



# End-to-End Verification of Initial & Transition Properties of GR(1) Designs in SPARK

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# Outline

- GR(1) specifications & synthesis
- “End-to-end” verification in this context
- SPARK for end-to-end verification of synthesized GR(1) designs
- Case study: Multi-vehicle controller
- Results on a corpus of GR(1) specifications
- Summary: lessons learned & future work

# GR(1) Specifications & Synthesis

# GR(1) Specifications

- GR(1) or Generalized Reactivity(1) specifications
  - Describe reactive systems that respond to an environment
  - Subset of linear temporal logic
  - General form:  $\varphi_e \rightarrow \varphi_s$
- Interpreted as two-player game between system & environment
  - Environment  $e$  goes first, controls “input” variables from set  $\mathcal{I}$
  - System  $s$  goes second, controls “output” variables from set  $\mathcal{O}$
- Are “realizable” if system strategy/design exists such that
  - System can satisfy  $\varphi_s$  after each step environment satisfies  $\varphi_e$
  - Environment is forced to violate  $\varphi_e$
- Result is “controller” with states  $S$  encoding strategy/design  $c : S \times \Sigma_{\mathcal{I}} \mapsto S \times \Sigma_{\mathcal{O}}$

# GR(1) Specifications as Properties

$\varphi^e$  &  $\varphi^s$  each broken into initial, transition, & liveness property terms

$$\varphi_i^e \wedge \varphi_t^e \wedge \varphi_l^e \rightarrow \varphi_i^s \wedge \varphi_t^s \wedge \varphi_l^s$$

## Temporal operators

$\bigcirc$  – “next”       $\square$  – “always”       $\square\lozenge$  – “always eventually”

## Property term definitions

$\varphi_i^e, \varphi_i^s$  - Initial : Boolean formulas over  $\mathcal{I}$  &  $\mathcal{O}$ , respectively

$\varphi_t^e, \varphi_t^s$  - Transition :  $\bigwedge_{j \in J} \square B_j$ , where each  $B_j$  is a Boolean formula over

- Variables from  $\mathcal{I} \cup \mathcal{O}$
- Expressions  $\bigcirc v$ , where  $v \in \mathcal{I}$  for  $\varphi_t^e$  &  $v \in \mathcal{I} \cup \mathcal{O}$  for  $\varphi_t^s$

$\varphi_l^e, \varphi_l^s$  - Liveness :  $\bigwedge_{j \in J} \square\lozenge B_j$ , where each  $B_j$  is a Boolean formula over  $\mathcal{I} \cup \mathcal{O}$

# GR(1) Example

- Consider a traffic light
  - Input: “tick”
  - Outputs: “red,” “yellow,” “green”
  - Output changes when “tick” is true, stays the same when “tick” is false
  - Ex. 1: red, red, red, ...
  - Ex. 2: red, yellow, green, red, ...
  - Ex. 3: red, red, yellow, yellow, green, green, ...

- Environment properties

$$\varphi_i^e = \top \quad \varphi_t^e = \top \quad \varphi_l^e = \Box \Diamond tick$$

- System initial & liveness properties

$$\varphi_i^s = red \wedge \neg yellow \wedge \neg green$$

$$\varphi_l^s = \Box \Diamond green$$

- System transition properties

## Mutual exclusion

$$\varphi_s^t = \Box \bigcirc ((red \wedge \neg yellow \wedge \neg green) \vee (\neg red \wedge yellow \wedge \neg green) \vee (\neg red \wedge \neg yellow \wedge green)) \wedge$$

## Change on tick

$$\Box ((red \wedge \bigcirc tick \rightarrow \bigcirc green) \wedge (green \wedge \bigcirc tick \rightarrow \bigcirc yellow) \wedge (yellow \wedge \bigcirc tick \rightarrow \bigcirc red)) \wedge$$

## No change without tick

$$\Box ((red \wedge \bigcirc \neg tick \rightarrow \bigcirc red) \wedge (green \wedge \bigcirc \neg tick \rightarrow \bigcirc green) \wedge (yellow \wedge \bigcirc \neg tick \rightarrow \bigcirc yellow))$$

# GR(1) & Synthesis

- Given a GR(1) specification, we can
  - Verify design satisfies it
  - Efficiently synthesize design directly from it
- Ref. [1] contains proof synthesis procedure is “correct-by-construction”
- Synthesis tools exist for different domains<sup>[2-6]</sup>: robotic systems, hybrid systems, multi-agent systems, digital circuits, etc.
- Only a few generate software implementations of synthesized designs

# End-to-End Verification



# GR(1) Synthesis & End-to-End Verification

- Question: If synthesis from GR(1) specifications is “correct-by-construction,” why care about end-to-end verification?
- Answer: Three possible sources of errors
  - Theoretical “proof” of the synthesis procedure<sup>[7-8]</sup>
  - Implementation of the synthesis procedure
  - Translation of a synthesized design to a software implementation

# GR(1) Synthesis & End-to-End Verification

- Question: If synthesis from GR(1) specifications is “correct-by-construction,” why care about end-to-end verification?
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  - Theoretical “proof” of the synthesis procedure<sup>[7-8]</sup>
  - Implementation of the synthesis procedure
  - Translation of a synthesized design to a software implementation
- Additional answer: specification errors

# SPARK for End-to-End Verification of GR(1) Designs

# SPARK for End-to-End Verification of GR(1) Designs

- SPARK<sup>[9-10]</sup> is
  - Programming language based on Ada
  - Associated set of auto-active verification tools
- Our goal
  - Translate synthesized GR(1) designs to SPARK
  - Verify SPARK implementations satisfy original specifications
- Our broad approach
  - Modify tool Salty<sup>[6]</sup> to generate SPARK implementations & annotations needed for SPARK to automatically verify implementations against specifications
  - Perform synthesis & verification on examples from many sources<sup>[2-6]</sup>
- Limitations
  - Currently only address initial & transition properties:  $\varphi_i^e \wedge \varphi_t^e \rightarrow \varphi_i^s \wedge \varphi_t^s$

# SPARK Implementation of GR(1) Design: Summary

- Multiple inputs wrapped in `Environment` record
- Multiple outputs wrapped in `System` record
- Synthesized design implemented as type `Controller`
  - Has field to store state
  - Has fields to store most recent input & output values (for evaluating transition properties with “next” operator)
- Type `Controller` has `Move` procedure that takes inputs & produces outputs
- Functions `Env_Init`, `Env_Trans`, `Sys_Init`, `Sys_Trans` to evaluate  $\varphi_i^e, \varphi_t^e, \varphi_i^s, \varphi_t^s$
- Function `Is_Init` to check whether `Controller` is in initial state

# SPARK Implementation of GR(1) Design: Proof Notes

- Preconditions & postconditions on **Move** encode  $\varphi_i^e \wedge \varphi_t^e \rightarrow \varphi_i^s \wedge \varphi_t^s$
- In GR(1) designs, each state corresponds to unique set of input & output values
  - Define **Type\_Invariant** for **Controller** over Boolean functions  
**State\_To\_Input\_Mapping** & **State\_To\_Output\_Mapping**
  - This is the only thing SPARK needed to automatically prove **Move** postconditions
- “Ghost” code versus executable code
  - **Is\_Init**, **Env\_Init**, **Env\_Trans** executable so user can monitor for violations of  $\varphi_e$
  - **Sys\_Init**, **Sys\_Trans**, **State\_To\_Input\_Mapping**, **State\_To\_Output\_Mapping** are “ghost” code mainly used for proof

# SPARK Implementation of GR(1) Design: Traffic Light

- Let's briefly walk through parts of synthesized traffic light design in SPARK
- Omit Salty-formatted specifications & stick with mathematical representation
- Briefly note Salty has features that make GR(1) specifications easier to write
  - Use of enumeration & integer types for inputs & outputs
  - Arithmetic operators in specifications with integer types
  - User-defined macros
- Enumeration & integer types retained in synthesized SPARK implementations

# SPARK package specification for the synthesized traffic light design

```
package TrafficLight with SPARK_Mode is
  type Controller is private;

  type System is record
    red: Boolean; yellow: Boolean; green: Boolean;
  end record;

  function Is_Init(C: Controller) return Boolean;
  function Env_Init(tick: Boolean) return Boolean is (True);
  function Sys_Init(S: System) return Boolean is (S.red and not S.yellow and not S.green) with Ghost;

  function Env_Trans(C: Controller; tick: Boolean) return Boolean
    with Pre => (not Is_Init(C));
  function Sys_Trans(C: Controller; tick: Boolean; S: System) return Boolean
    with Pre => (not Is_Init(C)), Ghost;

  procedure Move(C: in out Controller; tick: in Boolean; S: out System)
  with Pre =>
    (if Is_Init(C) then Env_Init(tick) else Env_Trans(C, tick)),
    Contract_Cases => (Is_Init(C) => Sys_Init(S) and (not Is_Init(C)),
      others => Sys_Trans(C'Old, tick, S) and (not Is_Init(C)));

private
  subtype State_Num is Integer range 1 .. 7;
  function State_To_Input_Mapping(C: Controller) return Boolean with Ghost;
  function State_To_Output_Mapping(C: Controller) return Boolean with Ghost;

  type Controller is record
    State: State_Num := State_Num'Last; tick: Boolean; S: System;
  end record;
  with Type_Invariant => (State_To_Input_Mapping(Controller) and State_To_Output_Mapping(Controller));
end TrafficLight;
```



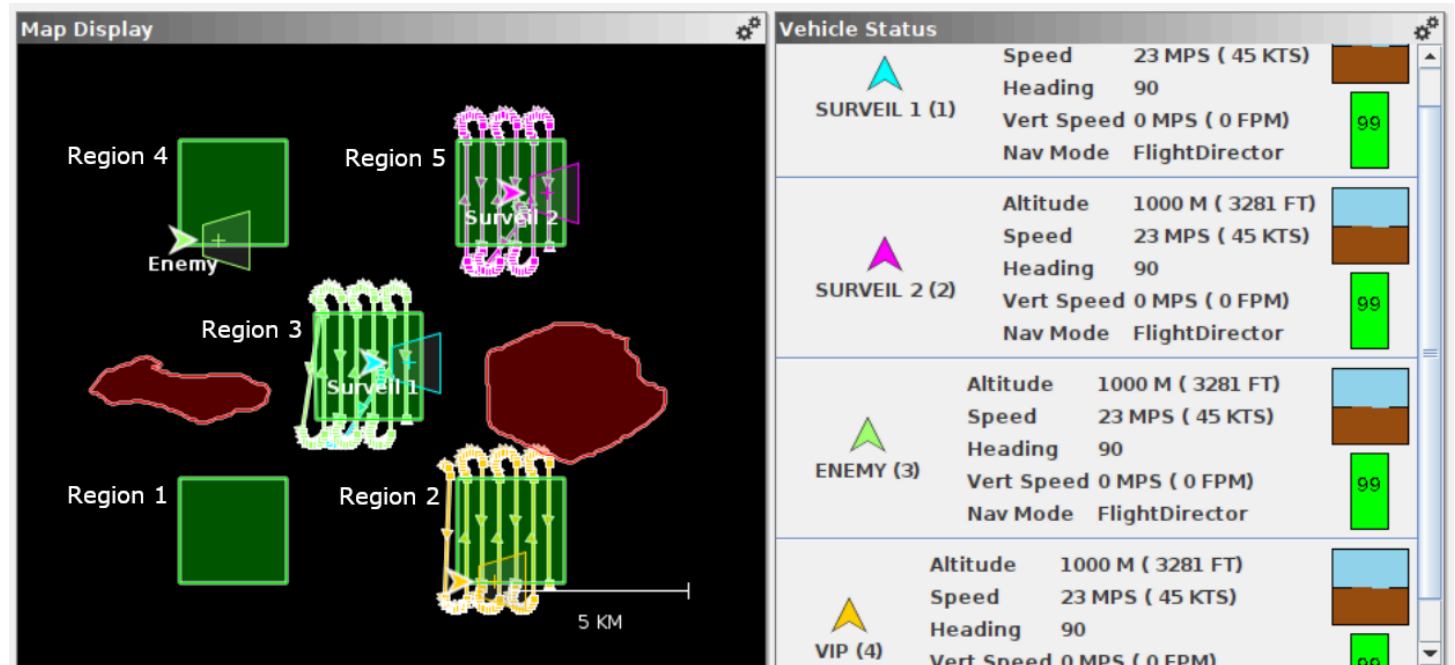
## SPARK body for the Move procedure for the synthesized traffic light design

```
procedure Move(C: in out Controller; tick: in Boolean; S: out System) is
begin
  case C.State is
    when 1 =>
      case tick is
        when False =>
          C.State := 1;
          C.S.red := True; C.S.yellow := False; C.S.green := False;
        when True =>
          C.State := 3;
          C.S.red := False; C.S.yellow := False; C.S.green := True;
        when others =>
          raise Program_Error;
      end case;
      ...
    when 7 =>
      case tick is
        when False =>
          C.State := 1;
          C.S.red := True; C.S.yellow := False; C.S.green := False;
        when True =>
          C.State := 2;
          C.S.red := True; C.S.yellow := False; C.S.green := False;
        when others =>
          raise Program_Error;
      end case;
    end case;
  C.tick := tick; S := C.S;
end Move;
```

# Case Study: Multi-Vehicle Controller

# Case Study: Multi-Vehicle Controller

- Team of “friendly”/system unmanned air vehicles (UAVs) evading “enemy”/environment UAV
  - One friendly UAV is a “Very Important Person” or VIP
  - Two friendly “surveillance” UAVs must “protect” & “escort” the VIP
- Map is divided into five regions
- “Protection”: VIP is never in the same region as the enemy
- “Escorting”: VIP can only move
  - Into region previously visited/ surveilled by a surveillance UAV
  - Surveillance UAV moves with it
- Certain regions only reachable from Region 3
- Enemy UAV must infinitely often leave certain regions
- VIP must infinitely often move to certain regions



# Specification Inputs & Outputs

Inputs	
$loc_e$	- enemy location
$sr_i$	- location $i$ surveilled

Outputs	
$loc_v$	- VIP location
$loc_{si}$	- Surveillance UAV $i$ location
$vTrack_i$	- Surveillance UAV $i$ is tracking VIP

# Environment Specifications

$$\varphi_e^i = (loc_e = 4) \wedge \neg sr_1 \wedge \neg sr_2 \wedge sr_3 \wedge \neg sr_4 \wedge sr_5$$

$$\varphi_e^t = \bigwedge_{i=\{1\dots5\}} \square \left( (loc_{s1} = i) \vee (loc_{s2} = i) \rightarrow \bigcirc sr_i \right) \wedge$$

$$\bigwedge_{i=\{1\dots5\}} \square \left( (\neg(loc_{s1} = i) \wedge \neg(loc_{s2} = i) \wedge \neg sr_i \rightarrow \bigcirc \neg sr_i) \wedge$$

$$(sr_i \rightarrow \bigcirc sr_i) \right) \wedge$$

$$\square \neg (loc_e = 1) \wedge \square \neg (loc_e = 2)$$

$$\varphi_e^l = \square \diamond \neg (loc_e = 3) \wedge \square \diamond \neg (loc_e = 4) \wedge \square \diamond \neg (loc_e = 5)$$

Inputs	
$loc_e$	- enemy location
$sr_i$	- location $i$ surveilled

Outputs	
$loc_v$	- VIP location
$loc_{si}$	- Surveillance UAV $i$ location
$vTrack_i$	- Surveillance UAV $i$ is tracking VIP

# System Specifications

$$\varphi_s^i = (loc_v = 2) \wedge (loc_{s1} = 3) \wedge (loc_{s2} = 5) \wedge \neg vTrack_1 \wedge \neg vTrack_2$$

$$\varphi_s^t = \square \left( \neg (loc_v = \bigcirc loc_v) \rightarrow (\bigcirc vTrack_1 \vee \bigcirc vTrack_2) \right) \wedge$$

$$\bigwedge_{i=\{1..2\}} \square \left( vTrack_i \rightarrow (sloc_i = loc_v) \right) \wedge$$

$$\bigwedge_{i=\{1..5\}} \square \left( (loc_v = i) \rightarrow \neg (loc_e = i) \right) \wedge$$

$$\bigwedge_{i=\{v,s1,s2\}} \square \left( (\bigcirc (loc_i = 1) \rightarrow (loc_i = 1) \vee (loc_i = 2) \vee (loc_i = 3)) \wedge$$

$$(\bigcirc (loc_i = 2) \rightarrow (loc_i = 1) \vee (loc_i = 2) \vee (loc_i = 3)) \wedge$$

$$(\bigcirc (loc_i = 3) \rightarrow \bigvee_{j=\{1..5\}} (loc_i = j)) \wedge$$

$$(\bigcirc (loc_i = 4) \rightarrow (loc_i = 3) \vee (loc_i = 4) \vee (loc_i = 5)) \wedge$$

$$(\bigcirc (loc_i = 5) \rightarrow (loc_i = 3) \vee (loc_i = 4) \vee (loc_i = 5)))$$

$$\varphi_s^l = \square \diamond (loc_v = 1) \wedge \square \diamond (loc_v = 5)$$

## Inputs

$loc_e$	- enemy location
$sr_i$	- location $i$ surveilled

## Outputs

$loc_v$	- VIP location
$loc_{si}$	- Surveillance UAV $i$ location
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## Case Study: Results

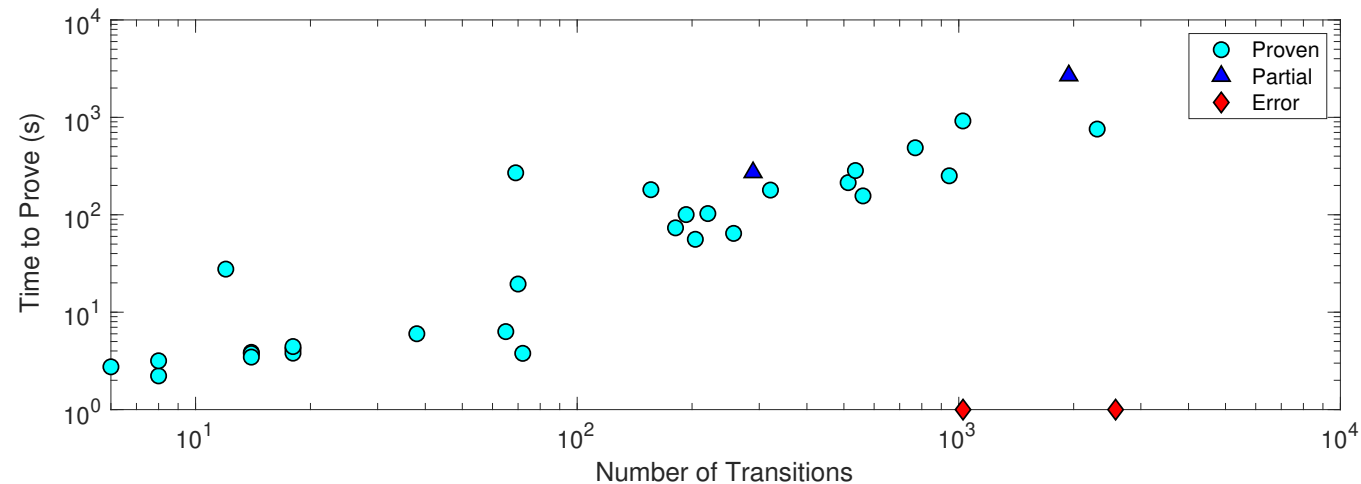
- Previously synthesized Python controller, interfaced it to OpenUxAS<sup>[11-12]</sup> to implement low-level UAV behaviors, simulated in OpenAMASE<sup>[13]</sup>
- Implementation in SPARK found undetected issue!
- Issue was part of specification for  $\varphi_t^e$ :  $\square \neg (loc_e = i)$  for  $i = \{1, 2\}$
- Specification should be written  $\varphi_t^e$ :  $\square \bigcirc \neg (loc_e = i)$  for  $i = \{1, 2\}$
- Reason:  $\square \neg p$  not the same as  $\square \bigcirc \neg p$ 
  - If environment chooses  $p$  for next time step, does not violate  $\square \neg p$  in current time step
  - However, it necessarily violates  $\square \neg p$  in next time step
  - $\varphi_t^e$  should have terms of the form  $\square \bigcirc \neg p$ , not  $\square \neg p$
  - Salty now produces warning in this case
- In Python implementation, result was states with no successors, leading to runtime errors after reaching those states

# Results



# SPARK Implementation of GR(1) Design: Summary

- Pulled 40 examples from GR(1) repos<sup>[2-6]</sup>: Salty, Slugs, Anzu, TuLiP, LTLMoP
- Plot shows CPU time for 33 examples with up to 4000 controller transitions
  - 7 examples with more transitions required too much memory (not plotted)
  - 2 examples had errors because of unusually large specifications
  - 2 examples only partially proven:
    - One with ~2000 transitions
    - One with Integer terms & arithmetic operators in specification



- Found the same type of specification error as UAV case study in one Anzu example

# Summary

# Lessons Learned

- “End-to-end” SPARK verification found issue due to  $\Box \neg p$  vs.  $\Box \bigcirc \neg p$
- Case statement more efficient proof-wise than `Map` for controller logic
  - SPARK `Maps` have complete axiomatization, adds verification conditions
    - During initialization, must prove each added key/input value not already contained
    - After initialization, must prove every possible transition covered
  - Case statements automatically imply these things
- Case statements have some issues:
  - Large/verbose
  - Underlying prover must reason about all alternatives at once
  - Still better than `Map` in our application, but maybe not for others
- Some examples had no inputs, vacuous precondition `Pre => True`
  - Took abnormally long time to verify
  - Clearly could be encoded more efficiently

# Future Work

- Investigate liveness properties
  - SPARK hypothetically can solve required bounded model checking problem
  - Other option: annotate code & use external model checker
- Look at decomposition of `Move` procedure to handle larger examples
- Fix encoding of controllers with no inputs to speed up proof
- Investigate why example with Integer types & arithmetic operators takes longer than expected to prove in SPARK

# References

# Full Paper

For more details, see:

Humphrey, L. R., Hamil, J., Huguet, J.: “End-to-End Verification of Initial and Transition Properties of GR(1) Designs in SPARK,” In: Int. Conf. Software Engineering and Formal Methods (SEFM), 2020.

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