





FORMAL VERIFICATION OF AN UAV AUTOPILOT STATIC ANALYSIS AND VERIFIED CODE GENERATION

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Critical systems

Systems which must be highly reliable and where any bugs can be costly or life-endangering.

They can be found in several domains:



Space



Medical

Formal Verification of an UAV autopilot



Avionics



Nuclear



Automotive



Autonomous Drone







Traditional verification and validation techniques:

- Code review,
- Tests.

"Program testing can be a very effective way to show the presence of bugs, but it is hopelessly inadequate for showing their absence.", Edsger Dijkstra.

How to be more confident in the absence of errors?

 \implies A solution is to use Formal Methods.



Formal methods

- Verification techniques and tools based on mathematical models and proofs,
- Offer stronger guarantees than test.
- Examples: abstract interpretation, deductive methods, model-checking.

Industrial use:

- Used in several domains: aerospace, automotive, medical, cybersecurity, etc.
- Recommended in avionics with DO-178C and DO-333 standards.

Limitations

- Verification tools not always scalable on large projects,
- Applied by engineers not trained in formal methods.

FORMAL VERIFICATION OF AN UAV AUTOPILOT

STATIC ANALYSIS AND VERIFIED CODE GENERATION

Goals of this thesis:

- Review verification processes using formal tools,
- Apply them on critical components,
- Ensure that these processes can be used on existing projects.

Thesis realised in the context of the Concorde Project.

Concorde Project

Research project supported by Defense Innovation Agency (AID).

Goals: Propose methods for the analysis and design towards the certification of future drones systems and their operations.

 \implies Apply the verification processes on **critical components** of a **drone autopilot**.

Case study: Paparazzi UAV autopilot, developed at ENAC.

Formal Verification of an UAV autopilot

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Paparazzi is a good candidate for testing if formal methods are usable/efficient as

- ► The autopilot has been developed:
 - without verification purpose,
 - by good programmers,
 - using classic C idioms in the code (pointers, etc).
- The code base is sizable (\sim 350,000 lines of code).

This thesis focuses on 2 critical components:

- A mathematical library used by the control system.
 Werified using static code analysis.
- A flight plan generator producing embedded C code.
 ⇒ Verified using code generation verification techniques.

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Paparazzi is an autopilot for micro-drones

- Developed at ENAC since 2003,
- Open-Source under GPL license.

Complete UAV control system:

- Control embedded software part,
- Design of some hardware components,
- Support for ground and aerial vehicles,
- Support for simultaneous control of several drones.



Paparazzi GCS connected to 3 drones¹

¹Pascal Brisset and Gautier Hattenberger. "Multi-UAV control with the Paparazzi system". In: HUMOUS 2008. Brest, France

PAPARAZZI Flight system architecture

State Interface

Black board interface:

- Collects data from sensors.
- Converts automatically the data between different representations, provided by a mathematical library.



Flight Plan

- Defines the behaviour of the drone once launched.
- Flight Plan Generator that converts XML flight plans into embedded C code.

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MATHEMATICAL LIBRARY



<code>pprz_algebra</code> : mathematical algebra library coded in C (\sim 3 200 lines of code)

Library used for UAV state representations, in particular attitude and speed representations.

The library contains:

- The definition of a representation of vectors,
- Different representations of vector rotations, rotation matrices, Euler angles, quaternions.
- Elementary operations,

ex: addition of vectors, computation of the rotation of a vector, normalisation of a quaternion, etc

Conversion functions between these different representations.

Note: Each representation/function has a fixed point (int) and floating-point versions (for float and double).

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Data produced is used by the navigation system.

 \Longrightarrow Any bug can lead to the crash of the program or produce invalid data.

Existing C verification tools:

- **CBMC**, a model checker for C programs.
- **VST**, a set of tools and methods for the formal verification of C software.
- **Frama-C**, a workbench implementing several verification methods for C code.

Our objective: Ensure the correctness of the library using Frama-C, without modifying the code.



Frama-C

Frama-C is a C code analysis tool

- Mainly developed by CEA,
- Modular, which supports different analysis methods ex: static analysis with EVA or dynamic analysis with E-ACSL.

Verification process of a C program using Frama-C:

- 1. Code specification with ACSL (ANSI C Specification Language),
- 2. Generation of the abstract syntax tree of the analysed code,
- 3. Analysis of the tree by the plugins
 - \implies Verify whether the specification is respected.

Note: the tree analysis can be performed by several plugins.





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Some Frama-C plugins

RTE (RunTime Errors):

- Adds assertions in the code,
- Allows to verify the absence of runtime errors ex: division by 0, overflows ...

WP (Weakest Precondition)

- Implements weakest precondition calculus,
- Interfaced with Why3 to verify goals with automatic provers (Alt-Ergo, Z3, CVC4).

EVA (Evolved Value Analysis)

- Based on static analysis by abstract interpretation methods,
- Computes domains of values for each variable in the program.

ABSENCE OF RUNTIME ERRORS

ABSENCE OF RUNTIME ERRORS

There are different types of runtime errors in C:

- Dereferencing an invalid pointer,
- Division by 0,
- Overflows,
- Non finite float value,

Goal: Determine the "minimal" contracts for the functions of the library in order to guarantee the absence of runtime errors.

Process :

- Analyse the code with Frama-C using RTE and WP plugins.
- Deduce the missing information in contracts.

Analysis with Frama-C and the RTE plugin

Analysis of the instruction:

 $c \to x = a \to x * b \to x;$

Frama-C finds 2 potential errors!

- Pointers might not be valid.
 - /*@ assert rte: mem_access: \valid(&c->x); */
 /*@ assert rte: mem_access: \valid_read(&a->x); */
 /*@ assert rte: mem_access: \valid_read(&b->x); */

 \implies Require the validity of pointers as a precondition.

- ► The values are not bounded.
 - /*@ assert rte: signed_overflow: -2147483648 ≤ a->x * b->x; */
 - /*@ assert rte: signed_overflow: a->x * b->x ≤ 2147483647; */

 \implies Determine bounds which guarantee the absence of overflows.



#define SQRT_INT_MAX4 23170 // 23170 = SQRT(INT_MAX/4)

```
/*0
 requires \valid(a2c);
 requires \valid read(a2b);
  requires \valid read(b2c):
 requires \separated(a2c, a2b) && \separated(a2c, b2c);
  requires bound Int32Quat(a2b, SQRT INT MAX4);
  requires bound_Int32Quat(b2c, SQRT INT MAX4);
  assigns *a2c:
*/
void int32_quat_comp(struct Int32Quat *a2c,
                     struct Int32Quat *a2b,
                     struct Int32Quat *b2c)
```



EVA and WP had to be associated to verify the absence of RTE.

- WP is overloaded when accessing values by reference,
- ► EVA cannot verify loop variants and invariants.
- \implies The same problem has been raised in the thesis of V. Todorov².

The **real arithmetic model** (real in the mathematical sense) has been used to verify floating-point version of the functions.

The real model guarantees :

- ► The absence of division by 0,
- ► The lack of dereference of invalid pointers.

But the absence of overflows and rounding errors are not verified.

²Vassil Todorov. "Automotive embedded software design using formal methods". PhD Thesis. Université Paris-Saclay, Dec. 2020

FUNCTIONAL VERIFICATION

FUNCTIONAL VERIFICATION

Functional verification

Offer guarantees on the behavior or the result of a function.

Example: Functional properties for square root function

```
/*@ requires x >= 0;
ensures \result >= 0;
ensures \result * \result == \old(x);
assigns \nothing;
*/
```

```
float sqrt(float x);
```

Using the real model:

- Offers no functional guarantee during execution.
- Used to verify that the code is correct in a mathematical sense.

HOW TO SPECIFY THE FUNCTIONAL PROPERTIES?

Functional properties must be expressed in ACSL logic.

First, it is necessary to define:

- ► Types, ex:RealVect3, RealRMat, RealQuat.
- **Elementary functions**,

ex: addition of vectors, rotation of a vector...

```
Conversion functions between representations,
ex: Definition of the function rmat_of_quat : \mathbb{H} \to M_{3,3}(\mathbb{R}),
```

/*@

*/

```
logic RealRMat l_RMat_of_FloatQuat(struct FloatQuat *q) =
[...]
```

Lemmas...

SPECIFYING THE FUNCTIONAL PROPERTIES OF THE LIBRARY

Lemmas: Verify that the mathematical definitions are correct. Ex: The conversion function produces the same rotation,

Mathematically,

$$\forall q \in \mathbb{H}, \forall v \in \mathbb{R}^3, q(0, v)q^* = (0, \texttt{rmat_of_quat}(q).v)$$

Finally, the functional properties are expressed in the form of predicates:

• M is a rotation matrix: $M.M^t = I \wedge \det M = 1$



Example: Specification of the function float_rmat_of_quat.

```
/*@
    requires ...
    ensures rotation_matrix(l_RMat_of_FloatRMat(rm));
    ensures l_RMat_of_FloatRMat(rm) == l_RMat_of_FloatQuat(q);
*/
void float_rmat_of_quat(struct FloatRMat *rm, struct FloatQuat *q)
```

Functional properties specified and verified in some float function contracts.

- Contracts and lemmas mainly verified automatically with solvers.
- Some lemmas had to be proven **manually** with Coq (~9% of the lemmas).
- \implies Approximately 2,600 lines of ACSL annotations and 200 lines of Coq for 3,200 lines of code.

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FLIGHT PLAN GENERATOR

FLIGHT PLAN



The flight plan (FP)

- describes how the drone might behave when launched,
- ▶ is defined in a XML configuration file.

Example:

- 1. Wait until the GPS connection is set,
- 2. Take off,
- 3. Do a circle around a specific GPS position.
- 4. If battery is less than 20%: Go home and land.



Function auto_nav:

- Called at 20 Hz,
- Sets navigation parameters for actuators.

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Problems:

 \blacktriangleright

- ► The behaviour of flight plans is not formally defined.
- Does the auto_nav function always terminate?
- Generator is a complex software that generates embedded code.

\Longrightarrow Certified Compilation problem

Solutions to similar problems

- CompCert: C compiler proved in Coq.
- Vélus: Lustre compiler proved in Coq.

Our objective: Develop a new verified flight plan generator in Coq.



Coq is a proof assistant

- Development supported by Inria,
- Based on the Gallina language.

Software for writing and verifying formal proofs

- Proofs of mathematical theorems,
- Proofs of properties on programs.

 \implies Coq code can be extracted into OCaml code with guarantees.

Fixpoint por match n wi 0 => 1 S m =>) end.	er (x n : nat) (st th * power x m	ruct n} : nat :=	$ \begin{array}{ c c c c c c c c c c c c c c c c c c c$
Theorem Ferm (forall x Preof. Induction n.	at : y z n : nat, x^n +	y'n = 2'n -> n x	

CoqIDE, a vintage GUI for Coq

THE NEW VERIFIED FLIGHT PLAN GENERATOR (VFPG)



Pre-processing: Manages included files, converts block names into indices... **Post-processing:** Produces a compilable C code.

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OVERVIEW OF THE SEMANTICS PRESERVATION PROOF



FP semantics

FPC semantics

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FLIGHT PLAN LANGUAGE

FLIGHT PLAN STRUCTURE IN GALLINA

```
Record flight_plan:={
    blocks:listfp_block
    excpts:listfp_exception;
    fb_deroutes:listfp_fb_deroute;(* New feature *)
}
```

```
Record fp_block:= {
    id: block_id;
    excpts: list fp_exception;
    stages: list fp_stage;
}.
```

```
Inductive fp_stage:=
    WHILE (cond: c_cond) (body: listfp_stage)
    SET (var: var_name) (value: c_value)
    CALL (fun: c_code)
    DEROUTE (idb: block_id)
    RETURN (reset: bool)
    NAV (nav_mode: fp_nav_mode) (init: bool).
```

```
Record fp_exception:={
    cond: c_cond;
    id: block_id;
    exec: optionc_code;
}.
Record fp_fb_deroute:={
```

from: block_id; to: block_id; only_when: option c_cond; }



EXAMPLE: POTENTIAL EXECUTION OF A FLIGHT PLAN

Flight Plan:

```
excpts: [],
fb_deroutes: [ ],
blocks: [
 { id: 0, excpts: [ ],
     stages: [
        CALL "InitSensors()":
        WHILE "!GPSFixValid()"[];
        SET "home" "GPSPosHere()"]
 };
    id: 1, excpts: [ ],
     stages:
        NAV (TakeOff params) true:
        DEROUTE 10]
 };
     { id: 10, ... } ...
```

Results of auto_nav: Current Call Code Executed Block InitSensors() 0 !GPSFixValid() **↑** true 2 !GPSFixValid() 0 true 3 0 !GPSFixValid() î true !GPSFixValid() false 9 0 home = GPSPosHere()10 StartMotors() 11 TakeOffDone() **↑ false** 12 TakeOffDone() false TakeOffDone() { true 20 Deroute $\rightarrow 10$ 21 10

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GENERATOR



${\tt Definition\ generate_flight_plan:\ flight_plan} \rightarrow {\tt res_generator}$

Inputs:



Outputs:

▶ Warnings and errors currently produced during the generation.

- detect when there is a possible deroute that is forbidden,
- detect when the flight plan has an incorrect size.

Example of generated C Code

Example of a flight plan:

```
{|
   excpts: [],
    fb_deroutes: [],
    blocks: [
    {| id: 0,
        excpts: [],
        stages: [
            CALL "func1()":
            CALL "func2()"
    |}
1}
```

C code generated:

```
static inline void auto nav(void) {
    switch (get_nav_block()) {
        case 0: // Block 0
            switch (get_nav_stage()) {
                case 0: // Stage 0
                    func1();
                case 1: // Stage 1
                    func2():
                default:
                case 3: // Default Stage
                    NextBlock();
                    break:
            }
            break:
        case 1: // Default Block
            GEN_DEFAULT_C_CODE()
    3
```

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STEPS OF GENERATE_FLIGHT_PLAN FUNCTION



Extend Flight Plan:

- Index stages,
- Split NAV into NAV_INIT and NAV,
- Flatten stages contained in a WHILE stage.

Size verification:

- Check block indexing,
- Check that numbers of blocks and stages are less than 256,
- Check that block_id fields are 8 bits values.

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VERIFICATION OF THE GENERATOR

GENERIC BIG STEP SEMANTICS FOR FLIGHT PLANS

Definition (fp_semantics)

```
A generic definition for the flight plan semantics.
```

```
Record fp_semantics:Type:= FP_Semantics_gen{
    (** Environment for the semantics *)
    env: Type;
    (** Properties stating if an env is an initial environment *)
    initial_env:env → Prop;
    (** Properties stating the execution of the auto_nav function *)
    step: env → env → Prop;
}.
```

Instantiation of the semantics:

- FP semantics: semantics_fp,
- FPC semantics: semantics_fpc,

- FPE semantics: semantics_fpe,
- ▶ FPS semantics: semantics_fps.



Environment: Definition fp_env := (fp_state * fp_trace).

- **fp_state** the memory storing the execution **state** of the flight plan,
- fp_trace: the memory that can be modified by flight plan external functions.

Initial environment property noted initial_env e

Step property noted $e \stackrel{FP}{\hookrightarrow} e'$.

- ▶ Defined as a function for early validation purposes: $e \stackrel{FP}{\hookrightarrow} e' := step e = e'$
- ▶ Interpretation of arbitrary C code.
 - **Hypothesis:** Arbitrary C code **terminates** and **does not modify** the FP state.
 - ▶ Parameter eval: $fp_env \rightarrow cond \rightarrow (bool * fp_env)$.

DEFINITION OF THE FP SEMANTICS

▶ Inference rules for the WHILE stage.

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▶ Inference rules for the NAV stage.

$e.\texttt{stages} = \texttt{NAV} (\textit{mode}, \texttt{true}) :: \textit{s} \qquad e(\textit{init_nav_code mode})$	= e' $e.stages = NAV (mode, false) :: s$
$e' \{ \texttt{stages} := \texttt{NAV} (mode, \texttt{false}) :: s \} = e''$	$e \stackrel{FP}{\underset{nav}{\leftarrow}} e'$
$e \stackrel{FP}{\longleftrightarrow} e''$	$e \stackrel{FP}{\longleftrightarrow} e'$



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}.

Definition of a bisimulation relation between 2 semantics.

```
Inductive bisimulation (FP1 FP2: fp_semantics): Prop :=
  Bisimulation (match_envs: env FP1 \rightarrow env FP2 \rightarrow Prop)
                 (forward simulation: fp simulation FP1 FP2 match envs).
                 backward_simulation:fp_simulationFP2FP1match_envs).
```

 \exists (e2': FP2.env), step e2 e2' \land match_envs e1' e2';

match_step:

CORRECTNESS OF THE GENERATOR

Theorem (bisim_fp_fpc)

fp prog warnings,
 generator fp = CODE (prog, warnings)

 \rightarrow bisimulation (semantics_fpfp) (semantics_fpcprog).

This theorem states that the generator preserves the semantics.

Forward simulation

FP behaviour is simulated by the Clight code.

Backward simulation

Every possible execution of the Clight code is described by the FP semantics.

VERIFICATION OF THE CORRECTNESS THEOREM FPE FPS FP FPC efn a $\sim e_{fve} \sim e_{fve}$ $\sim \sim \sim e_{fps} \sim$ $= e_c$ $\sim e'_{fpe}$ $e'_{fn} \ll$

FP semantics

FPE semantics

FPS semantics

FPC semantics

Lemma compose_bisimulations:

- \forall FP1 FP2 FP3, bisimulation FP1 FP2
 - ightarrow bisimulation FP2 FP3
 - ightarrow bisimulation FP1 FP3.



Interpretation of the arbitrary C code.

Hypothesis: Arbitrary C code terminates and does not modify the FP state.

New axioms to extend the operational Clight semantics.

 \implies These axioms convert arbitrary C code into traces.

Note

These axioms can be improved by modifying the generation of the arbitrary C code.

Classic logic axioms from Coq standard library: excluded middle, proof irrelevance and functional extensionality.

DEVELOPMENT METHODOLOGY Lessons Learned

Constrained by the previous generator: Input language, C code generated...

Split the proof in 3 independent parts.

Verification functions produce dependent type. \implies Avoid axioms, improves confidence in preprocessing.

Forced clarification of the semantics:

- ▶ Unexpected behaviour (ex: *RETURN* after a *DEROUTE*),
- Bug (ex: the FP contains more than 256 blocks/stages).

 \Longrightarrow 2,100 loc of OCaml and 20,000 loc of Coq (14% of functional code).

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The C mathematical library verified using Frama-C

- Verification of the absence of runtime errors in the library,
- Verification of functional properties on some floating-point functions.

A flight plan generator verified using Coq

- Development of a new generator in Coq with new features,
- Formalisation of the flight plan semantics,
- Verification of the preservation of the semantics.

Limitation of these verification processes

- Verifications based on hypotheses,
- Require an expertise in formal methods,
- High cost in terms of maintainability.

FUTURE WORKS

Continue the verification of the mathematical library:

- Verification of calls to library functions,
- Verifying the floating-point library without the real model,

Improve the **new flight plan generator**:

- Verify new properties on the flight plan language,
- Reduce the number of pre-processing steps,
- Generalise the generator.

Verify the **Paparazzi autopilot generator**, similarly to VFPG.

Use **model checking** approaches:

- Verify critical C code using model checking tools such as CBMC,
- Verify design of hardware components.



Formal verification of an UAV autopilot

Static analysis and Verified Code Generation

Case study: Paparazzi

Project publicly available

- Verified library: gitlab.isae-supaero.fr/b.pollien/paparazzi-frama-c
- VFPG:gitlab.isae-supaero.fr/b.pollien/vfpg

Publications

- Technical report:
 - Formal verification for autopilots: preliminary state of the start
 - A gentle introduction to C code verification using the Frama-C platform
- Verification of some parts of Paparazzi mathematical library Publications: AFADL 2021, FMICS 2021
- Development of a verified flight plan generator Publications: FormaliSE 2023

This work is supported by the Defense Innovation Agency (AID) of the French Ministry of Defense (research project CONCORDE N 2019 65 0090004707501)



The **drone environment** can be modelled in a variety of ways.

From the point of view of the flight plan execution, the global drone environment can be split into 2 distinct elements:

- the memory storing the execution state of the flight plan,
- the memory that can be modified by flight plan external functions.

Remark

External functions can be:

- complex functions that corresponds to navigation stages,
- arbitrary C code contained in the flight plan.

 \Longrightarrow It is not possible to represent the effect of their execution.

\implies We assume that these 2 memory regions are strictly disjoint.

Formal Verification of an UAV autopilot



The FP semantics will use fp_env, an abstraction of the drone environment.
 Record fp_env := {
 state: fp_state;
 trace: fp_trace;
 }.

fp_state represents an abstraction of the current state of the flight plan.

```
Record fp_state:= {
    idb: block_id; stages: listfp_stages; (* Current position *)
    lidb: block_id; lstages: listfp_stages; (* Last position *)
}
```

A position is a couple of a block ID and the remaining stages to execute.

fp_trace represents the history of external functions execution.

```
Variant fp_event := COND(cond * bool) | C_CODE(c: c_code).
Definition fp_trace := list fp_event.
```



Contracts of the trigonometric functions from the libc do not provide mathematical results. \implies Extend the contracts.

ex: Extension of the contract for the function sinf.

```
/*@ requires finite_arg: \is_finite(x);
    assigns \result \from x;
    ensures finite_result: \is_finite(\result);
    ensures result_domain: -1. <= \result <= 1.;
    ensures result_value: \result == \sin(x);
*/
extern float sinf(float x);</pre>
```

Some lemmas could not be proved by the SMT solvers.

 \implies Enable interactive mode of Frama-C to use Coq.



▶ Lemma to verify the correctness of the function quat_of_rmat $\forall R \in SO_3(\mathbb{R}), \forall q \in \mathbb{H},$ $||q|| > 0 \land Tr(R) > 0$ $\rightarrow (R = rmat_of_quat(q) \leftrightarrow q = quat_of_rmat(R))$

Lemma used to verify that rmat_of_euler compute rotation matrix: