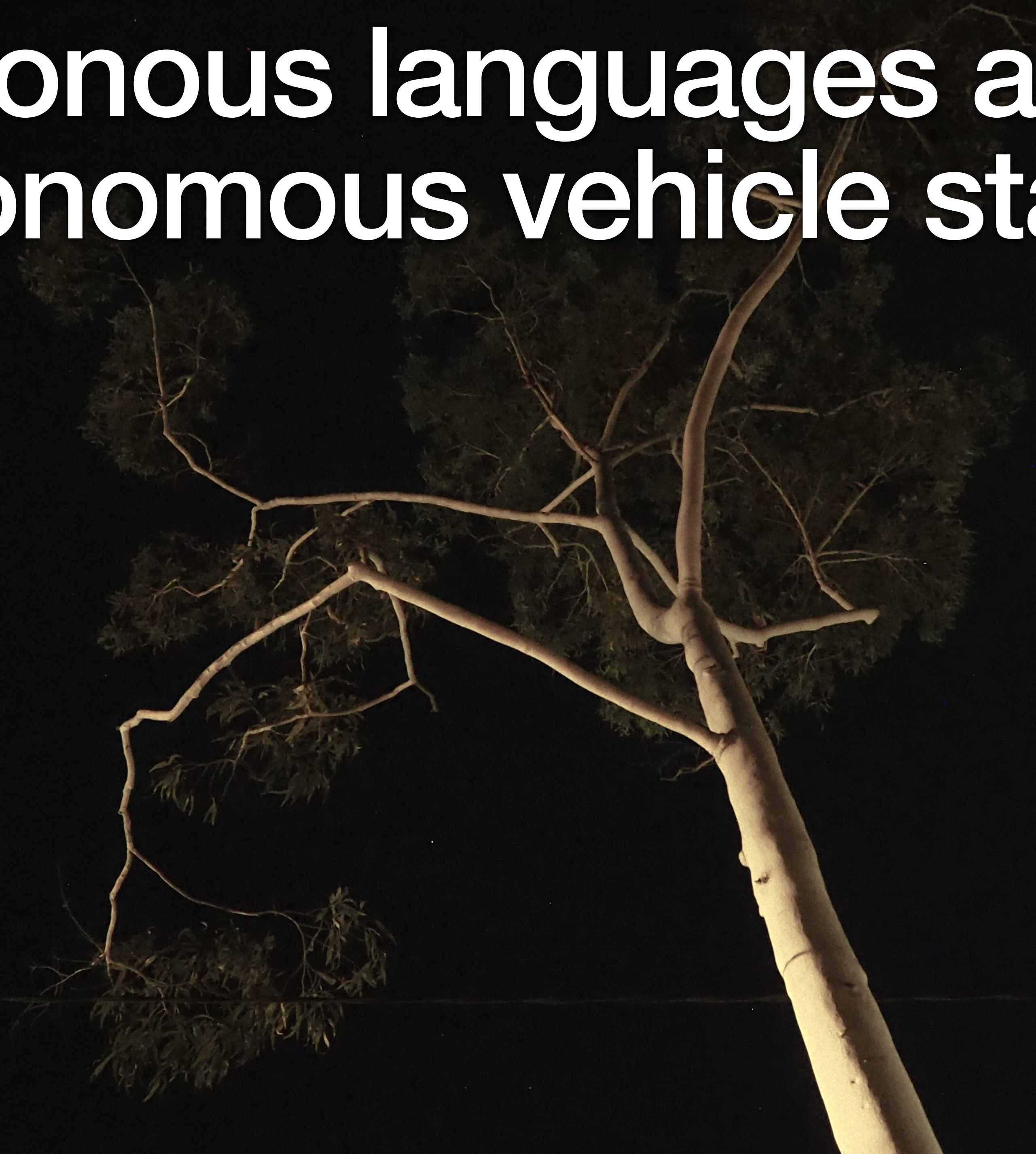
Amos Robinson, international man of leisure



Chestnut-backed chickadee



# Synchronous languages at an autonomous vehicle startup





# Happy days

- Implemented controllers, drivers, state machines in Lustre
- Proved some reassuring properties
- Ran them in the car
- Worked first time (more or less)





# Success with Kind2

Kind2 is generally great:

- Solid for small programs
- Actively developed
- Friendly, helpful developers





# Sadness with Kind2

But as our programs got bigger...

- Hard to predict whether true properties can be proved
- Modifications difficult, could require serious restructuring to keep proofs
- Spurious failures in CI make us look bad



# What we couldn't prove reliably





```
node lastn(const n: int; pred: bool)
returns (out: bool)
let
    count = if pred then (0 -> pre count) + 1 else 0;
    out    = count >= n;
tel
```



```
node lastn(const n: int; pred: bool)
returns (out: bool)
let
    count = if pred then (0 -> pre count) + 1 else 0;
    out    = count >= n;
tel
```

```
function delta_valid(input1: int, input2: int)
returns (ok: bool)
let
    ok = abs(input1 - input2) <= DELTA_MAX
tel
```



```
node signal_valid(input: int)
returns (ok: bool)
(*@contract
  guarantee
    not lastn(10, delta_valid(input, 0 -> pre input)) =>
    not ok;
  ...
*)
```



```
node signal_valid(input: int)
returns (ok: bool)
(*@contract
  guarantee
    not lastn(10, delta_valid(input, 0 -> pre input)) =>
    not ok;
  ...
*)
```

```
type SAMPLE = { adc: int; ... }
const SAMPLE_ZERO = { adc = 0; ... }
```

```
node main(sample: SAMPLE)
returns (engaged: bool; ...)
(*@contract
  guarantee
    not lastn(10, delta_valid(sample.adc, (SAMPLE_ZERO -> pre sample).adc)) =>
    not engaged;
  *)
let
  engaged = signal_valid(sample.adc);
  ...
tel
```



# Pen-and-paper proof





```
assume
```

```
  signal_valid.guarantee[input := sample.adc, ok := engaged]:  
    not lastn(10, delta_valid(sample.adc, 0 -> pre sample.adc)) =>  
    not engaged;
```

```
engaged = signal_valid(sample.adc);
```



```
assume
```

```
  signal_valid.guarantee[input := sample.adc, ok := engaged]:  
    not lastn(10, delta_valid(sample.adc, 0 -> pre sample.adc)) =>  
    not engaged;
```

```
engaged = signal_valid(sample.adc);
```

```
SAMPLE_ZERO = { adc = 0; ... };
```



```
assume
  signal_valid.guarantee[input := sample.adc, ok := engaged]:
    not lastn(10, delta_valid(sample.adc, 0 -> pre sample.adc)) =>
      not engaged;
```

```
engaged = signal_valid(sample.adc);
```

```
SAMPLE_ZERO = { adc = 0; ... };
```

---

```
show main.guarantee:
  not lastn(10, delta_valid(sample.adc, (SAMPLE_ZERO -> pre sample).adc)) =>
    not engaged;
```



```
assume
```

```
  signal_valid.guarantee[input := sample.adc, ok := engaged]:  
    not lastn(10, delta_valid(sample.adc, 0 -> pre sample.adc)) =>  
    not engaged;
```

```
  engaged = signal_valid(sample.adc);
```

```
  SAMPLE_ZERO = { adc = 0; ... };
```

```
-----  
show main.guarantee:
```

```
  not lastn(10, delta_valid(sample.adc, (SAMPLE_ZERO -> pre sample).adc)) =>  
  not engaged;
```

```
rewrite prim_distributes_arrow: forall stream e e', pure function f.  
  f (e -> e') = (f e) -> (f e')
```



```
assume
  signal_valid.guarantee[input := sample.adc, ok := engaged]:
    not lastn(10, delta_valid(sample.adc, 0 -> pre sample.adc)) =>
    not engaged;
```

```
engaged = signal_valid(sample.adc);
```

```
SAMPLE_ZERO = { adc = 0; ... };
```

---

```
show main.guarantee:
  not lastn(10, delta_valid(sample.adc, SAMPLE_ZERO.adc -> (pre sample).adc)) =>
  not engaged;
```

```
rewrite prim_distributes_arrow: forall stream e e', pure function f.
  f (e -> e') = (f e) -> (f e')
```



```
assume
```

```
  signal_valid.guarantee[input := sample.adc, ok := engaged]:  
    not lastn(10, delta_valid(sample.adc, 0 -> pre sample.adc)) =>  
    not engaged;
```

```
  engaged = signal_valid(sample.adc);
```

```
  SAMPLE_ZERO = { adc = 0; ... };
```

```
-----  
show main.guarantee:
```

```
  not lastn(10, delta_valid(sample.adc, SAMPLE_ZERO.adc -> (pre sample).adc)) =>  
  not engaged;
```

```
rewrite prim_distributes_pre: forall stream e, pure function f.  
  f (pre e) = pre (f e)
```



```
assume
  signal_valid.guarantee[input := sample.adc, ok := engaged]:
    not lastn(10, delta_valid(sample.adc, 0 -> pre sample.adc)) =>
      not engaged;
```

```
engaged = signal_valid(sample.adc);
```

```
SAMPLE_ZERO = { adc = 0; ... };
```

---

```
show main.guarantee:
  not lastn(10, delta_valid(sample.adc, SAMPLE_ZERO.adc -> pre sample.adc)) =>
    not engaged;
```

```
rewrite prim_distributes_pre: forall stream e, pure function f.
  f (pre e) = pre (f e)
```



```
assume
  signal_valid.guarantee[input := sample.adc, ok := engaged]:
    not lastn(10, delta_valid(sample.adc, 0 -> pre sample.adc)) =>
      not engaged;
```

```
engaged = signal_valid(sample.adc);
```

```
SAMPLE_ZERO = { adc = 0; ... };
```

---

```
show main.guarantee:
  not lastn(10, delta_valid(sample.adc, 0 -> pre sample.adc)) =>
    not engaged;
```

```
unfold SAMPLE_ZERO, constant propagation, etc
```



# Transition system proof





```
node delta_valid_sample(sample: SAMPLE)
returns (delta_main: bool, delta_signal: bool)
let
  delta_main    = delta_valid(sample.adc, (SAMPLE_ZERO -> pre sample).adc);
  delta_signal  = delta_valid(sample.adc, 0 -> pre sample.adc);
tel
```



```
node delta_valid_sample(sample: SAMPLE)
returns (delta_main: bool, delta_signal: bool)
let
  delta_main    = delta_valid(sample.adc, (SAMPLE_ZERO -> pre sample).adc);
  delta_signal  = delta_valid(sample.adc, 0 -> pre sample.adc);
tel
```

==>

```
lts delta_valid_sample:
  type state = { init:      bool;
                delay_main: SAMPLE;
                delay_signal: int; };
```

```
  init(s: state): bool =
    s.init == true;
```

```
  step(s: state, sample: SAMPLE): (state * bool * bool) =
```

```
    let
      delay_main    = if s.init then SAMPLE_ZERO else s.delay_main
      delta_main    = delta_valid(sample.adc, delay_main.adc)
```

```
      delay_signal  = if s.init then 0 else s.delay_signal
      delta_signal  = delta_valid(sample.adc, delay_signal)
```

```
    in
      ({ init      = false;
        delay_main = sample;
        delay_signal = sample.adc },
        delta_main, delta_signal)
```



```
node delta_valid_sample(sample: SAMPLE)
returns (delta_main: bool, delta_signal: bool)
let
  delta_main    = delta_valid(sample.adc, (SAMPLE_ZERO -> pre sample).adc);
  delta_signal  = delta_valid(sample.adc, 0 -> pre sample.adc);
tel
```

==>

```
lts delta_valid_sample:
  type state = { init: bool;
                delay_main: SAMPLE;
                delay_signal: int; };
```

```
  init(s: state): bool =
    s.init == true;
```

```
  step(s: state, sample: SAMPLE): (state * bool * bool) =
```

```
    let
      delay_main      = if s.init then SAMPLE_ZERO else s.delay_main
      delta_main      = delta_valid(sample.adc, delay_main.adc)
```

```
      delay_signal    = if s.init then 0 else s.delay_signal
      delta_signal    = delta_valid(sample.adc, delay_signal)
```

```
    in
      ({ init          = false;
        delay_main     = sample;
        delay_signal   = sample.adc },
        delta_main, delta_signal)
```



```
node delta_valid_last2(delta_ok: bool)
returns (last_main: bool, last_signal: bool)
let
  last_main = lastn(10, delta_ok);
  last_signal = lastn(10, delta_ok);
```

```
tel
```



```
node delta_valid_last2(delta_ok: bool)
returns (last_main: bool, last_signal: bool)
let
  last_main    = lastn(10, delta_ok);
  last_signal  = lastn(10, delta_ok);
```

```
tel
```

```
==>
```

```
lts delta_valid_last2:
  type state = { last_main:    lastn.state;
                 last_signal: lastn.state; };
```

```
  init(s: state): bool =
    lastn.init(s.last_main) and lastn.init(s.last_signal);
```

```
  step(s: state, delta_ok: bool): (state * bool * bool) =
    let
      (state_last_main', last_main)    = lastn.step(s.last_main,    10, delta_ok)
      (state_last_signal', last_signal) = lastn.step(s.last_signal, 10, delta_ok)
    in
      ({ init          = false;
        last_main     = state_last_main';
        last_signal   = state_last_signal' }, last_main, last_signal)
```



```
node delta_valid_last2(delta_ok: bool)
returns (last_main: bool, last_signal: bool)
let
  last_main    = lastn(10, delta_ok);
  last_signal  = lastn(10, delta_ok);
```

```
tel
```

```
==>
```

```
lts delta_valid_last2:
  type state = { last_main:    lastn.state;
                 last_signal: lastn.state; };
```

```
  init(s: state): bool =
    lastn.init(s.last_main) and lastn.init(s.last_signal);
```

```
  step(s: state, delta_ok: bool): (state * bool * bool) =
    let
      (state_last_main', last_main)    = lastn.step(s.last_main,    10, delta_ok)
      (state_last_signal', last_signal) = lastn.step(s.last_signal, 10, delta_ok)
    in
      ({ init          = false;
        last_main     = state_last_main';
        last_signal   = state_last_signal' }, last_main, last_signal)
      --%PROPERTY state_last_main' == state_last_signal'
```



```
node delta_valid_last2(delta_ok: bool)
returns (last_main: bool, last_signal: bool)
let
  last_main = lastn(10, delta_ok);
  last_signal = lastn(10, delta_ok);
  --%PROPERTY ??? = ???;
tel
```

==>

```
lts delta_valid_last2:
  type state = { last_main: lastn.state;
                 last_signal: lastn.state; };
```

```
  init(s: state): bool =
    lastn.init(s.last_main) and lastn.init(s.last_signal);
```

```
  step(s: state, delta_ok: bool): (state * bool * bool) =
    let
      (state_last_main', last_main) = lastn.step(s.last_main, 10, delta_ok)
      (state_last_signal', last_signal) = lastn.step(s.last_signal, 10, delta_ok)
    in
      ({ init = false;
        last_main = state_last_main';
        last_signal = state_last_signal' }, last_main, last_signal)
      --%PROPERTY state_last_main' == state_last_signal'
```

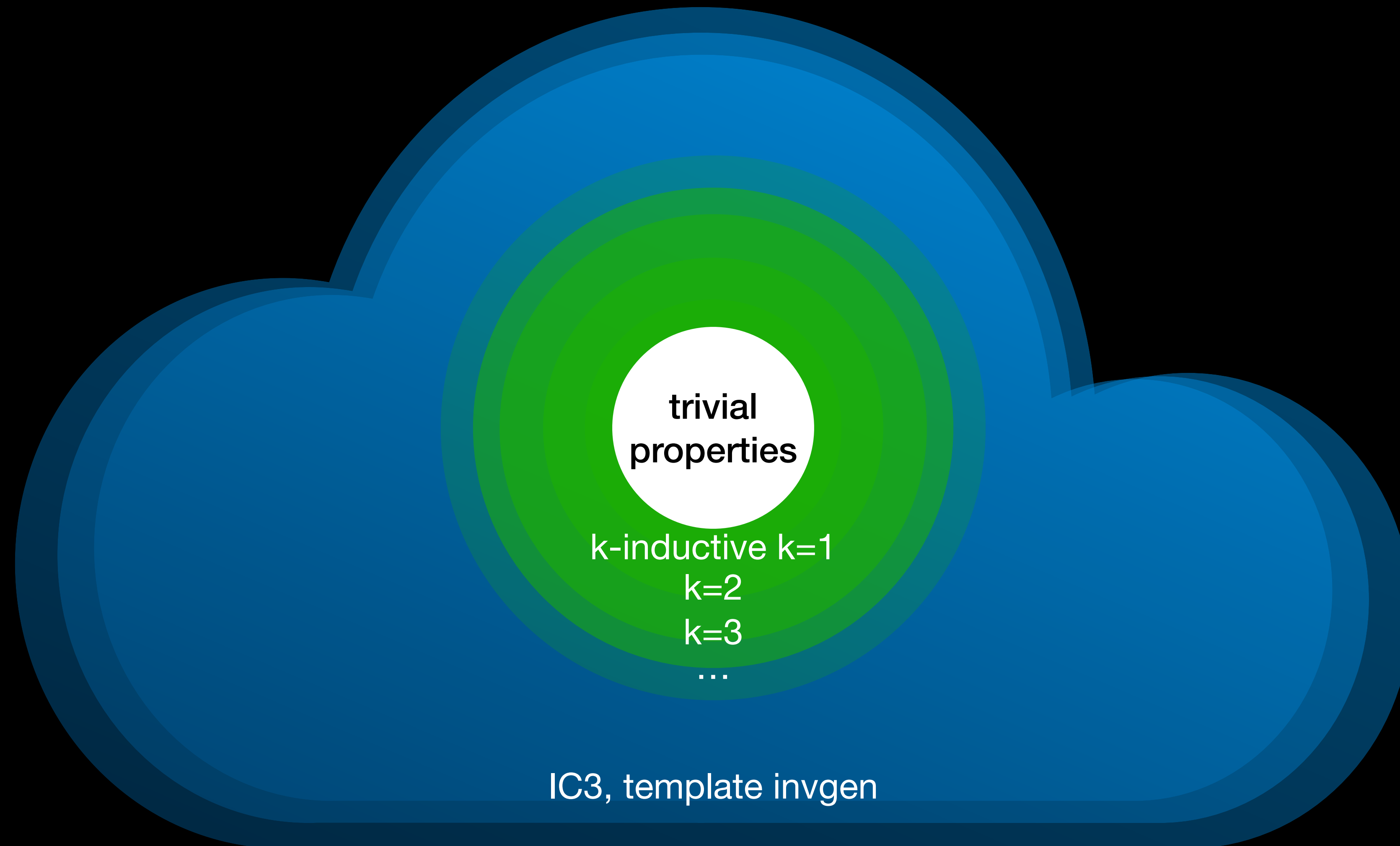


# Two problems

- "obvious" invariants aren't obvious on the translated system
- we can't state the invariant, even though we know it!

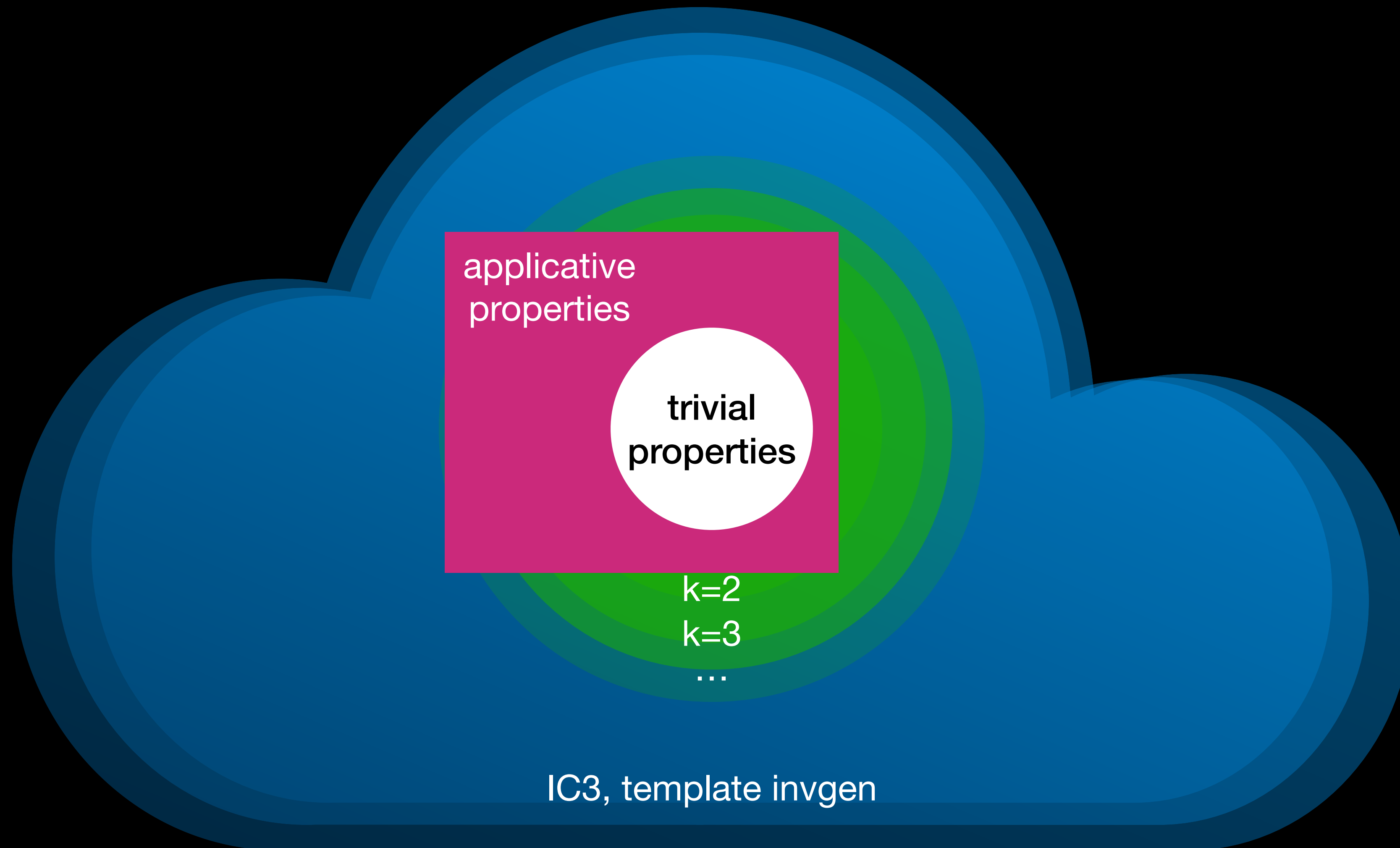


# What we can prove





# What we can prove - proposed class





# Invariant extraction with e-graphs

Idea:

- convert node to equivalence graph, instantiating any subnodes
- apply the applicative rewrites
- extract the equalities we learn as invariants



```
node signal_valid(input: int)
(*@contract guarantee not last.out => not ok; *)
  ok          : bool;
  pre_input   = pre input;
  del_input   = 0 -> pre_input;
  subnode last = lastn(10, delta_valid(input, del_input))
```

```
node main(sample: SAMPLE)
(*@contract guarantee not last.out => not engaged; *)
  sample_adc   = sample.adc;
  pre_sample   = pre sample;
  del_sample   = SAMPLE_ZERO -> pre_sample;
  del_sample_adc = del_sample.adc;
  subnode valid = signal_valid(sample_adc);
  subnode last  = lastn(10, delta_valid(sample_adc, del_sample_adc))
  engaged      = valid.ok;
```



```
-- subnode valid = signal_valid(sample.adc)
-- guarantee not valid.last.out => not valid.ok;
  valid.pre_input = pre sample_adc;
  valid.del_input = 0 -> valid.pre_input;
  valid.last.out  = lastn(10, delta_valid(sample_adc, valid.del_input));

-- node main(sample)
-- guarantee not last.out => not engaged;
  sample_adc      = sample.adc;
  pre_sample      = pre sample;

  del_sample      = SAMPLE_ZERO -> pre_sample;
  del_sample_adc  = del_sample.adc;

  last.out        = lastn(10, delta_valid(sample_adc, del_sample_adc));
  engaged         = valid.ok;
```



```
-- subnode valid = signal_valid(sample.adc)
-- guarantee not valid.last.out => not valid.ok;
  valid.pre_input = pre sample_adc;
  valid.del_input = 0 -> valid.pre_input;
  valid.last.out  = lastn(10, delta_valid(sample_adc, valid.del_input));
```

```
-- node main(sample)
-- guarantee not last.out => not engaged;
  sample_adc      = sample.adc;
  pre_sample      = pre sample;
```

```
  del_sample      = SAMPLE_ZERO -> pre_sample;
  del_sample_adc  = del_sample.adc;
```

```
  last.out        = lastn(10, delta_valid(sample_adc, del_sample_adc));
  engaged         = valid.ok;
```

---

```
rewrite prim_distributes_arrow: forall stream e e', pure function f.
  f (e -> e') = (f e) -> (f e')
```



```
-- subnode valid = signal_valid(sample.adc)
-- guarantee not valid.last.out => not valid.ok;
  valid.pre_input = pre sample_adc;
  valid.del_input = 0 -> valid.pre_input;
  valid.last.out  = lastn(10, delta_valid(sample_adc, valid.del_input));
```

```
-- node main(sample)
-- guarantee not last.out => not engaged;
  sample_adc      = sample.adc;
  pre_sample      = pre sample;
```

```
del_sample       = SAMPLE_ZERO -> pre_sample;
del_sample_adc   = del_sample.adc;
del_sample_adc   = SAMPLE_ZERO.adc -> pre_sample.adc;
```

```
last.out         = lastn(10, delta_valid(sample_adc, del_sample_adc));
engaged          = valid.ok;
```

---

```
rewrite prim_distributes_arrow: forall stream e e', pure function f.
  f (e -> e') = (f e) -> (f e')
with f := _.adc, e := SAMPLE_ZERO, e' := pre sample:
  (SAMPLE_ZERO -> pre sample).adc = SAMPLE_ZERO.adc -> (pre sample).adc
```



```
-- subnode valid = signal_valid(sample.adc)
-- guarantee not valid.last.out => not valid.ok;
  valid.pre_input = pre sample_adc;
  valid.del_input = 0 -> valid.pre_input;
  valid.last.out  = lastn(10, delta_valid(sample_adc, valid.del_input));
```

```
-- node main(sample)
-- guarantee not last.out => not engaged;
  sample_adc      = sample.adc;
  pre_sample      = pre sample;
```

```
  del_sample      = SAMPLE_ZERO -> pre_sample;
  del_sample_adc  = del_sample.adc;
  del_sample_adc  = SAMPLE_ZERO.adc -> pre_sample.adc;
```

```
  last.out       = lastn(10, delta_valid(sample_adc, del_sample_adc));
  engaged        = valid.ok;
```

---

```
rewrite prim_distributes_pre: forall stream e, pure function f.
  f (pre e) = pre (f e)
```



```

-- subnode valid = signal_valid(sample.adc)
-- guarantee not valid.last.out => not valid.ok;
  valid.pre_input = pre sample_adc;
  valid.del_input = 0 -> valid.pre_input;
  valid.last.out  = lastn(10, delta_valid(sample_adc, valid.del_input));

-- node main(sample)
-- guarantee not last.out => not engaged;
  sample_adc      = sample.adc;
  pre_sample      = pre sample;
  pre_sample_adc  = pre sample_adc;
  pre_sample_adc  = (pre sample).adc;
  del_sample      = SAMPLE_ZERO -> pre_sample;
  del_sample_adc  = del_sample.adc;
  del_sample_adc  = SAMPLE_ZERO.adc -> pre_sample_adc;

  last.out        = lastn(10, delta_valid(sample_adc, del_sample_adc));
  engaged         = valid.ok;

```

---

```

rewrite prim_distributes_pre: forall stream e, pure function f.
  f (pre e) = pre (f e)
with f := _.adc, e := sample
  (pre sample).adc = pre sample_adc

```



```
-- subnode valid = signal_valid(sample.adc)
-- guarantee not valid.last.out => not valid.ok;
valid.pre_input = pre_sample_adc;
valid.del_input = del_sample_adc;
valid.last.out  = lastn(10, delta_valid(sample_adc, del_sample_adc));

-- node main(sample)
-- guarantee not last.out => not engaged;
sample_adc      = sample.adc;
pre_sample      = pre sample;
pre_sample_adc  = pre sample_adc;
pre_sample_adc  = (pre sample).adc;
del_sample      = SAMPLE_ZERO -> pre_sample;
del_sample_adc  = del_sample.adc;
del_sample_adc  = SAMPLE_ZERO.adc -> pre_sample_adc;
del_sample_adc  = 0 -> pre_sample_adc;
last.out        = lastn(10, delta_valid(sample_adc, del_sample_adc));
engaged         = valid.ok;
```



```
node lastn(const n: int; pred: bool)
  pre_count    = pre count;
  arr_count    = 0 -> pre_count;
  count        = if pred then arr_count + 1 else 0;
  out          = count >= n;
```



```
-- subnode last = lastn(10, del_sample_adc)
last.pre_count    = pre last.count;
last.arr_count    = 0 -> last.pre_count;
last.count        = if del_sample_adc
                    then last.arr_count + 1
                    else 0;
last.out          = last.count >= 10;
```

```
-- subnode valid.last = lastn(10, del_sample_adc)
valid.last.pre_count = pre valid.last.count;
valid.last.arr_count = 0 -> valid.last.pre_count;
valid.last.count     = if del_sample_adc
                        then valid.last.arr_count + 1
                        else 0;
valid.last.out       = valid.last.count >= 10;
```



```
last.pre_count      = pre last.count;
last.arr_count      = 0 -> last.pre_count;
last.count           = if del_sample_adc
                        then last.arr_count + 1
                        else 0;
```

==(rewrite recursive binding)=>

```
last.count           = fix (λcount.
                            if del_sample_adc
                            then (0 -> pre count) + 1
                            else 0);
```



```
-- subnode last = lastn(10, delta_valid(...))
last.pre_count   = valid.last.pre_count
                 = pre last.count;
last.arr_count   = valid.last.arr_count
                 = 0 -> last.pre_count;
last.count       = valid.last.count
                 = if del_sample_adc
                   then last.arr_count + 1
                   else 0;
                 = if del_sample_adc
                   then valid.last.arr_count + 1
                   else 0;
                 = fix (λcount.
                       if del_sample_adc
                       then (0 -> pre count) + 1
                       else 0);
last.out         = valid.last.out
                 = last.count >= 10;
```



```
-- subnode last = lastn(10, delta_valid(...))
last.pre_count   = valid.last.pre_count
                 = pre last.count;
last.arr_count   = valid.last.arr_count
                 = 0 -> last.pre_count;
last.count       = valid.last.count
                 = if del_sample_adc
                   then last.arr_count + 1
                   else 0;
                 = if del_sample_adc
                   then valid.last.arr_count + 1
                   else 0;
                 = fix (λcount.
                       if del_sample_adc
                       then (0 -> pre count) + 1
                       else 0);
last.out         = valid.last.out
                 = last.count >= 10;
```

invariant:

```
true -> last.pre_count = valid.last.pre_count
```



# Relationship to k-induction



Flannel flower



# Equivalences sometimes stronger

```
node SoFar(pred: bool)
  returns (out: bool)
  let
    out = pred and (true -> pre out);
  tel
```

---

```
assume
  SoFar(X) => P
```

```
show
  SoFar(X) => P
```

- k-induction alone cannot find the invariant that  $\text{SoFar}(X) = \text{SoFar}(X)$



# K-induction sometimes stronger

```
node countmod4()  
returns (mod4: int)  
let  
  mod4 = 0 -> if pre mod4 = 3 then 0 else pre mod4 + 1;  
  --%PROPERTY mod4 <= 6;  
tel
```

- bound  $\leq 6$  not tight enough to be 1-inductive, but 3-induction can get it



# Modularity

- equivalences can extract invariants from subnodes separately
- could skip equality-saturation on nodes that are too big and still benefit from subnode analyses
- k-induction is monolithic: k parameter controls unfolding for whole system



# Future work

- current implementation in experimental Scala EDSL for Lustre
  - worth implementing in Kind2?
- evaluate on larger programs
- improve clock support
- integration with other invariant generation techniques

