# Learning finite state machine models of evolving systems: From evolution over time to variability in space

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- 1. Introduction
- 2. Research Problem
- 3. Research Objectives
  - Learning to Reuse
  - Learning from Difference
  - Learning by Sampling
- 4. Final Remarks and Future Work

#### Software maintenance [IEEE, 2006]

"... modifications after delivery to correct

faults, to improve non-functional attributes ..."





#### Software evolution [Lehman, 1979]

"... programs must be modified because they operate in or address problems in the real world ..."

IEEE, 'ISO/IEC/IEEE International Standard for Software Engineering - Software Life Cycle Processes - Maintenance', ISO/IEC 14764:2006, pp. 1–58, Sep. 2006 M. M. Lehman, 'On understanding laws, evolution, and conservation in the large-program life cycle', Journal of Systems and Software, vol. 1, pp. 213–221, 1979



K. Pohl, G. Böckle, and F. J. van der Linden, Software Product Line Engineering: Foundations, Principles and Techniques. Secaucus, NJ, USA: Springer-Verlag New York, Inc., 2005. H. Chockler, D. Kroening, L. Mariani, and N. Sharygina, Eds., Validation of Evolving Software. Cham: Springer International Publishing, 2015. M. S. Deutsch, 'Tutorial Series 7 Software Project Verification and Validation', Computer, vol. 14, no. 4, pp. 54–70, Apr. 1981









T. Thüm, S. Apel, C. Kästner, I. Schaefer, and G. Saake, 'A Classification and Survey of Analysis Strategies for Software Product Lines', ACM Comput. Surv., vol. 47, no. 1, p. 6:1–6:45, Jun. 2014 V. Hafemann Fragal, A. Simao, and M. R. Mousavi, 'Validated Test Models for Software Product Lines: Featured Finite State Machines', in `FACS 2016.

S. Oster, 'Feature Model-based Software Product Line Testing', PhD Thesis, Technische Universität, Darmstadt, 2012.



Source code and models should be maintained and evolve together!

#### **Research Problem**

# How can we efficiently and effectively learn finite state machines specifying the behavior of an evolving system?

## **Research Objectives**



# Learning to Reuse

#### Adaptive Model Learning for Evolving Systems







#### **Context** (Learning to Reuse)

- 1. Software analysis is a *model-based* activity
  - Models stuck to engineers' minds
  - Formally denoted as explicit models
- 2. Software undergoes changes along the life-cycle
  - Evolution over-time (e.g., update, upgrade)
  - Models may become outdated





#### Research Problem (Learning to Reuse)



How can we efficiently construct behavioral models from evolving systems?

#### **Contribution** (Learning to Reuse)



An adaptive algorithm that is **more efficient** than the state-of-the-art for **learning behavioral models** from **evolving systems** 

# **Model Learning**



D. Angluin, 'Learning regular sets from queries and counterexamples', Information and Computation, vol. 75, no. 2, pp. 87–106, 1987 F. Vaandrager, 'Model Learning', Commun. ACM, vol. 60, no. 2, pp. 86–95, Jan. 2017

#### **System Under Learning**



Figure: Windscreen wiper supporting intervaled and fast wiping

### **Model Learning**



Figure: Final Hypothesis

		rain	swItv	$\texttt{rain} \cdot \texttt{rain}$
S	$\epsilon$	0	1	0 · 0
	swItv	1	0	$1 \cdot 0$
	$swltv \cdot rain$	0	1	$0\cdot 1$
5 · 1	rain	0	1	0 · 0
	$swItv \cdot swItv$	0	1	0 · 0
	$swItv \cdot rain \cdot rain$	1	0	$1 \cdot 0$
	$swItv \cdot rain \cdot swItv$	0	1	$0 \cdot 1$

Table: Final OT

EQ = Yes

# What if the SUL evolves?

#### **Model Learning for Evolving Systems**



Figure: Windscreen wiper supporting intervaled and fast wiping + permanent movement

# **Model Learning for Evolving Systems**



# **Adaptive Model Learning**

• What: Variant of model learning Equivalence Oracle Membersh LM Oracle Filte Next snapshot • How: Reuse transfer/separating sequences from existing models Observation Table for HEAD Observation Table for HEAD Deploy current HEAD Reevaluate Observation Table • Why: Speed up model learning Incremental learning (Angluin) Model and Counterexample Model for HEAD^ Model for HEAD system do not refuted conform - Find states maintained in newer versions Model checking w.r.t. current model Counterexample found No counterexample - Reduce the time for model checking Equivalence black box Tester Compare testing counterexample (VC algorithm) with system Conformance established Counterexample confirmed Difference Graph report no report error found counterexample

D. Huistra, J. Meijer, and J. van de Pol, 'Adaptive Learning for Learn-Based Regression Testing', in Formal Methods for Industrial Critical Systems, 2018 S. Windmüller, J. Neubauer, B. Steffen, F. Howar, and O. Bauer, 'Active Continuous Quality Control', in Proceedings of the CBSE 2013 A. Groce, D. Peled, and M. Yannakakis, 'Adaptive Model Checking', in Proceedings of the TACAS 2002

# **Partial-Dynamic** L\*<sub>M</sub> algorithm



# 1) On-the-fly exploration of the reused OT



## 1) On-the-fly exploration of the reused OT



Let the sets of reused prefixes and suffixes be

 $S_r = \{ \epsilon, swltv, swltv \cdot rain, swltv \cdot rain \cdot rain, swltv \cdot rain \cdot rain \cdot swltv, rain \} E_r = \{rain, swltv, swPrm, rain \cdot rain\}$ 

**Goal:** Find a  $S_R \subseteq S_r$  with the same state coverage capability but less prefixes

# 1) On-the-fly exploration of the reused OT



**On-the-fly exploration** of the **tree representation** of the set of **transfer sequences** 

#### 2) Build the experiment cover tree



#### 2) Build the experiment cover tree



Let the sets of prefixes and suffixes be

$$S_R = \{ \epsilon, swltv, swltv \cdot rain, swPrm \}$$

 $E_r = \{rain, swltv, swPrm, rain \cdot rain\}$ 

**Goal:** Find a smaller subset  $E_R \subseteq E_r$  of representative separating sequences.

#### 2) Build the experiment cover tree



**Group transfer sequences** into **equivalence classes** to find a smaller **subset of separating sequences** 

# 3) Starting $L^*_M$ using the outcomes of $\partial L^*_M$



# **Empirical Evaluation**

#### **Empirical Evaluation** (Research Questions)

**RQ1)** Is our technique more efficient than the state-of-the-art

of adaptive learning?

RQ2) Is the effectiveness of adaptive learning strongly affected

by the temporal distance between versions?



D. Huistra, J. Meijer, and J. van de Pol, 'Adaptive Learning for Learn-Based Regression Testing', in Formal Methods for Industrial Critical Systems, 2018

S. Windmüller, J. Neubauer, B. Steffen, F. Howar, and O. Bauer, 'Active Continuous Quality Control', in Proceedings of the CBSE 2013

A. Groce, D. Peled, and M. Yannakakis, 'Adaptive Model Checking', in Proceedings of the TACAS 2002

J. de Ruiter, 'A Tale of the OpenSSL State Machine: A Large-Scale Black-Box Analysis', in Secure IT Systems, vol. 10014, B. B. Brumley and J. Röning, Eds. Cham: Springer, 2016,

M. Isberner, F. Howar, and B. Steffen, 'The Open-Source LearnLib', in CAV 2015

## **Subject Systems**



Subject systems: 18 state machines describing versions of the OpenSSL toolkit

31

OpenSSL Foundation, Inc., 'OpenSSL Releases at Github', 2018. https://github.com/openssl/openssl/releases. J. de Ruiter, 'A Tale of the OpenSSL State Machine: A Large-Scale Black-Box Analysis', in Secure IT Systems, vol. 10014, B. B. Brumley and J. Röning, Eds. Cham: Springer, 2016,

#### Analysis of Results (Average number of MQs)



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#### **Summary** (Learning to Reuse)



The state-of-the-art adaptive learning algorithms...

1. More sensitive to software evolution!

#### The $\partial L^*_{M}$ algorithm ...

- 2. Required fewer MQs than the other techniques
- 3. Temporal distance did not affect its performance



## **Research Objectives**



# **Learning from Difference**

An Automated Approach for Learning Family Models from Software Product Lines







#### **Context** (Learning from Difference)

- Software product lines (SPL)
  - Variability in space (e.g., feature model)
  - Common set of reusable assets
  - Product configurations




#### **Context** (Learning from Difference)

- Analysis and modeling of SPLs
  - Product-based strategies
    - Traditional MBT + Individual product specifications
    - E.g., exhaustive analysis, configuration sampling

#### **ISSUES**

- Redundant analysis
- Scalability (e.g., exponential)
- Feature interaction problem (e.g., T-wise)



#### **Context** (Learning from Difference)

- Analysis and modeling of SPLs
  - Family-based strategies
    - Corner-stone of efficient model-based SPL analysis
    - Family models (e.g., Featured Finite State Machine FFSM)

#### **ISSUES**

- Model maintenance and evolution
- Traceability vs. Crosscutting features
- Commonalities/variabilities are often unknown





T. Thüm, S. Apel, C. Kästner, I. Schaefer, and G. Saake, 'A Classification and Survey of Analysis Strategies for Software Product Lines', ACM Comput. Surv., vol. 47, no. 1, p. 6:1–6:45, Jun. 2014 S. Oster, 'Feature Model-based Software Product Line Testing', PhD Thesis, Technische Universität, Darmstadt, 2012.

V. Hafemann Fragal, A. Simao, and M. R. Mousavi, 'Validated Test Models for Software Product Lines: Featured Finite State Machines', in 'FACS 2016.

#### Research Problem (Learning from Difference)



How can we leverage the concept of model learning to the task of behavioral variability modeling?

#### **Contribution** (Learning from Difference)



The FFSM Difference (FFSM <sub>Diff</sub>) algorithm for **learning succinct family models** from individual product specifications of **software product lines** 

### **Featured Finite State Machines (FFSM)**



An FFSM is a family-based representation of a product-line that unifies product-specific Mealy machines and captures the functionality of features and their interactions in terms of conditional states/transitions

### FFSM Difference (FFSM <sub>Diff</sub>)



The FFSM <sub>Diff</sub> can learn FFSMs from a product models by employing state-based model comparison and express product-specific behaviors with feature constraints using feature model analysis

V. Hafemann Fragal, A. Simao, and M. R. Mousavi, 'Validated Test Models for Software Product Lines: Featured Finite State Machines', in `FACS 2016. N. Walkinshaw and K. Bogdanov, 'Automated Comparison of State-Based Software Models in Terms of Their Language and Structure', ACM TOSEM, vol. 22, 2013 D. Benavides, S. Segura, and A. Ruiz-Cortés, 'Automated analysis of feature models 20 years later: A literature review', Information Systems, vol. 35, no. 6, pp. 615–636, 2010



#### Comparing the Structures of Two State Machines of a Text Editor

$$S_{Succ}^{G}(a,b) = \frac{1}{2} \frac{\sum_{(c,d,i,o) \in Succ_{a,b}} (1+k \times S_{Succ}^{G}(c,d))}{|\sum_{r}^{out}(a) - \sum_{u}^{out}(b)| + |\sum_{r}^{out}(b) - \sum_{u}^{out}(a)| + |Succ_{a,b}|}$$

Figure: Global similarity score <sup>4</sup>

#### Global similarity score (Outgoing and incoming transitions)

- Pairwise similarity based on surrounding matching transitions and connected state pairs.
- Attenuation ratio k gives precedence to the closest state pairs.
- Matching transitions and distinct transitions.

Pair	(St,St)	(St,Po)	(St,Pa)	(Bo,St)	(Bo,Po)	(Bo,Pa)	(Pa,St)	(Pa,Po)	(Pa,Pa)	#Match
(St,St)	10.0	0.0	0.0	0.0	-0.5	0.0	0.0	0.0	0.0	1
(St,Po)	-0.5	8.0	0.0	0.0	0.0	0.0	0.0	0.0	-0.5	2
(St,Pa)	-0.5	0.0	8.0	0.0	-0.5	0.0	0.0	0.0	0.0	2
(Bo,St)	0.0	0.0	0.0	9.5	0.0	0.0	0.0	0.0	0.0	1
(Bo,Po)	0.0	0.0	0.0	0.0	7.5	0.0	0.0	0.0	-0.5	2
(Bo,Pa)	0.0	0.0	0.0	0.0	0.0	12.0	0.0	0.0	0.0	0
(Pa,St)	0.0	0.0	0.0	0.0	-0.5	0.0	7.5	0.0	0.0	2
(Pa,Po)	-0.5	0.0	0.0	0.0	0.0	0.0	0.0	10.0	0.0	1
(Pa,Pa)	-0.5	0.0	0.0	0.0	-0.5	0.0	0.0	0.0	5.5	3

Table 1: Illustration of a system of linear equations





Figure: Two examples of product FSMs and their similarity scores

# The FFSM <sub>Diff</sub> algorithm



Figure: Two examples of product FSMs

pair(St, St) =	0.12
pair(St, Po) =	0.29
pair(St, Pa) =	0.28
pair(Bo, St) =	0.11
pair(Bo, Po) =	0.31
<pre>pair(Bo, Po) = pair(Bo, Pa) =</pre>	<b>0.31</b>
<pre>pair(Bo, Po) = pair(Bo, Pa) = pair(Pa, St) =</pre>	<b>0.31</b> 0 0.29

$$pair(Pa, Pa) = 0.58$$

Figure: Pairwise state similarity

OOurmodification##2Thepstate inapping tissuised to annotate conditional states/transition



Figure: Fragment of the FFSM learnt from two products of the AGM SPL.

Simplified configuration – Example  $\rho_{Bowling} = (W \land \neg S \land \neg B \land \neg N)$   $\rho_{Pong} = (N \land \neg S \land \neg B \land \neg W)$ 

Our modification #3: We use feature model analysis to identify core features of the SPL and simplify feature constrains

**RQ1)** Is our approach effective in learning succinct family models compared to the total size of the product pairs under learning? **RQ2)** Is the size of learned family models influenced by the configuration similarity degree of the products under learning? **RQ3)** Is our approach effective in learning succinct family models compared to the total size of the hand-crafted models?



M. Isberner, F. Howar, and B. Steffen, 'The Open-Source LearnLib', in CAV 2015 Apache, Commons Math: The Apache Commons Mathematics Library. 2016.

T. Thüm, et al., 'FeatureIDE: An extensible framework for feature-oriented software development', Science of Computer Programming, vol. 79, 2014

## **Subject Systems**

	Featu	re model	Family model		
ID	Name	Features	Valid conf.	States	Transitions
AGM	Arcade Game Maker	13	6	6	35
VM	Vending Machine	9	20	14	197
WS	Wiper System	8	8	13	112
AEROUC5	Aero UC5	7	9	25	450
CPTERMINAL	Card Payment	13	30	11	176
MINEPUMP	Minepump	9	32	25	575

Table 10 – Description of the SPLs under learning - Feature and family models

A. Classen, 'Modelling with FTS: a Collection of Illustrative Examples'. 2010, [Online]. Available: https://researchportal.unamur.be/en/publications/modelling-with-fts-a-collection-of-illustrative-examples H. Samih, H. L. Guen, R. Bogusch, M. Acher, and B. Baudry, 'Deriving Usage Model Variants for Model-Based Testing: An Industrial Case Study', in Proceedings of the ICECCS 2014 X. Devroey, G. Perrouin, A. Legay, P.-Y. Schobbens, and P. Heymans, 'Search-based Similarity-driven Behavioural SPL Testing', in Proceedings of the VaMoS 2016 V. Hafemann Fragal, A. Simao, and M. R. Mousavi, 'Validated Test Models for Software Product Lines: Featured Finite State Machines', in `FACS 2016.

### Analysis of Results (RQ1 – Size of Product Pairs)



Figure 26 – Number of transitions in the learned FFSMs and pairs of products

#### Analysis of Results (RQ2 – Configuration similarity)



Pearson correlation coefficient - Pairwise analysis

Figure 28 – Scatter plots for the relationship between the normalized size of the learned FFSM and configuration similarity

### Analysis of Results (RQ3 – Size of Handcrafted models)



Figure 26 – Number of transitions in the learned FFSMs and pairs of products

#### Analysis of Results (RQ3 – Size of Handcrafted models)



Figure 29 – Size of the recovered FFSMs

#### Analysis of Results (RQ3 – Size of Handcrafted models)



**Summary** (Learning from Difference)

The FFSM  $_{\rm Diff}$  algorithm is able to...

1. Learn **fresh FFSMs** from products pairs



- Especially if there is **high feature reuse** (i.e., configuration similarity)
- 2. Incorporate **new product behavior** into an existing FFSM
  - Family model recovery (e.g., reverse engineering, re-engineering)

### **Research Objectives**



# Learning by Sampling

Learning Behavioral Family Models from Software Product Lines







#### **Context** (Learning by Sampling)

- Software product lines (SPL)
  - Product-based strategies: *Impractical*?
  - Family-based strategies: *Models*?
- Family model learning  $\rightarrow$  FFSM <sub>Diff</sub>
  - Exhaustive learning
  - Learning by Sampling





#### Research Problem (Learning by Sampling)



How can we **optimize family model learning** to make it more **effective?** 



Fig. 8: Experiment design - Learning FFSMs by product sampling

M. Isberner, F. Howar, and B. Steffen, 'The Open-Source LearnLib', in CAV 2015 Apache, Commons Math: The Apache Commons Mathematics Library. 2016. T. Thüm, et al., 'FeatureIDE: An extensible framework for feature-oriented software development', Science of Computer Programming, vol. 79, 2014

**RQ4)** Is our approach effective in learning precise family models by sampling compared to exhaustive learning?

### **Subject Systems**

SDI	Size of the sampled subset generated by T-wise					
SEL	Feature-wise	Pair-wise	3-wise	4-wise	All-valid	
AGM	3	6	6	6	6	
VM	2	6	13	19	20	
WS	2	5	8	8	8	
AEROUC5	3	6	9	9	9	
CPTERMINAL	3	8	16	24	30	
MINEPUMP	3	7	13	24	32	

Table 13 – Number of configurations in the subsets generated by each criteria

A. Classen, 'Modelling with FTS: a Collection of Illustrative Examples'. 2010, [Online]. Available: https://researchportal.unamur.be/en/publications/modelling-with-fts-a-collection-of-illustrative-examples H. Samih, H. L. Guen, R. Bogusch, M. Acher, and B. Baudry, 'Deriving Usage Model Variants for Model-Based Testing: An Industrial Case Study', in Proceedings of the ICECCS 2014 X. Devroey, G. Perrouin, A. Legay, P.-Y. Schobbens, and P. Heymans, 'Search-based Similarity-driven Behavioural SPL Testing', in Proceedings of the VaMoS 2016 V. Hafemann Fragal, A. Simao, and M. R. Mousavi, 'Validated Test Models for Software Product Lines: Featured Finite State Machines', in `FACS 2016.

#### Analysis of Results (RQ4 – Learning by Sampling)



#### **Summary** (Learning by Sampling)

**1. Learning by sampling** can lead to family models **as precise as** those obtained **by exhaustive analysis** 

2.Higher interaction strengths lead to higher coverage

3. We show evidences that **product sampling** can be **helpful** to **family model learning and recovery** 



# **Final Remarks and Future Work**









## The main publications of this PhD Thesis



### **Other contributions**



RESEARCH

#### Evaluating test characteristics and effectiveness of FSM-based testing methods on RBAC systems

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1 INTRODUCTION

#### ABSTRACT Access control m

CCS Concepts

ERAD-SP

Aborneter .	i. introduction		
Across control mechanism demand rigrems software tock- ing spranoches, directive there can only as with scrutture ing paraloches, directive there can only as with scrutture ing like-like and Across Control (IRLC) mechanisms and produce the significant program of the software to a structure of the structure of the software to a struc- ture of the structure of the software to a structure of the software structure of the structure of the software the software structure of the software of the software the software structure of the software of the software testing methods for RIAC policies specified as $120$ MeV testing methods for RIAC policies specified as $120$ MeV relating methods for RIAC policies specified as $120$ MeV relating methods for RIAC policies (the software of the software relative of the similar specified as and the software of the software relative structure of the software of the software of the software software of the software of the software of the software of the similar specified as a software of the software of the similar specified as a software of the software relative structure of the similar software of the software software of the RIAC (the similar to the software of the software structures on the RIAC (the dissue). The Similar biotecher of the software of the RIAC (the dissue) that $220$ km similar to the software and the software of the RIAC (the similar to the software of the software structures) are software. There were no differences meang FSM and the graverable (the software the sof	Proving the conductation, impury and antihuling proper dark of the last has been one approximately of the proper dark of the last has been one of the last has been one of the pair. Access on the dark has been one has not been one of the pair of the last has been one of the proper dark has been one of the last has been one of the proper dark has been one of the last has		
CCS Concepts	used to generate very effective test suites, they tend to be very costly, or astronomically large, as they say [14]. Later,		
•Security and privacy → Access control; •Software and its engineering → Formal software verification; Empirical software validation;	Endo and Simno [8] presented evidences that recent FSM testing methods, such as SPY, can reduce the overall test suite length for random FSMs. Although, the similarity be- tween random FSMs and the ones used in practice, such as		
Keywords	these specifying RBAC policies, is unclear. Thus, the out- comes of investigations using pandom FSM models cannot		
Finite state machine; Role-Based Access Control (RBAC); Experiments; Conformance Testing	comes or investigations using random FSM models cannot be generalized to the RBAC domain. In this sense, investi- gations on RBAC testing using FSM are required. Studies		
Permission to make digital or hard copies of all or part of fits work for personal or classroom use is prated without for persokial that copies can not make or altabuted in the second secon	in this domain can improve understanding the potential of FSM based testing methods on RBAC and support VV&T decisions. This paper presents an experimental investigation of the characteristics and the effectiveness of test suities generated by traditional and recent FSM testing methods on the RBAC domain. Two traditional products were all the relations of the statemethod.		
© 2016 Copyright held by the ownerstathor(s). Publication rights licensed to ACM.	one, SPY, were included. Five RBAC policies were speci-		
TMEN 978-1-4303-4201-8/16/09315.00	fied as complete finite state models and tested using each		

#### Trusted Autonomous Vehicles: an Interactive Exhibit

Hugo L. S. Araujo	Genovefa Kefalidou	Jemima Onime	Nervo Xavier Verdezoto
Rayna Dimitrova	Mohammad Reza Mousavi	Jan Onver Kingert José Miguel Rojas	Syed wan

#### School of Informatics University of Leicester (UK)

whiches show that level 2 and 3 autonomous vehicles, which take over all driving Abtourt—Recent surveys about autonessons vhileds show that the public is concerned about the safety consequences of system or equipment failures and the vehicle' reactions to merspected inductions. We believe that informing about the technology and quality, e.g., safety and reliability, of autonessons wheleis is paramount to imporving public repretations, perception and acceptance. In this paper, we report on the design of an interactive calible to illustrate (1) builts technologies complayed in functions under predefined circumstances, yet these systems still rely on the the possibility of a rapid handover of control to human drivers. Several pilots of level 3 and 4 anonomy are ongoing across the world, such as the ones by the American company Waymo<sup>1</sup> or the British company Oxbotica<sup>2</sup>, to name acceptance. In this paper, we report on the shape of an autonomuse whiches, i.e., sources and shep the inductionic and (2) having principles for sourcing their quality, i.e., empiring and/wave testing and simulations. We subsequently report on the delivery of this exhibit titled "Transit Autonomous Viside" at the precoss of expiring and developing the articles and in any exhibit, the theoretical background maximized to them, the design of our stand, and the lowend formation and making the later stell in premuting true in autonomous visides among the general public. <text><text><section-header><text><text><text><text><text> a few. Drawing a precise timeline for the wide adoption of high

This work is supported by the Leicenter AI Network, through a Research Network grant awarded by the Leicenter Institute for Advanced Stadies, the Brend Society Research Exhibition, and Zenic



#### http://www.scirp.org/journal/aimb ISSN Online: 2161-6663

of Molecular Biology, 2018, 8, 26-38

#### **Data Analysis of Multiplex Sequencing** at SOLiD Platform: A Probabilistic **Approach to Characterization** and Reliability Increase

Fábio Manoel França Lobato<sup>1</sup>', Carlos Diego Damasceno<sup>2,3</sup>, Daniela Soares Leite<sup>4</sup>, Åndrea Kelly Ribeiro-dos-Santos<sup>5</sup>, Sylvain Darnet<sup>5</sup>, Carlos Renato Francês<sup>2</sup>, Nandamudi Lankalapalli Vijaykumar<sup>4</sup>, Ådamo Líma de Santana<sup>2</sup>

Taginority and Generice Institute, Federal University of Western Park (UCPP), Statistics, Federal "Reading and Institute, Federal University of Park (UCP), Johns, Budi "Dynamics of Herphong and Parking and Stochassis. Since University of Park (Scarken, Budi "Bhadgaid Scares Institute, Federal University of Park (UCP), Shoc Reals, Budi "Bhadgaid Scares Institute, Federal University of Park (UCP), Shoc Reals, Budi "Bhadgaid Scares Institute, Federal University of Park (UCP), Shoc Reals, Budi "Bhadgaid Scares Institute, Federal University of Park (UCP), Shoc Reals, Budi "Bhadgaid Scares Institute, Federal University of Park (UCP), Shoc Reals, Budi "Bhadgaid Scares Institute, Federal University of Park (UCP), Shoc Reals, Budi "Bhadgaid Scares Institute, Federal University of Park (UCP), Shoc Reals, Budi "Bhadgaid Scares Institute, Federal University of Park (UCP), Shoc Reals, Budi "Bhadgaid Scares Institute, Federal University of Park (UCP), Shoc Reals, Budi "Bhadgaid Scares Institute, Federal University of Park (UCP), Shoc Reals, Budi "Bhadgaid Scares Institute, Federal University of Park (UCP), Shoc Reals, Budi "Bhadgaid Scares Institute, Federal University of Park (UCP), Shoc Reals, Budi "Bhadgaid Scares Institute, Federal University of Park (UCP), Shoc Reals, Budi "Bhadgaid Scares Institute, Federal University of Park (UCP), Shoc Reals, Budi "Bhadgaid Scares Institute, Federal University of Park (UCP), Shoc Reals, Budi "Bhadgaid Scares Institute, Bhadgaid Scares, Bhadgaid Scare Email: \*fabio.lobato@ufopa.edu.be

#### How to che this paper: Lobato, F.M.F. Abstract

amaceno, C.D., Leite, D.S., Ribri- dos-Santos, Å.K., Darnet, S., Francès, R., Vijaykamar, N.L. and de Santana, L. (2018) Data Analysis of Multiplex quencing at SOLID Platform: A Proba- listic Approach to Characterization and	New sequencing technologies such as Illumina/Solexa, SOLID/ABI, an 454/Roche, revolutionized the biological researches. In this context, the SOL ID platform has a particular sequencing type, known as multiplex run, whice enables the sequencing of several samples in a single run. It implies in con-
dability Increase. American Journal of Indexalar Biology. 2, 26–38. https://doi.org/10.4226/amb.2018.81003	reduction and simplifies the analysis of related samples. Meanwhile, this se quencing type requires an additional filtering step to ensure the reliability of the results. Thus, we romone in this name a norbabilistic model which con-
scatrodi Miry 17, 2017 compadi December 19, 2017 hitabadi December 22, 2017	the remains runs, we pupped a popular a prostantine momentum con- siders the intrinsic characteristics of each sequencing to characterize multiple runs and filter low-quality data, increasing the data analysis reliability of mul- tiplex sequencing performed on SOLID. The results show that the propose model moves to be astificiency due to 10 identification of funds in the set
spyright © 2018 by authors and ientific Research Publishing Inc. is work is licensed under the Creative summons Attribution International cense (CC BY 4.0).	quencing process; 2) adaptation and development of new protocols for sampl preparation; 3) the assignment of a degree of confidence to the data generate and 4) guiding a filtering process, without discarding useful sequences in a arbitrary manner.
Орна Ассеня	Keywords

Probabilistic Modeling, Health Informatics, SOLiD Barcoding System, Statistical Analysis, Multiplex Sequencing








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