

Probably FRET?

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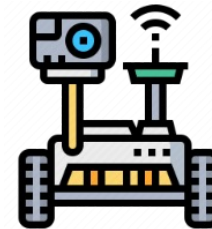
Probabilistic requirements?

- Reviewed requirements *from industry and academia*
- Let's dive into probabilistic requirements and classify them into patterns



Probabilistic requirement patterns

“The probability of avoiding collisions with an obstacle shall be greater than 99% over the course of the mission”*



“With a probability of at least 0.95 no error will occur in the next 1000 seconds”

**this probability is application and system dependent*

Probabilistic requirement patterns

*“The probability of **avoiding collisions** with an obstacle shall be **greater than 99%** over the course of the mission”*

*“With a probability of **at least 0.95** **no error** will occur **in the next 1000 seconds**”*

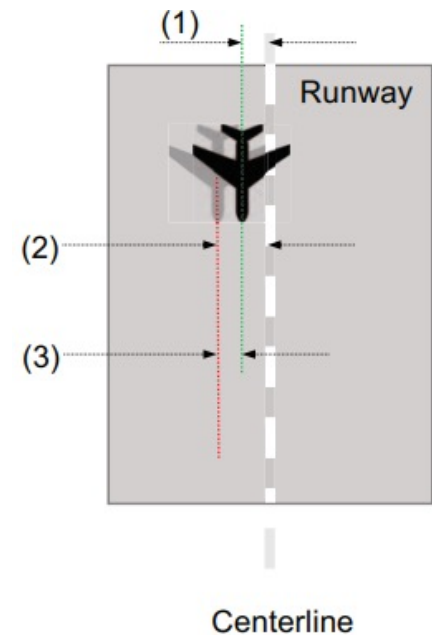
Probabilistic invariance

Predicate** holds (**always** or **continuously within a time bound**) **with a probability bound

Probabilistic requirement patterns

“The aircraft shall not leave the taxiway”

“The aircraft shall not turn more than a prescribed degree”



Corina Pasareanu, Ravi Mangal, Divya Gopinath, Sinem Getir Yaman, Calum, Imrie, Radu Calinescu, and Huafeng Yu, Closed-loop Analysis of Vision-based Autonomous Systems: A Case Study, Submitted to CAV 2023.

Erfan Asaadi, Ewen Denney, Ganesh Pai. Towards Quantification of Assurance for Learning-enabled Components, EDCC 2019.

Probabilistic requirement patterns

What is the probability that the aircraft eventually leaves the taxiway

What is the probability that the aircraft eventually turns more than a prescribed degree

Calculate the probability that eventually the system reaches an error state

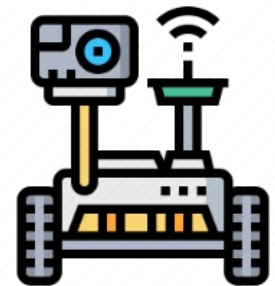
Probabilistic existence

Predicate will eventually become true with a probability bound

Probabilistic requirement patterns

“Whenever error X , the rover shall avoid collisions with a probability greater than bound”

“if $FSM_STATE = MapSending_SendMapData$, rover shall within $\langle watchdog_timeout \rangle$ transfer $_map$ with probability greater than bound”



Probabilistic requirement patterns

“Whenever *error X*, the rover shall *avoid collision* with a probability *greater than bound*”

“if *FSM_STATE = MapSending_SendMapData*, rover shall within *<watchdog_timeout>* *transfer_map* with *probability greater than bound*”

Probabilistic response

Whenever *predicate1* holds, *predicate2* must become true with a *probability bound*

Do you speak
FRETish?

FRET Projects **CREATE**

Create Requirement

Requirement ID Parent Requirement ID Project: **Demo-FSM**

Rationale and Comments

Requirement Description

A requirement follows the sentence structure displayed below, where fields are optional unless indicated with "*". For information on a field format, click on its corresponding bubble.

SCOPE CONDITIONS COMPONENT* SHALL* TIMING RESPONSES*

SEMANTICS

CANCEL **CREATE**

ASSISTANT TEMPLATES GLOSSARY

Ready to speak FRETish?

Please use the editor on your left to write your requirement or pick a predefined template from the TEMPLATES tab.

LM_AUTOPILOT REG_YAW_ACC_REQ
when mode and for dec2 - 50. Decelerate shall within

Adding probabilities in FRET



template key: [scope, condition, timing]

SCOPE	null (global), in, before, after, notin, onlyIn, onlyBefore, onlyAfter
CONDITION	null, regular, trigger
TIMING	immediately, next, always, never, eventually, until, before, for, within, after

Adding probabilities in FRET



template key:[scope, condition, probability, timing]

SCOPE	null (global), in, before, after, notin, onlyIn, onlyBefore, onlyAfter
CONDITION	null, regular, trigger
PROBABILITY	null, bound, query
TIMING	immediately, next, always, never, eventually, until, before, for, within, after

Translate to the PRISM language

- PRISM's property specification language subsumes several probabilistic temporal logics
- Several probabilistic model checkers accept PRISM's language
 - E.g., STORM, ISCASmc

P operator: **P bound** [temporal property]

- **P>0.99**[F terminate]
- **P>0.98**[F (request & (X ack))]

P=? [property] **quantitative approach**

- **P=?**[F terminate]

Adding probabilities in FRET



[scope, condition, probability, timing]

For example:

[null, null, null, immediately]: $P \geq 1$ [\$response\$]

[null, null, bound, immediately]: $P \sim \text{bound}$ [\$response\$]

[null, null, query, immediately]: $P = ?$ [\$response\$]

Probabilistic invariance



[null, null, bound, always]: $P \sim \text{bound} [G (\$ \text{response} \$)]$

[null, null, bound, for]: $P \sim \text{bound} [G \leq T (\$ \text{response} \$)]$

“The probability of avoiding collision with an obstacle shall be greater than 99% over the course of the mission”

FRETish: The rover shall with probability > 0.99 always satisfy ! collision

$P \geq 0.99 [G (! \text{ collision})]$

“With a probability of at least 0.95 no error will occur in the next 1000 seconds.”

FRETish: The sw shall with probability ≥ 0.95 for 1000 seconds satisfy ! error

$P \geq 0.95 [G \leq 1000 (! \text{ error})]$

Probabilistic existence



[null, null, bound, eventually]: $P \sim \text{bound} [F \ \$\text{response}\$]$

[null, null, query, eventually]: $P = ? [F \ \$\text{response}\$]$

“What is the probability that eventually the system reaches an error state”

FRETish: The aircraft shall with what probability eventually satisfy error

$P = ? [F \ \text{error}]$

“What is the probability of battery depletion before completing mission objectives”

FRETish: The rover shall with what probability eventually satisfy battery_depleted

$P = ? [F \ \text{battery_depleted}]$

Probabilistic response



[null, regular, bound, always]:

$P \geq 1 [G (\$regular_condition\$ \rightarrow P \sim bound [G \$response\$])]$

“If error, the rover shall avoid collision with a probability greater than bound”

FRETish: Whenever error, the rover shall with probability > bound always satisfy ! collision

$P \geq 1 [G (error \Rightarrow P > bound [G (! collision)])]$

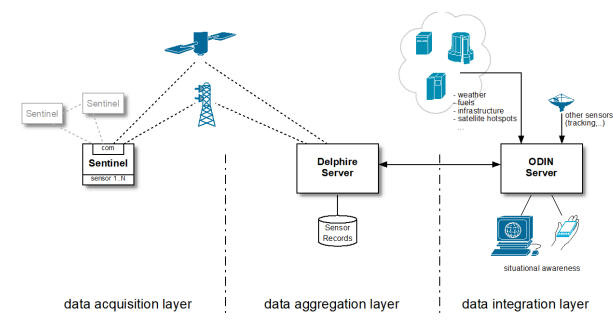
More complex formulas

FRETish: if FSM_STATE = MapSending_SendMapData, rover shall with probability bound within <watchdog_timeout> satisfy transfer_map

$$P \geq 1 [((G (((! (FSM_STATE = MapSending_SendMapData)) \& (X (FSM_STATE = MapSending_SendMapData)))) \Rightarrow (P \sim bound [X (F \leq watchdog_timeout \ transfer_map)]))) \& (FSM_STATE = MapSending_SendMapData) \Rightarrow P \sim bound [F \leq watchdog_timeout \ transfer_map])]]$$

Ongoing work

- More than 40 different formalizations for probabilistic requirements
- Probabilistic requirements for ODIN-Fire
- *if ODIN gets a fire/smoke probability $> X$ it sends notification within Y sec with a probability P_A*
- *if fire location $>$ location threshold and fire spread vector $>$ fire spread threshold the situational awareness system shall satisfy that the blockage probability for escape route 1 is P_{BER1}*



REFSQ 2023 paper

- ML requirement attributes and characteristics
- 13 sanitized requirement types
- Obtained by manually analyzing 770 requirements
- Missions and industrial case studies

Exploring Requirements for Software that Learns: A Research Preview

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Abstract. Context & motivation: The development of software that learns has revolutionized how many systems perform. For the most part, these systems are neither safety- nor mission-critical. However, as technology and aspirations advance, there is an increased desire and need for Machine Learning (ML) software in safety- and mission-critical systems, e.g., driverless cars or autonomous space robotics. **Problem:** In these domains, reliability is crucial and systems have to undergo much scrutiny in terms of both the developed artefacts and the adopted development process. Central to the development of such systems is the elicitation and definition of software requirements that are used to guide the design and verification process. The addition of software components that learn, and the associated capability for unforeseen behavior, makes defining detailed software requirements especially difficult. **Principal ideas/results:** In this paper, we identify unique characteristics of software requirements that are specific to ML components. To this end, we collect and examine requirements from both academic and industrial sources. **Contribution:** To the best of our knowledge, this is the first work that presents real-life, industrial patterns of requirements for ML components. Furthermore, this paper identifies key characteristics and provides a foundation for developing a taxonomy of requirements for software that learns.

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Back-up slides

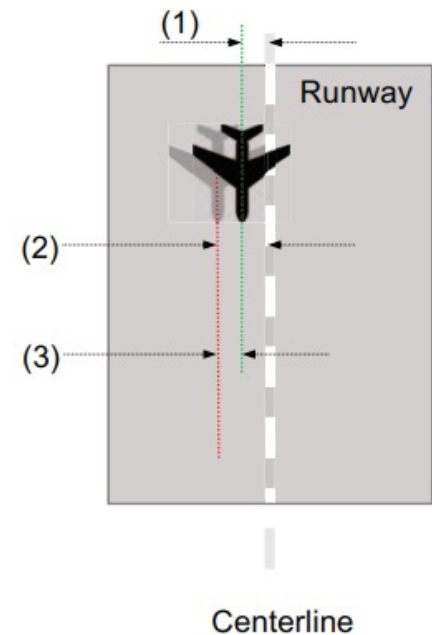
Derived TROUPE requirement

- **For the entire mission:** *The probability of collision with an obstacle shall be less than 1%*
- **For a specific error (e.g., rover pose):** *An error X is likely to occur with a probability 5%.*
- **Derived requirement:** *Given error X, rover shall always avoid collisions with a probability less than <calculatedValueToSatisfyMissionRqt>*

It implicitly defines the integrity of the barrier preventing or recovering from error X.

Probabilistic requirement patterns

“What is the probability of *error* conditioned on the model *never aborting*”



Conditional probabilities

What is the probability of *formula1* conditioned on *formula2*

Conditional probabilities



“What is the probability of error conditioned on the model never aborting”
FRETish: Upon !Future(abort) the aircraft shall with what probability eventually satisfy error

$$P=?[F[\text{error}] \ \& \ (! \ (F \ \text{abort}))] \ / \ P=? \ [! \ (F \ \text{abort}) \]$$

Requirement Patterns

- 13 sanitized patterns
- Obtained by manually analyzing 770 requirements
- Missions and industrial case studies that use AI



“The sw shall estimate PARAMETER to be within +- X with a Y% confidence”