

Automated Display Testing in Test PASS

May 30, 2019

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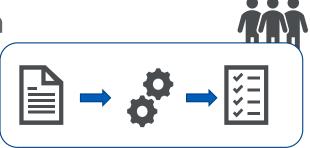
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- Operating earnings and EPS, which is earnings from continuing operations excluding non-service-related pension costs of our principal pension plans.
- GE Industrial operating & Verticals earnings and EPS, which is operating earnings of our industrial businesses and the GE Capital businesses that we expect to retain.
- GE Industrial & Verticals revenues, which is revenue of our industrial businesses and the GE Capital businesses that we expect to retain.
- Industrial segment organic revenue, which is the sum of revenue from all of our industrial segments less the effects of acquisitions/dispositions and currency exchange.
- Industrial segment organic operating profit, which is the sum of segment profit from all of our industrial segments less the effects of acquisitions/dispositions and currency exchange.
- Industrial cash flows from operating activities (Industrial CFOA), which is GE's cash flow from operating activities excluding dividends received from GE Capital.
- Capital ending net investment (ENI), excluding liquidity, which is a measure we use to measure the size of our Capital segment.
- GE Capital Tier 1 Common ratio estimate is a ratio of equity

Features of Test PASS

- Abbreviation: "Test Platform for Safety-Critical Systems"
- Integration of test environments
- Remote management and execution of tests
- Generation of unified report with rich information
- Test environment for display enhanced devices

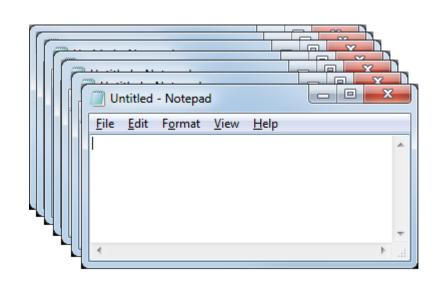


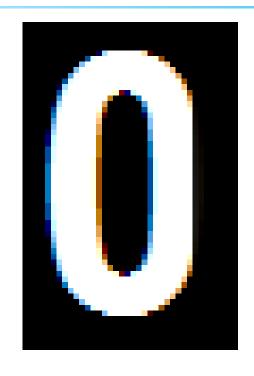


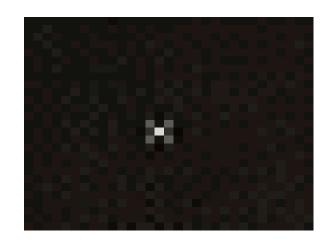




Graphical errors of displays







Glitches

Cropping Occlusions

Dead









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Functional errors of displays

Failure to satisfy requirements



VS

Requirement.
The displayed speed shall be lower than 35 knots.









Automation

Pros:

- Less human work
- Lower cost
- Greater precision
- Effective defect finders
- Repeatability

Cons:

- Complex algorithms
- Machine Learning cannot be analyzed not fully tested
- Credibility issues









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Test PASS approach

- Automate reasoning about displayed content
- Simplify testing for displays
- Provide a language for description of user interface
- Move all advanced machine vision out of qualification rigor
- Qualify only a small piece of image processing code
- Express requirements with image semantics



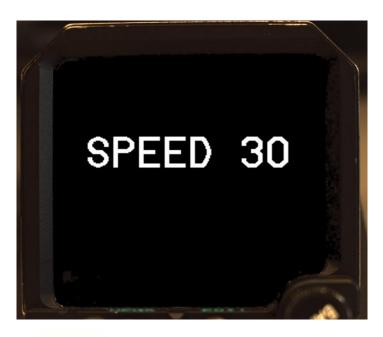






Problem to be solved

How to eliminate a human from testing of displays?





Requirement.
Displayed speed shall be lower than 35 knots.







Verification by comparison

- Compare reference and captured image
- use industrial metric (e.g. MSE, SSIM) and apply thresholding





IMAGES ARE CONSISTENT TEST PASSED!









Verification by comparison

- The only qualifiable part of image processing
- One takes credit only if comparison algorithms assesses that images are consistent
- Reducing number of false positives improves reliability of the tool but does not affect <u>correctness</u>









Verification by comparison

Issues:

- Separate image for each testcase => expensive test development
- Cannot handle undefined parts of image (except simple masking)
- Cannot express requirements like "Speed shall be lower than 35 knots"









Parametrized models (p-models)

- Description of an image
- Human readable
- XML based
- Structured
- Renderable
- Stateless



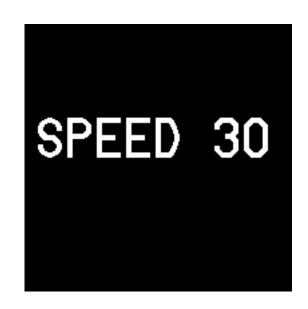






P-Models - rendering

```
<svg width="192" height="192"</pre>
xmlns="http://www.w3.org/2000/svg">
<rect width="100%" height="100%" fill="black"/>
<text id="speed"
      font-size="30"
                                              Rendering
      fill="white"
      x="6" y="96"
      >SPEED 30</text>
</svg>
```











P-Models - reasoning

```
<svg width="192" height="192"</pre>
xmlns="http://www.w3.org/2000/svg">
<rect width="100%" height="100%" fill="black"/>
                                                                    # Formal specification of requirement
<text id="speed"
                                                                    speed = int(model.speed.text[-2:])
      font-size="30"
                                                                    Assert(speed < 35)
      fill="white"
      x="6" y="96"
      >SPEED 30</text>
</svg>
```









P-model verification – key idea

- If
- The model is a correct interpretation of captured image and
- The model satisfies requirements
- Then
- Captured image satisfies requirements







P-model verification

- Consistency between model and captured image is verified by
 - Rendering reference image from model
 - Comparing captured image with reference one
 - If comparison succeeds then the model correctly interprets a captured image

- Requirements are checked against model
 - Substitute all model attributes to formal specification of requirements
 - Check if all assertions evaluate to "TRUTH"

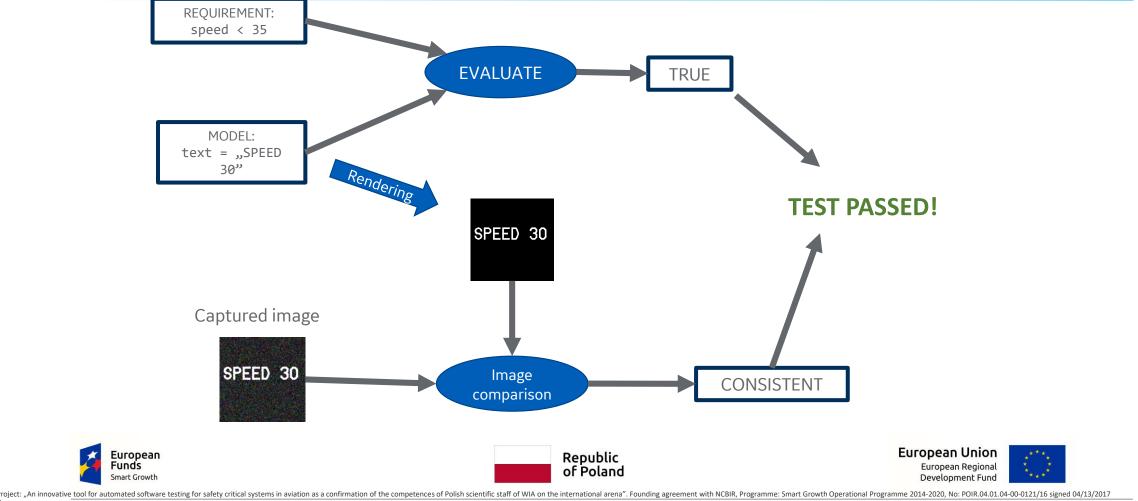








P-Models: verification



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P-Models - parameters

- typed inputs to p-models
- improved flexibility and expresiveness
- parameters are defined at some point.
 - Process known as "concretization"
 - The p-model is then called "concretized model"

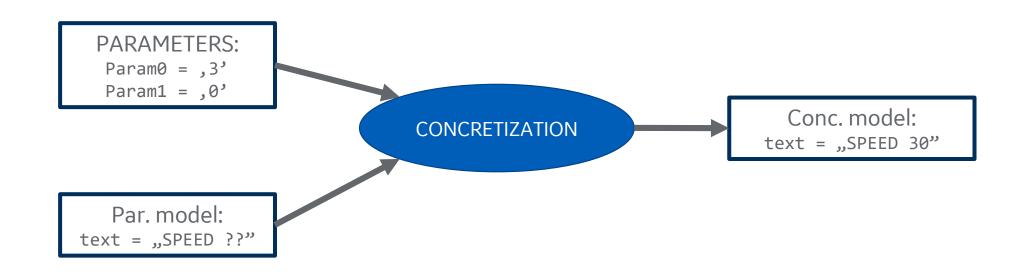








P-Models- concretization



PARAMETRIZED MODEL + PARAMETERS = CONCRETIZED MODEL









Parameters - How can we find their value?

- Can be provided by a user
- Can be enumerated algorithmically
- Can be estimated with machine vision









Parameters - How can we trust their value?

- All provided parameters are actually candidate parameters
- Parameters are verified by comparison of captured image with reference image generated from the parameters
- Thus a source of parameters does not matter
- The origin of parameters is put outside of qualification credits



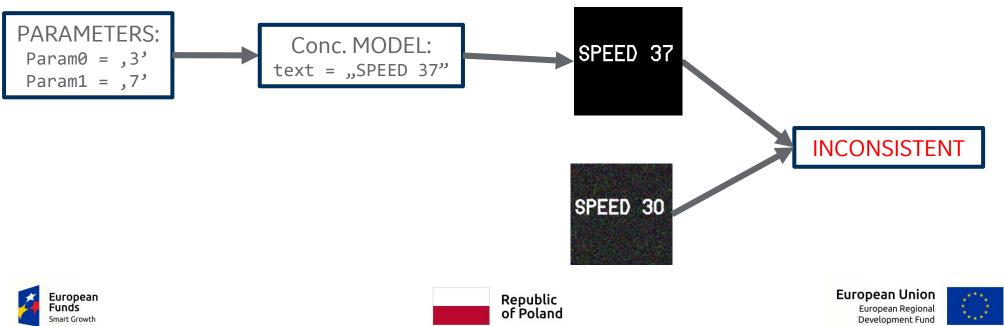






Parameters - How can we trust their value?

- Invalid parameter will either:
 - Cause failed comparison between reference and capture image

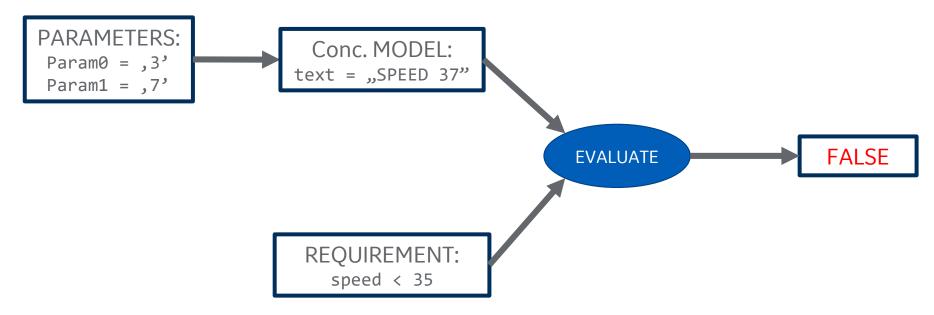






Parameters - How can we trust their value?

Or cause failure during testing if requirements are satisfied









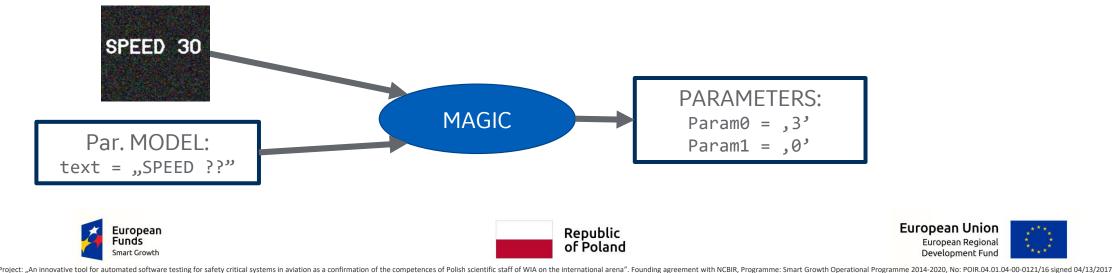


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MAGIC

Presentation Title

- Magic Algorithms for Graphical Interface Concretization (MAGIC)
- Software library for handling MAGIC models
- Map an image to candidate parameters





MAGIC - Algorithms

- Discrete optimization Find parameters by minimizing difference between rendered from models with captured image Effective for small domains and small number of parameters Effective if parameters have independent impact on rendered image
- Machine Learning (ML) Deep Neural Network that maps image to parameters
- User defined MAGIC provides interface for user-defined MAGIC models User-defined models can be combined to larger ones

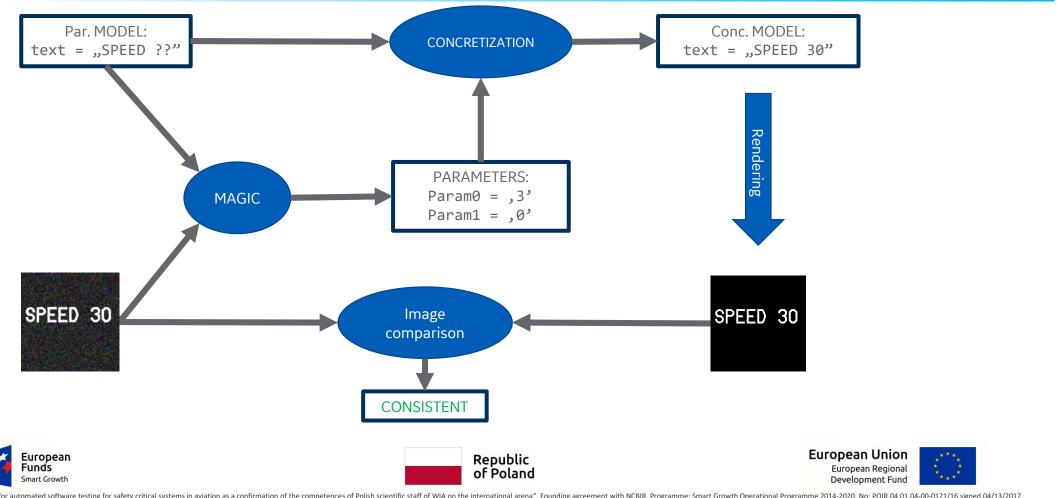








MAGIC - Verification of candidate parameters





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Test PASS Displays – pros

- Great flexibility for testers
 - Models guide machine how to interpret images
 - Models provide structured interpretation of images
- Capability for formal specification for requirements
 - Tester can precisely describe features to be tested rather than saying "image looks correct" in a test procedure
- Allows automated reasoning about displays
 - Eliminates human observer from a test









Test PASS Displays – pros

- Complex machine vision and machine learning algorithms are moved outside qualification credits
- Tester DOES NOT have to implement and/or qualify any image recognition algorithms
 - "If one can render it, then one can test it" philosophy
- Expected reductions of costs of testing:
 - Implementation of tests
 - Performing tests









Test PASS Displays vs Model-based Design

- "Correct-by-Construction" principle
- Use model to generate the actual implementation
- Generally models have states and complex logic
- Require comprehensive syntax
- Issues with usage for existing/legacy products
 - Except Test validation/generation
- Actually complementary to Test PASS
 - Test PASS Displays offer means of expressing reqt and tests









Test PASS Displays vs Machine Vision

- Qualification of ML algorithms requires a lot of training data
 - representative
 - labeled
 - expensive
- In Test PASS:
 - algorithms are not qualified
 - each output is verified for each execution of a test
 - false negatives are only expected type of error









Q&A



