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EVALUATING RECONFIGURATION IMPACT IN
SELF-ADAPTIVE SYSTEMS

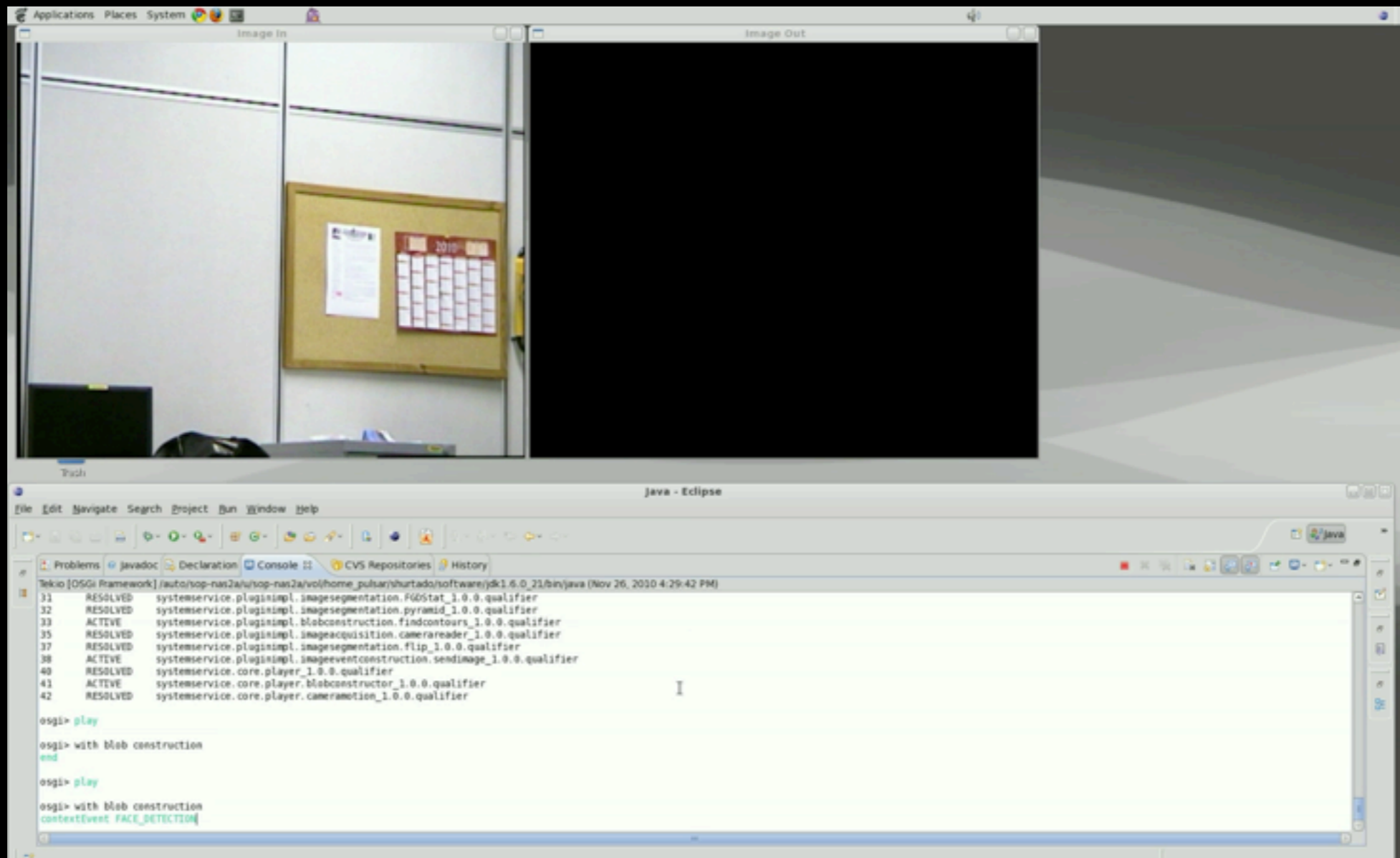
AN APPROACH BASED ON COMBINATORIAL
INTERACTION TESTING

August 27, 2015 12h30-12h45, SEAA 2015, Funchal Madeira

OUTLINE

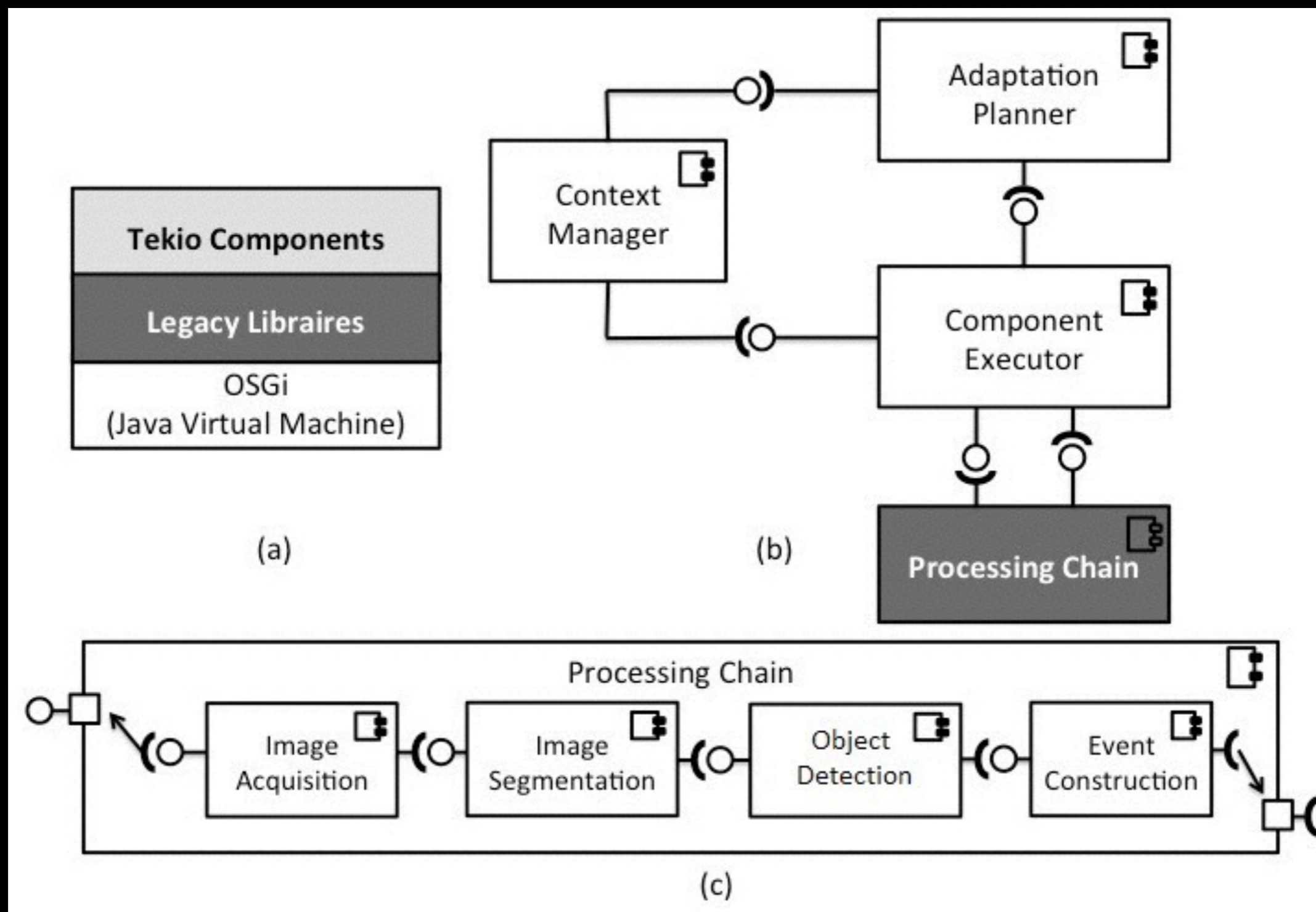
- **problem context**
- approach to generate test sequence of reconfigurations
- preliminary validation
- what impact can this work have?

TEKIO: A SELF-ADAPTIVE VISION SYSTEM



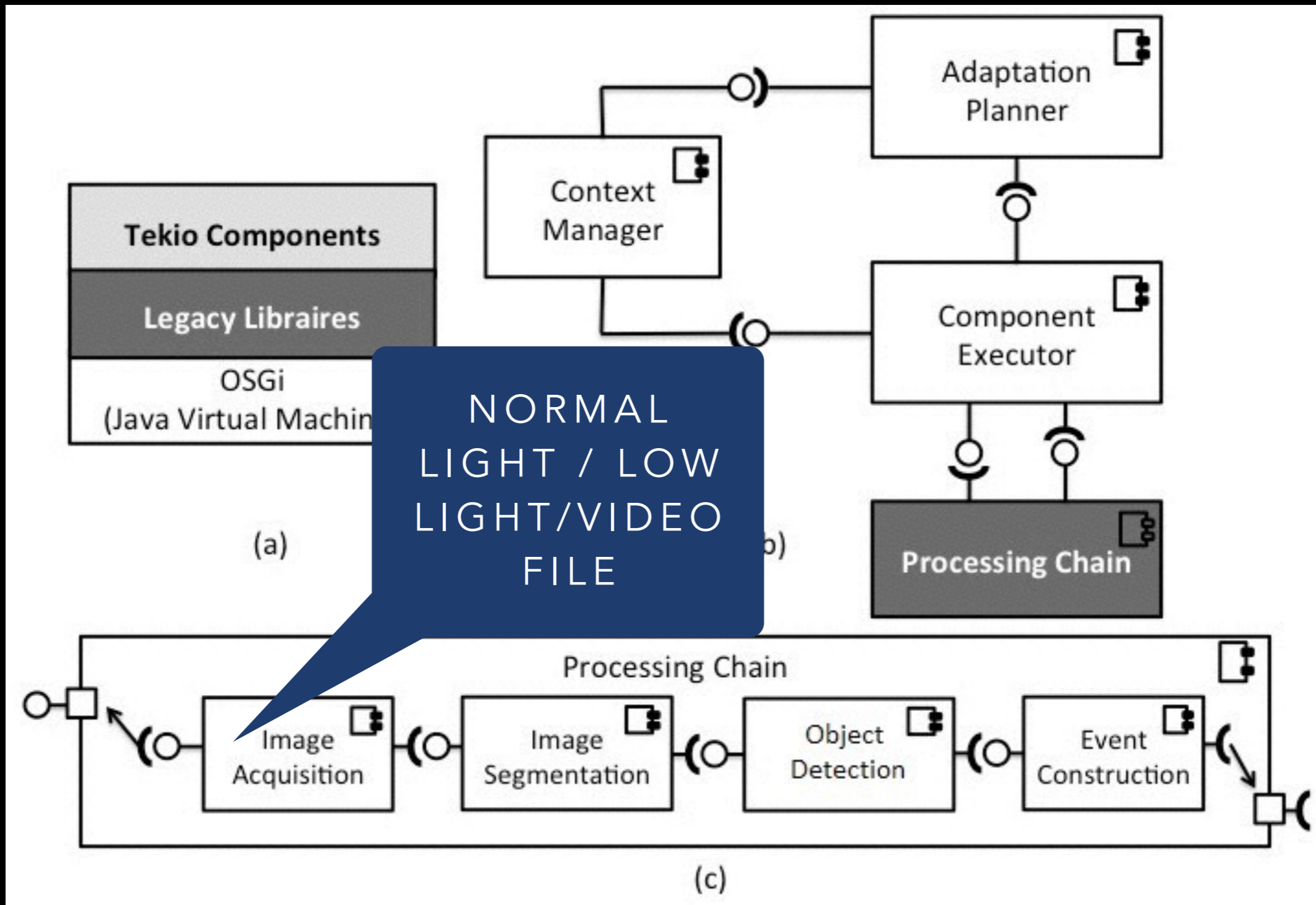
Software system that adapts due to change in operational context

TEKIO'S ARCHITECTURE

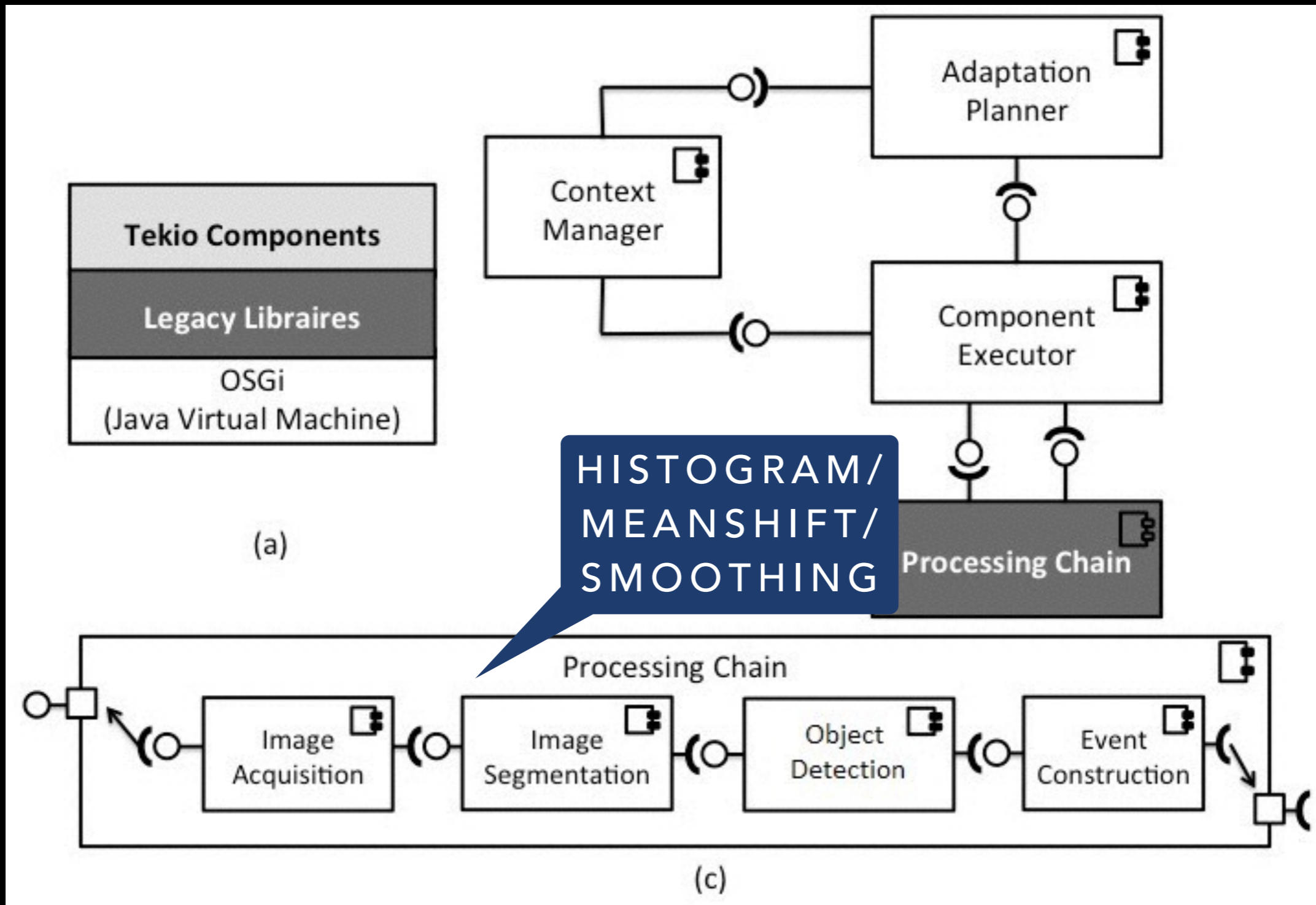


Santiago Hurtado, Sagar Sen, and Rubby Casallas. 2011. Reusing legacy software in a self-adaptive middleware framework. (ARM '11). ACM, New York, NY, USA, 29-35.

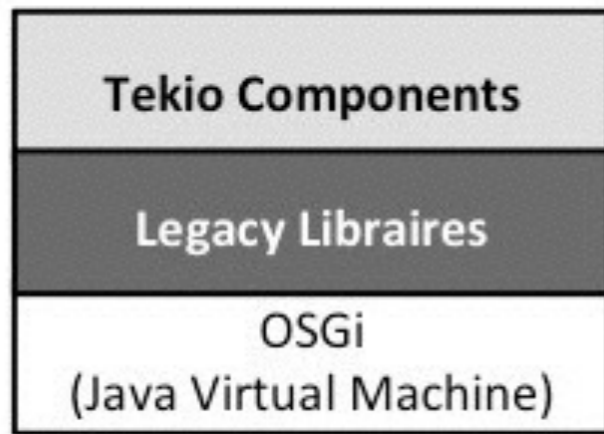
SEVERAL POSSIBLE WAYS TO CONFIGURE



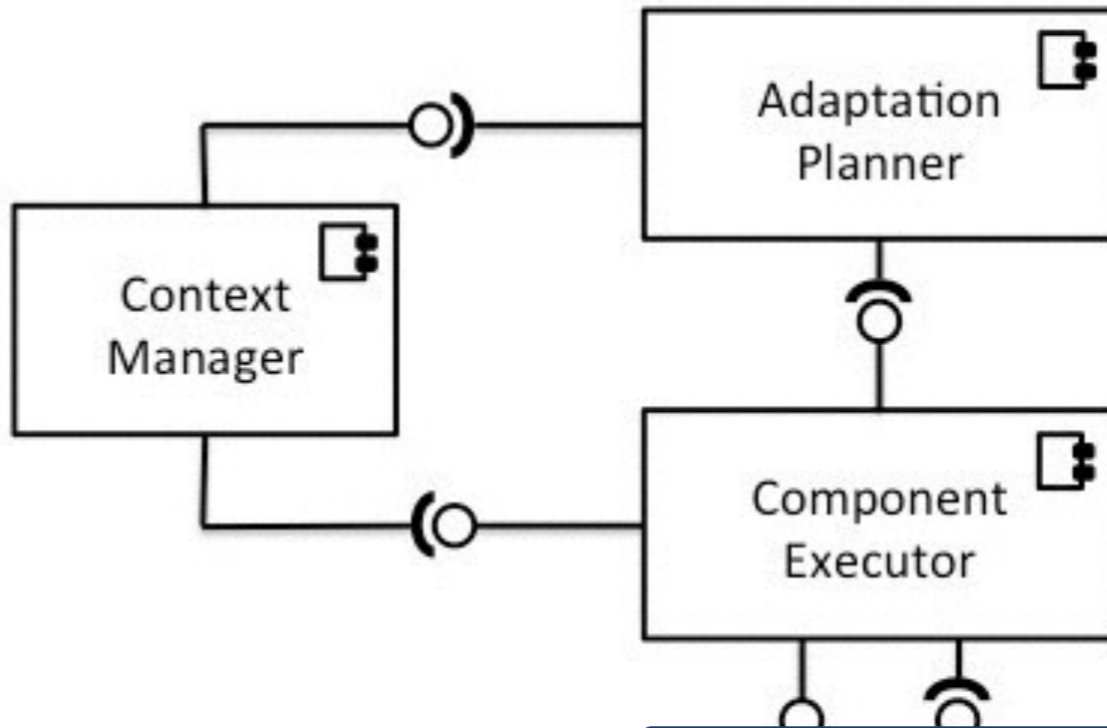
SEVERAL POSSIBLE WAYS TO CONFIGURE



SEVERAL POSSIBLE WAYS TO CONFIGURE

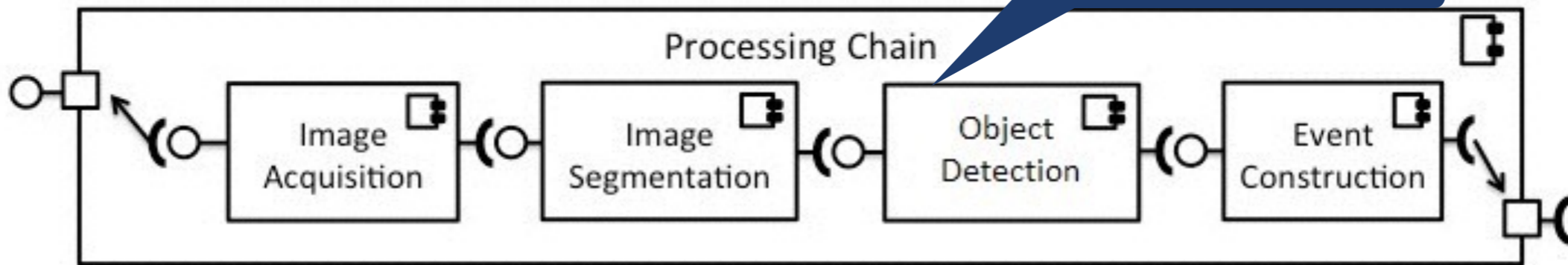


(a)



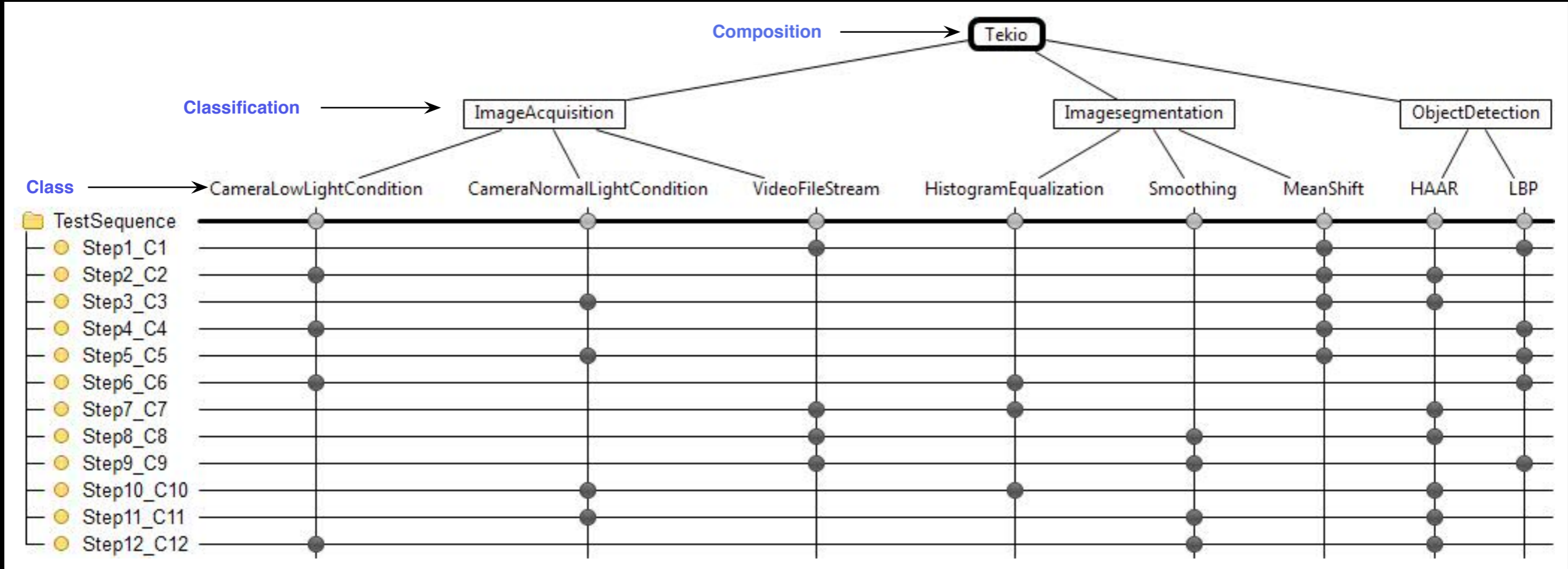
(b)

HAAR/LBP



(c)

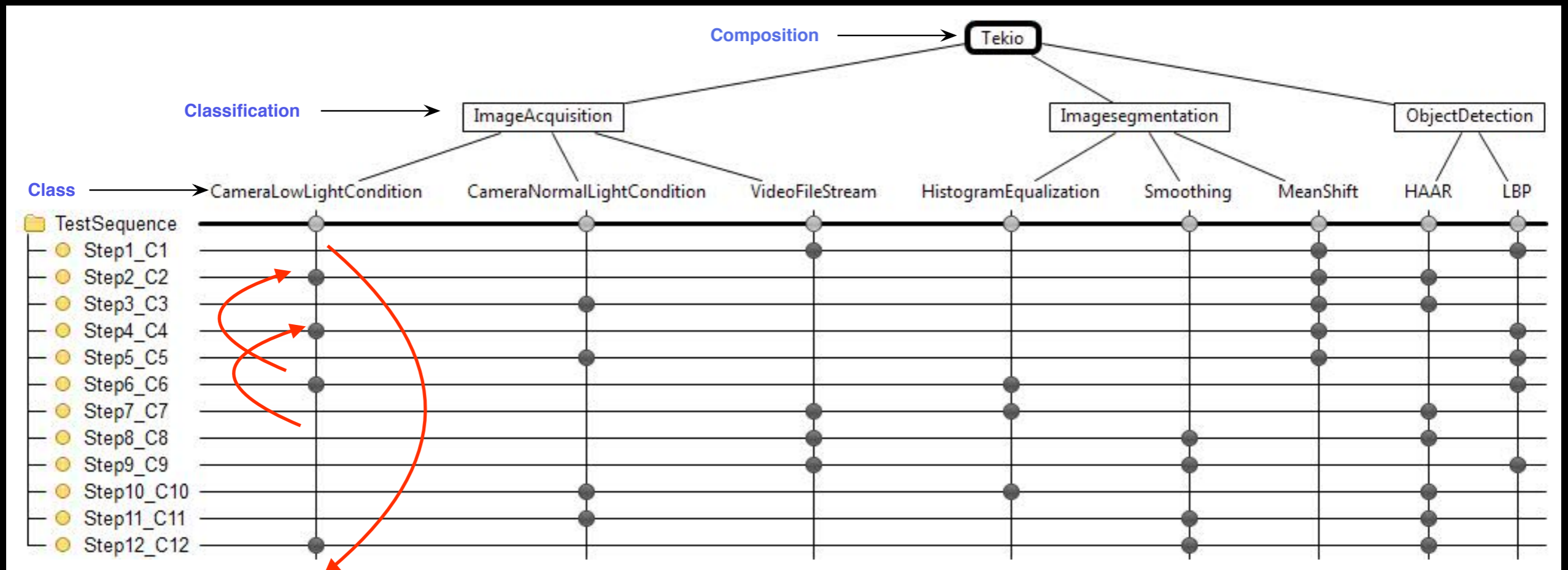
MODELLING VARIABILITY WITH CLASSIFICATION TREES



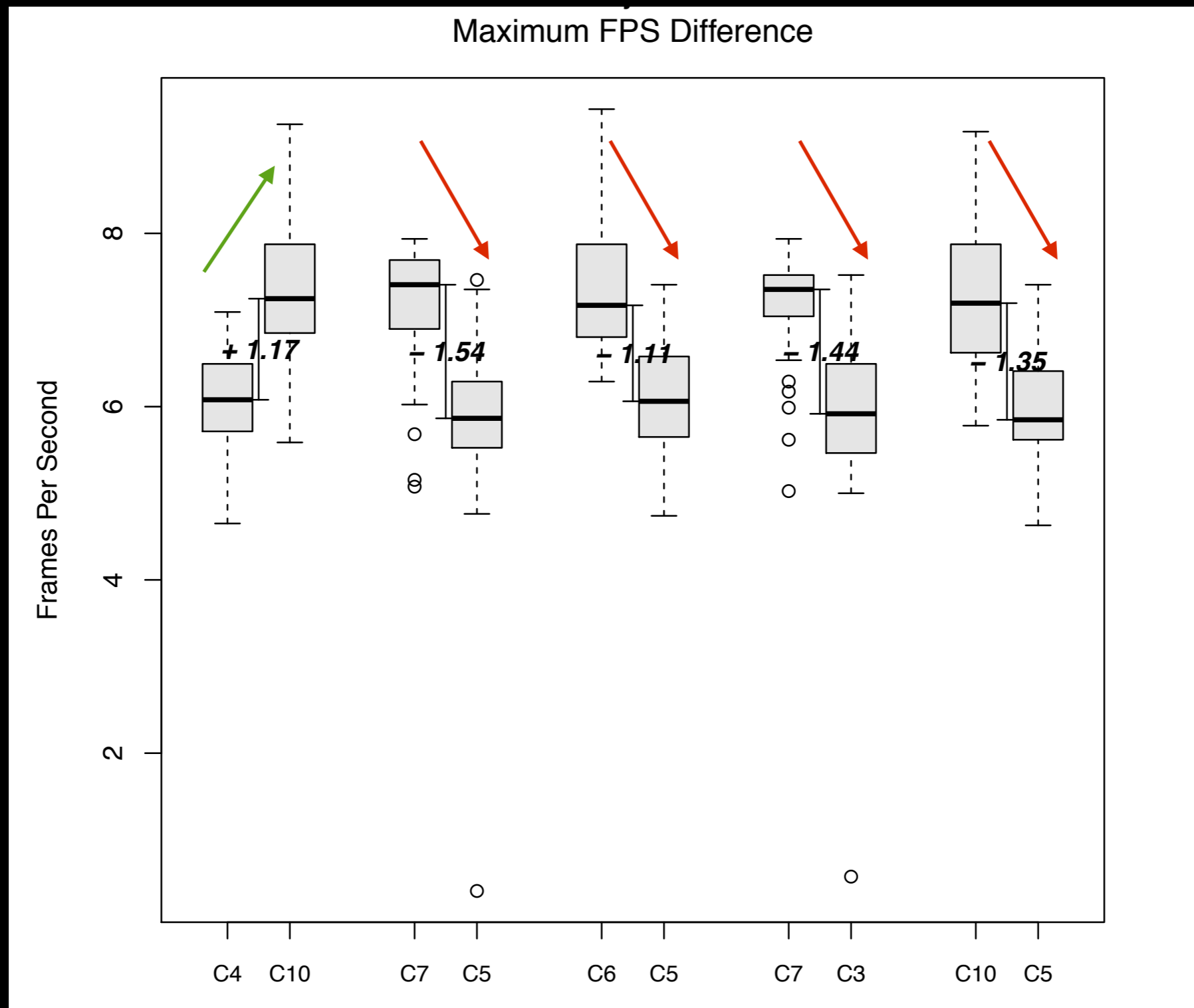
configurations

- What can happen when we **arbitrarily reconfigure** the self-adaptive system based on contextual changes?

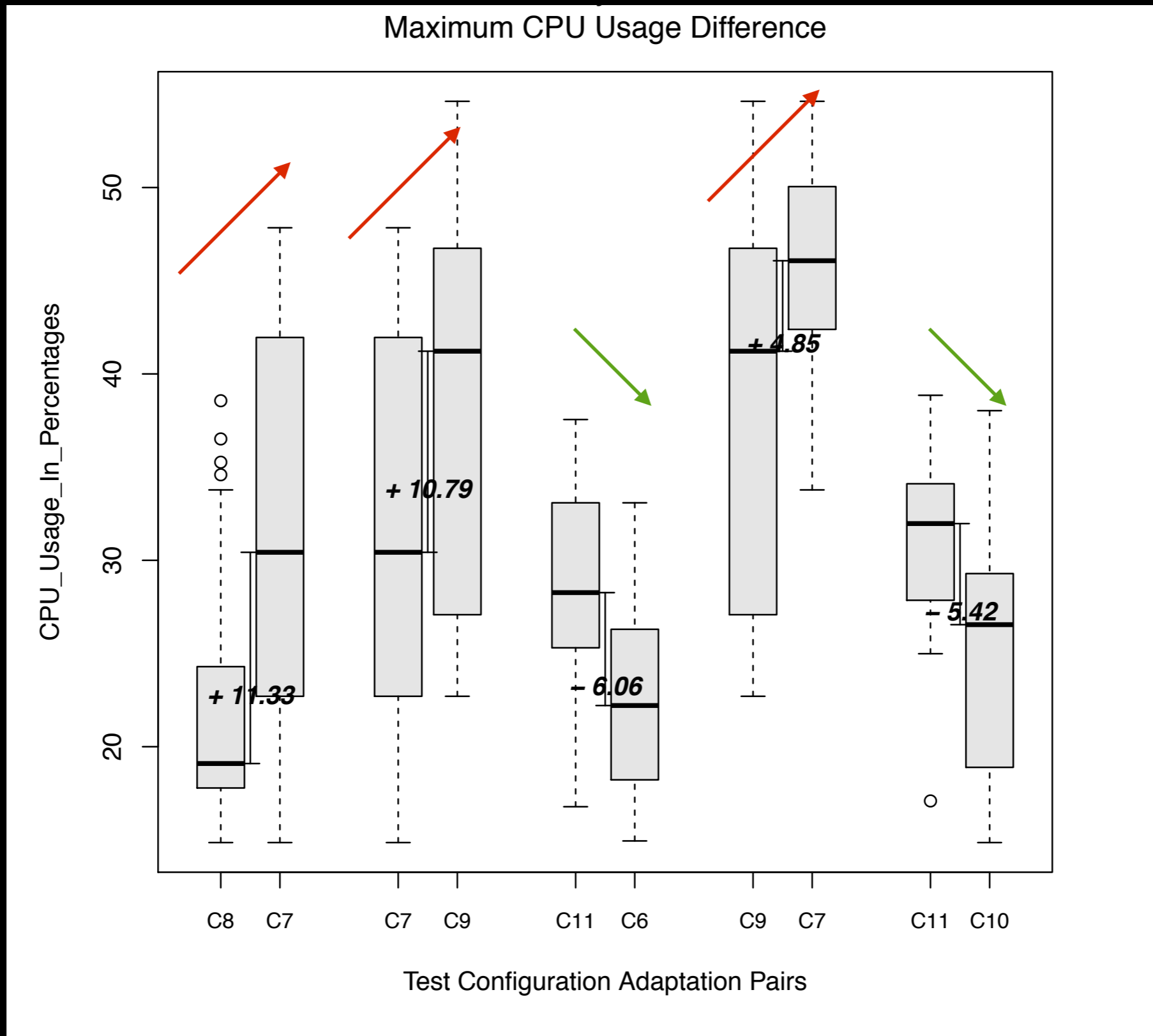
RECONFIGURATION



IMPACT ON QOS (FRAME RATE)



IMPACT OF QOS (CPU USAGE)



CHALLENGE

- How can we generate an **adequate test sequence** of reconfigurations such that we can **understand and evaluate reconfiguration impact** on QoS?

OUTLINE

- a challenge in testing self-adaptive systems
- **approach to generate test sequence of reconfigurations**
- preliminary validation
- what impact can this work have?

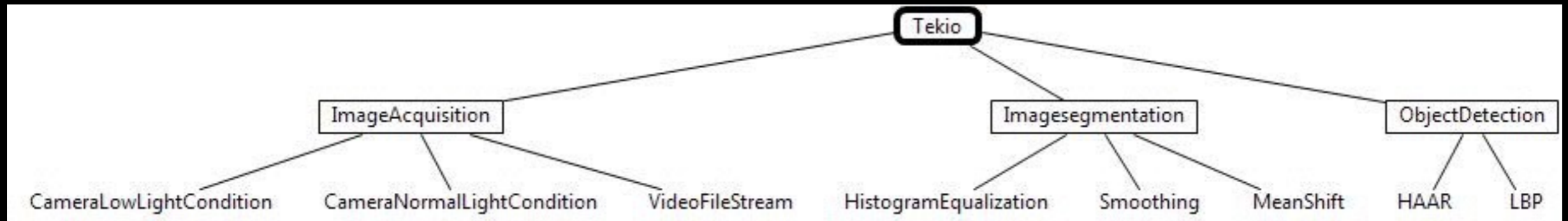
CONDITIONS FOR THE TEST SEQUENCE ADEQUACY

- It is a minimal sequence of **repeated configurations** of an adaptive system
- Configurations in the sequence must cover **T-wise** (pairwise in most cases) interactions between variable/mutable features. Eg. interaction between object detection and image segmentation
- Sequence must **satisfy constraints between adaptable features** (such as only one of two possible object detection algorithms can be used in a configuration)
- The sequence must cover all valid **R-wise interactions** (hops) between configurations.



Step 1: Generating **configurations** covering T-wise interactions

TRANSFORMATION OF CLASSIFICATION TREE TO ALLOY



transform



constraint satisfaction problem in a lightweight formal
method Alloy

ALLOY

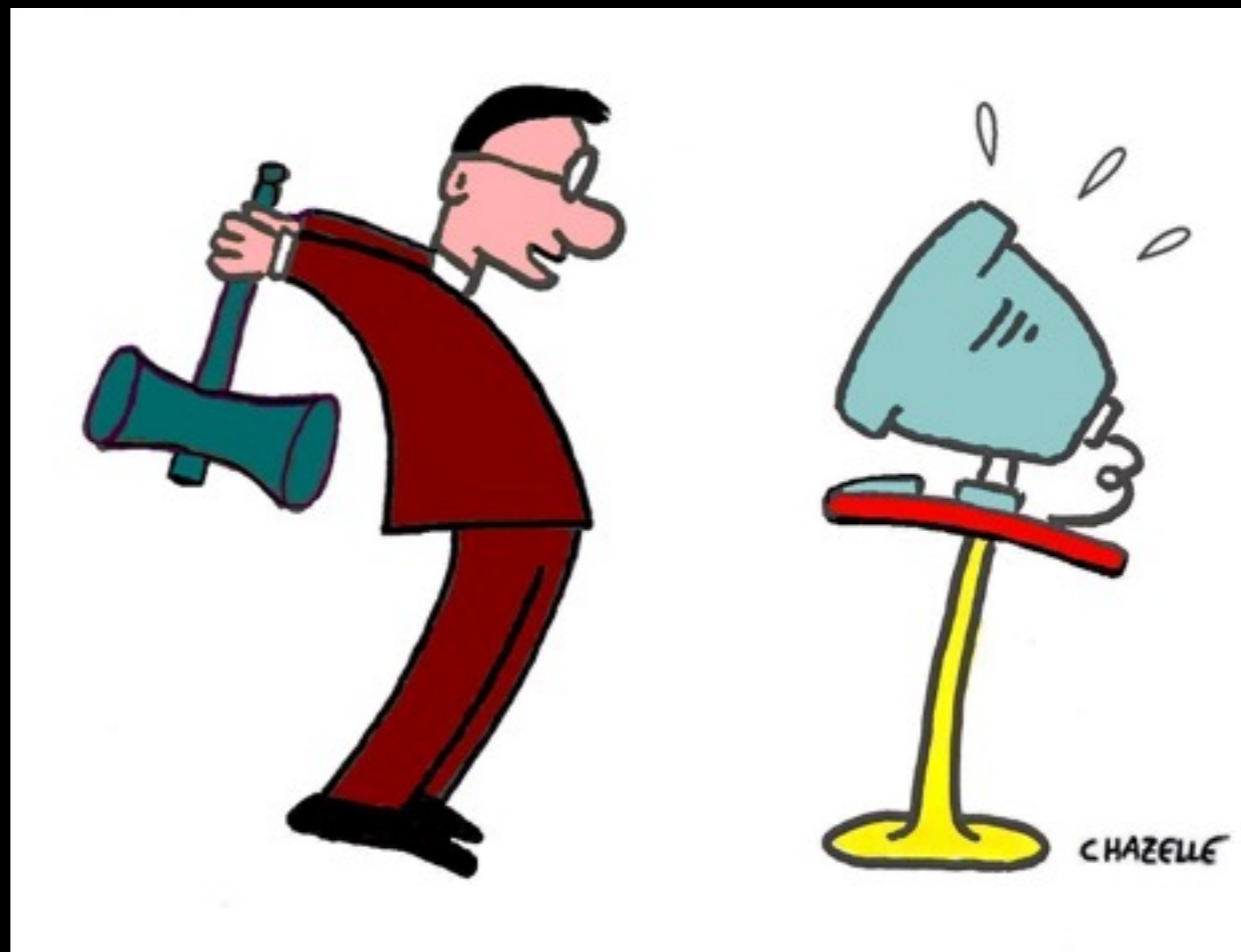
- The Alloy language can represent a modelling domain such as classification trees in **first-order relational logic with quantifiers**.
- Alloy **signatures** define a finite set of "**atoms**" immutable named entities. Eg. The signature Integer has atoms -2,-1,0,1,2,..etc. in the a finite scope of 2.
- Alloy **facts, predicates, and functions** specify constraints between atoms as "**relations**". Eg. The relation "**xor**" between two signatures is a 2-tuple relation
- Alloy Analyser transforms a modelling domain to 3-Conjunctive Normal Form to be solved by a SAT solver such as MiniSAT in a **finite scope**. The solver create atoms in the scope and determines **an assignment for all relations** called an **Alloy instance**.
- Alloy instances can then be **transformed back to a a set of configurations**

HIGHLIGHTS OF TRANSFORMATION

- **Features** of the adaptive system are Alloy signatures
- A **Configuration** signature is a relation towards a set of features
- A **ConfigurationSet** signature is relation to a set of configurations
- Constraints between features are transformed to **Alloy facts**
- T-wise combinatorial interactions between features are transformed to a set of $2^T C(N,T)$ **Alloy predicates**

(Details of transformation in the paper)

- Goal is to solve the Alloy model to obtain a **ConfigurationSet**
- With a **minimal** number of configurations that **satisfies all valid T-wise interaction predicates**
- **Intractable**



INCREMENTAL GROWTH OF CONFIGURATION SET

- We **incrementally grow** configuration sets until all T-wise predicates are solved in a **finite scope**.
- We **merge all configuration sets** into a one set of configurations that cover all T-wise predicates.



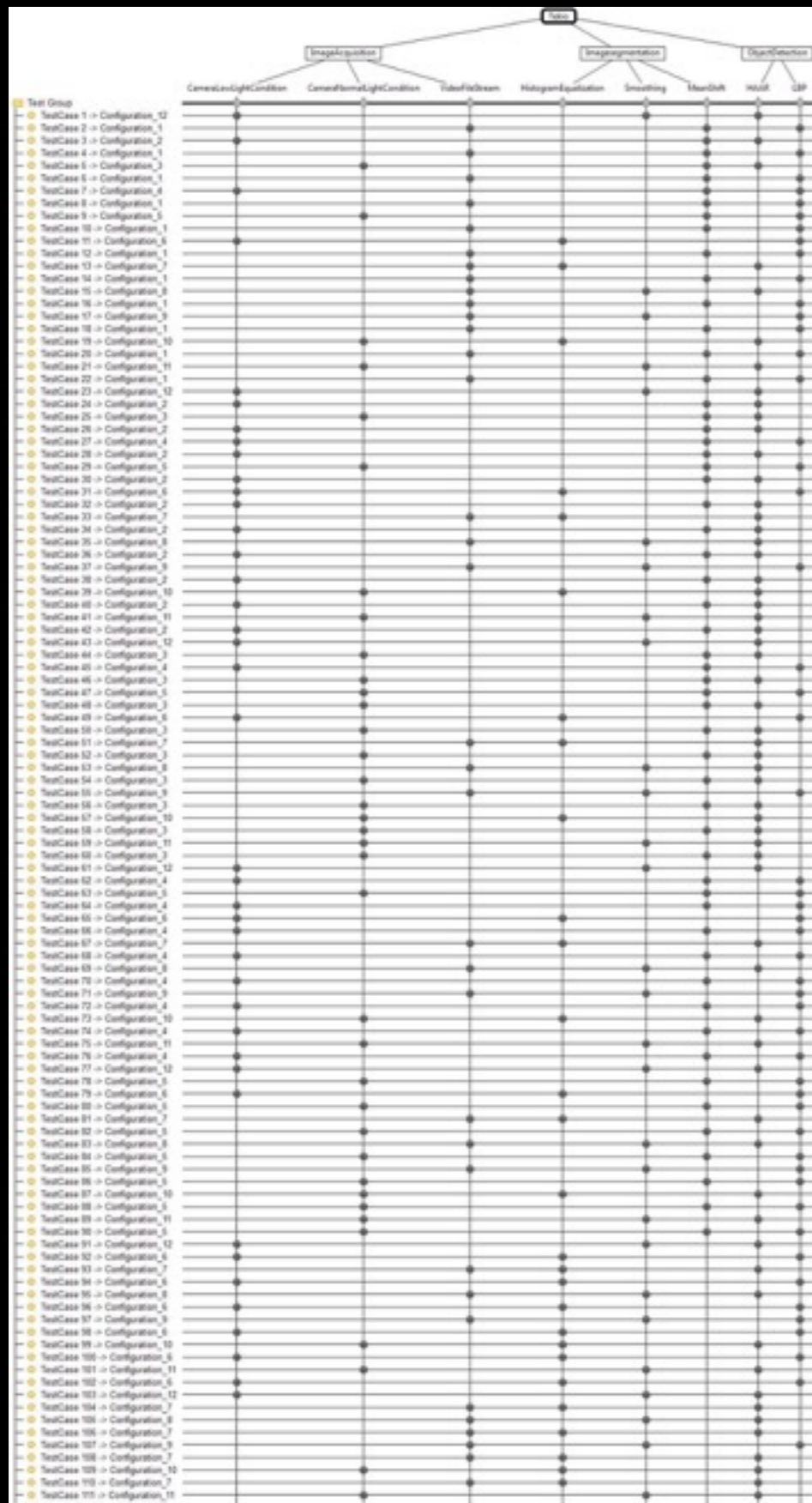


Step 2: Generating a **test sequence** covering R-wise hops between configurations from Step 1

TEST SEQUENCE THAT COVERS ALL R-WISE

- Given a set of **K** configurations that cover T-wise interactions between features we generate all **R-permutations** of the set of K configurations.
- Test sequence satisfying all R-wise permutations contains **$K!/(K-R)!$** reconfigurations

RESULT LOOKS LIKE THIS FOR TEKIO



132 Reconfigurations covering
all **pairwise feature interactions**
and
pairwise reconfigurations
between configurations for Tekio

OUTLINE

- a challenge in testing self-adaptive systems
- approach to generate test sequence of reconfigurations
- **preliminary validation**
- what impact can this work have?

PRELIMINARY VALIDATION

- We measured CPU Usage, Frame rate, and Memory usage in Tekio by running the sequence of 132 reconfigurations about 100 times
- We discovered **several critical reconfigurations** that consistently led to fluctuations in **CPU usage** and **frame rate**.
- These reconfigurations eventually helped develop **adaptation rules** for **stable QoS**

OUTLINE

- a challenge in testing self-adaptive systems
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IMPACT

- (Self-)adaptive component-based systems empower **software reuse** and **evolution** and change behaviour at runtime
- However, this comes the “cost” of **unknown and unexpected behaviour**
- We aim to tame this unpredictability by understanding **reconfiguration impact** with **combinatorial interaction testing**
- **Combinatorial interaction testing** gives good **coverage** of behaviour and is successful in detecting unpredictability
- Not much better than **random testing**

Thank you!
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