# Using Synthetic Test Suites to Empirically Compare Search-Based and Greedy Prioritizers

# Zachary Williams

Gregory M. Kapfhammer



Department of Computer Science Allegheny College http://www.cs.alleghenv.edu/

Genetic and Evolutionary Computation Conference Late Breaking Abstract Workshop July 2010

Synthetic Test Suites

Detailed Empirical Study

## Important Contributions



Synthetic Test Suites

**Detailed Empirical Study** 

# Important Contributions



# Important Contributions





#### Correct programing defect

Zachary Williams (Allegheny College)

Synthetic Test Suite Prioritization

GECCO 2010 3 / 11



#### Correct programing defect

Zachary Williams (Allegheny College)

Synthetic Test Suite Prioritization

GECCO 2010 3 / 11



#### Correct programing defect

Zachary Williams (Allegheny College)



#### Correct programing defect

Zachary Williams (Allegheny College)



#### Correct programing defect

Zachary Williams (Allegheny College)



### Correct programing defect

Zachary Williams (Allegheny College)



#### Add new functionallity

Zachary Williams (Allegheny College)



#### Add new functionallity

Zachary Williams (Allegheny College)



#### Modify test suite



#### Modify test suite

Zachary Williams (Allegheny College)



### Complete retesting is often prohibitively expensive

Zachary Williams (Allegheny College)



Requirements necessitate the coverage of the **state** and/or **structure** of a program under test

Zachary Williams (Allegheny College)

Synthetic Test Suite Prioritization

GECCO 2010 4 / 11



Requirements necessitate the coverage of the **state** and/or **structure** of a program under test

Zachary Williams (Allegheny College)

Synthetic Test Suite Prioritization

GECCO 2010 4 / 11



# Requirements necessitate the coverage of the **state** and/or **structure** of a program under test

Zachary Williams (Allegheny College)



Each test covers specific **requirements** in a certain amount of **time** and thus the **ordering** is critical



Each test covers specific **requirements** in a certain amount of **time** and thus the **ordering** is critical



Prioritized test suites cover requirements **faster** thus enabling the **rapid** detection of defects

Zachary Williams (Allegheny College)



Prioritized test suites cover requirements **faster** thus enabling the **rapid** detection of defects

Zachary Williams (Allegheny College)



Prioritized test suites cover requirements **faster** thus enabling the **rapid** detection of defects

Zachary Williams (Allegheny College)



Prioritized test suites cover requirements **faster** thus enabling the **rapid** detection of defects

Zachary Williams (Allegheny College)



Prioritized test suites cover requirements **faster** thus enabling the **rapid** detection of defects

Zachary Williams (Allegheny College)



Prioritized test suites cover requirements **faster** thus enabling the **rapid** detection of defects

Zachary Williams (Allegheny College)



Prioritized test suites cover requirements **faster** thus enabling the **rapid** detection of defects

Zachary Williams (Allegheny College)



Prioritized test suites cover requirements **faster** thus enabling the **rapid** detection of defects

Zachary Williams (Allegheny College)



Prioritized test suites cover requirements **faster** thus enabling the **rapid** detection of defects

Zachary Williams (Allegheny College)



Testers can use **greedy** (Rothermel et al. TSE 2001) and **search-based** (Li et al. TSE 2007) methods to reorder suites



**QUESTION:** Which prioritization technique is the best?

Zachary Williams (Allegheny College)

Greedy approaches select the next best test case Hill climbers search the state space for improved orderings

# **Existing Prioritization Techniques**



Greedy approaches select the next best test case

Hill climbers search the state space for improved orderings

# **Existing Prioritization Techniques**





http://artedi.ebc.uu.se/course/EnboB1/Phylogeny/phylogeny\_readme.html

Greedy approaches select the next best test case

Hill climbers search the state space for improved orderings

# **Existing Prioritization Techniques**





http://artedi.ebc.uu.se/course/Enbo81/Phylogeny/phylogeny\_readme.html

Greedy approaches select the next best test case Hill climbers search the state space for improved orderings

Determine Problem

# These highlighted tasks are **manual**, **expensive**, and **prone to error**

Zachary Williams (Allegheny College)



# These highlighted tasks are **manual**, **expensive**, and **prone to error**



# These highlighted tasks are **manual**, **expensive**, and **prone to error**

Zachary Williams (Allegheny College)

Synthetic Test Suite Prioritization

GECCO 2010 6 / 11



# These highlighted tasks are **manual**, **expensive**, and **prone to error**

Zachary Williams (Allegheny College)

Synthetic Test Suite Prioritization

GECCO 2010 6 / 11



# These highlighted tasks are **manual**, **expensive**, and **prone to error**



# These highlighted tasks are **manual**, **expensive**, and **prone to error**

Zachary Williams (Allegheny College)



Zachary Williams (Allegheny College)



Zachary Williams (Allegheny College)



# The **total number of tests** controls how many tests the suite will contain



# The **total number of requirements** governs how many requirements the test suite will cover



### The **total number of coverage points** controls how many unique test-requirement pairs the test suite will contain



# The **balancing configuration** dictates how the coverage points will be distributed in the synthetic test suite



# Our empirical results show that synthetic generation takes less then **0.2 seconds** for extremely large test suites



### Contains information concerning the **requirements covered** and the **execution time** of each test

Zachary Williams (Allegheny College)

# Empirical Results – Prioritizer Efficiency



# **Empirical Results – Prioritizer Efficiency**



HC demonstrated to be more efficient then GRD for large test suites



As the amount of coverage points in the test suite increases the performance of HC becomes comparable to that of GRD



As the amount of coverage points in the test suite increases the performance of HC becomes comparable to that of GRD



Prioritization Technique

Zachary Williams (Allegheny College)



The trend is evident over a wide range of experimental configurations

Zachary Williams (Allegheny College)

#### Using Synthetic Test Suites to Empirically Compare Search-Based and Greedy Prioritizers

Zachary D. Williams Department of Computer Science Allegheny College williaz@allegheny.edu Gregory M. Kapthammer Department of Computer Science Allegherry College okapfham@alleghenv.edu

#### ABSTRACT

The intermet is the sampling of submet softward has been due to an exist in the program. In order to address the shares of the sampling of th

Engineering) Testing and Debugging General Terman Experimentation, Performance Keywordisi warch-based and greedy test prioritization

#### 1. INTRODUCTION

Software developers often introduce defets during the implementation process. Begivisoin to using methods establish a contribution in the correctness of and isolation of the program by maxing a collection of totak lazers as a tota state. Since negatisation for that defets within the processor is an endering grave the way three commaning, the processor is an endering grave the recent halos where its the state's securition than would otherwise her possible stranges of the state  $t = T_{\rm end} (t_{\rm e$ 

Suppose that a test same  $T = \{t_1, t_1, t_2, ..., t_n\}$  covers the set of requirements  $\mathcal{R}(T) = \{r_1, r_2, r_3, ..., r_n\}$ . Each test case  $t_i \in T$  is associated with the non-empty set  $\mathcal{R}(k) \subseteq \mathcal{R}(T)$  [1, 5]. During the empirical study of search-based

Permitteion in make digital or hard copies of all or part of this work for present or classroom one is granted without los provided due copies an not make or distributed for prefit or summerical advance gata all tat copies bene thin cosize and the Hill classion on the hits page. To copy otherwise, to republish, to part one services as to accumulate the kine, require plots ejective provintions and/or a line. CALCOV 74, July 21, 112, 112, Perchand, Gaugoan, USA.



works program, this immediate imprication reconsistions of the efficiency and deciveness of approaches to to building. The use of end-workd programs also possibles the experimenter from easily controlling the size of the test suite  $\tau$  and the coverage patternss within  $S_{1}(T)$ . Utilizately, the lack of a wide variety of the saints halfware the halfful of researchers to quickly compare and contrast the plethons of newly devident techniques for test reinvisionations ( $\sigma_{n}$ , 10, 3, 4, 50).

To produce Trust States. Using efficiently generated synthics rest active to the star of any product of the star field rest starts in the start of any product of the start and match takes by the start of the starts [2]. At staft, hence the start of the start of the starts [2] at staft the proper sharehow the start of the starts [2]. At staft, hence the start of the start of the start of the start match takes dist in the product instarts includyness. We start the start start for the start of the start of the start of the start start of the start of the start of the start of the start start starts (2) at the start of the start of the start of the start start of the start start of the start of these informations in the proper start of the start of the start of these informations are start on starts (2) at different starts and the start (2) at the start start of the start of the start of these informations are start of the start of the start of these informations are start and the start of the start start of the start

#### Conclusion

- Synthetic test suite generation is efficient
- Enable the identification of fundemental trade-offs

#### **Future Work**

- Apply our technique to genetic and other algorithms
- Implement and evaluate new and different synthetic generators

#### http://www.cs.allegheny.edu/~gkapfham/research/kanonizo/

#### Zachary Williams (Allegheny College)

#### Synthetic Test Suite Prioritization

#### GECCO 2010 11 / 11

#### Using Synthetic Test Suites to Empirically Compare Search-Based and Greedy Prioritizers

Zachary D. Williams Department of Computer Science Allegheny College williaz@allegheny.edu Gregory M. Kapthammer Department of Computer Science Allegheny College gkapfham@allegheny.edu

#### ABSTRACT

The intermet is the sampling of submet softward has been due to an exist in the program. In order to address the shares of the sampling of th

Engineering) Testing and Debugging General Terman Experimentation, Performance Keywordisi warch-based and greedy test prioritization

#### 1. INTRODUCTION

Software developers often introduce-defects during the inplanematician presense. Begivision testing methods establish a contribution in the correctness of and isolate defects within a program by maxing a callestion of total known as a tost with. Since approxima testing can be very time commaning, the produce a testing of the trends that methods in produces a test method provide table methods in the suffix's securition than would otherwise be possible.

Suppose that a test same  $T = \{t_1, t_1, t_2, ..., t_n\}$  covers the set of requirements  $\mathcal{R}(T) = \{r_1, r_2, r_3, ..., r_n\}$ . Each test case  $t_i \in T$  is associated with the non-empty set  $\mathcal{R}(k) \subseteq \mathcal{R}(T)$  [1, 5]. During the empirical study of search-based

Permitteion in make digital or hard copies of all or part of this work for present or classroom one is granted without los provided due copies an not make or distributed for prefit or summerical advance gata all tat copies bene thin cosize and the Hill classion on the hits page. To copy otherwise, to republish, to part one services as to accumulate the kine, require plots ejective provintions and/or a line. CALCOV 74, July 21, 112, 112, Perchand, Gaugoan, USA.



use of real-world programs also prohibits the experimenter from early controlling the size of the test satis T and the coverage patterns within R(T). Utimately, the lack of a wide variety of test satists hinders the shifty of researchers to quickly compare and contrast the pheticas of newly developed techniques for test prioritization (e.g., [1, 3, 4, 3]). Swrithetic Task Stutes. Usine efficiently exercised sam-

their of a single starting of the start of the single priority means the sequence intermediate sequence in only a stability during the start of the single start of t

#### Conclusion

- Synthetic test suite generation is efficient
- Enable the identification of fundemental trade-offs

#### **Future Work**

- Apply our technique to genetic and other algorithms
- Implement and evaluate new and different synthetic generators

#### http://www.cs.allegheny.edu/~gkapfham/research/kanonizo/

#### Using Synthetic Test Suites to Empirically Compare Search-Based and Greedy Prioritizers

Zachary D. Williams Department of Computer Science Allegheny College williaz@allegheny.edu Gregory M. Kapfhammer Department of Computer Science Allegherry College gkapfham@allegherry.edu

#### ABSTRACT

The intermet is the sampling of submet softward has been due to an exist in the program. In order to address the shares of the sampling of th

Engineering) Testing and Debugging General Terman Experimentation, Performance Keywordisi warch-based and greedy test prioritization

#### 1. INTRODUCTION

Software developers often introduce-defects during the inplanematician presense. Begivision testing methods establish a contribution in the correctness of and isolate defects within a program by maxing a callestion of total known as a tost with. Since approxima testing can be very time commaning, the produce a testing of the trends that methods in produces a test method provide table methods in the suffix's securition than would otherwise be possible.

Suppose that a test same  $T = \{t_1, t_1, t_2, ..., t_n\}$  covers the set of requirements  $\mathcal{R}(T) = \{r_1, r_2, r_3, ..., r_n\}$ . Each test case  $t_i \in T$  is associated with the non-empty set  $\mathcal{R}(k) \subseteq \mathcal{R}(T)$  [1, 5]. During the empirical study of search-based

Permitteion in make digital or hard copies of all or part of this work for present or classroom one is granted without los provided due copies an not make or distributed for prefit or summerical advance gata all tat copies bene thin cosize and the Hill classion on the hits page. To copy otherwise, to republish, to part one services as to accumulate the kine, require plots ejective provintions and/or a line. CALCOV 74, July 21, 112, 112, Perchand, Gaugoan, USA.



#### Figure 1: Execution Time - Fully Random

and grantly the stability profiles on more that the stability of the stab

possible coverage points, so that  $C = F_0 \times |\mathcal{R}(\hat{T})| \times |\hat{T}|$ 

#### Conclusion

- Synthetic test suite generation is efficient
- Enable the identification of fundemental trade-offs

#### **Future Work**

- Apply our technique to genetic and other algorithms
- Implement and evaluate new and different synthetic generators

#### http://www.cs.allegheny.edu/~gkapfham/research/kanonizo/

#### Using Synthetic Test Suites to Empirically Compare Search-Based and Greedy Prioritizers

Zachary D. Williams Department of Computer Science Allegheny College williaz@allegheny.edu Gregory M. Kapfhammer Department of Computer Science Allegherry College gkapfham@allegherry.edu

#### ABSTRACT

The intermet is the sampling of submet softward has been due to an exist in the program. In order to address the shares of the sampling of th

Engineering) Testing and Debugging General Terms: Experimentation, Performance Keywordisi warch-based and greedy test prioritization

#### 1. INTRODUCTION

Software developers often introduce defets during the implementation process. Begivisoin to using methods establish a contribution in the correctness of and isolation of the program by maxing a collection of totak lazers as a tota state. Since negatisation for that defets within the processor is an endering grave the way three commaning, the processor is an endering grave the recent halos where its the state's securition than would otherwise her possible stranges of the state  $t = T_{\rm end} (t_{\rm e$ 

Suppose that a test same  $T = \{t_1, t_1, t_2, ..., t_n\}$  covers the set of requirements  $\mathcal{R}(T) = \{r_1, r_2, r_3, ..., r_n\}$ . Each test case  $t_i \in T$  is associated with the non-empty set  $\mathcal{R}(k) \subseteq \mathcal{R}(T)$  [1, 5]. During the empirical study of search-based

Permitteion in make digital or hard copies of all or part of this work for present or classroom one is granted without los provided due copies an not make or distributed for prefit or summerical advance gata all tat copies bene thin cosize and the Hill classion on the hits page. To copy otherwise, to republish, to part one services as to accumulate the kine, require plots ejective provintions and/or a line. CALCOV 74, July 21, 112, 112, Perchand, Gaugoan, USA.



#### Figure 1: Execution Time - Fully Randor

and party the ranke production, means the state has the second party of the rank production, which is the rank production of the rank pr

possible coverage points, so that  $C = F_0 \times |\mathcal{R}(\hat{T})| \times |\hat{T}|$ 

#### Conclusion

- Synthetic test suite generation is efficient
- Enable the identification of fundemental trade-offs

#### **Future Work**

- Apply our technique to genetic and other algorithms
- Implement and evaluate new and different synthetic generators

#### http://www.cs.allegheny.edu/~gkapfham/research/kanonizo/

Zachary Williams (Allegheny College)

#### Synthetic Test Suite Prioritization

GECCO 2010 11 / 11

#### Using Synthetic Test Suites to Empirically Compare Search-Based and Greedy Prioritizers

Zachary D. Williams Department of Computer Science Allegheny College williaz@allegheny.edu Gregory M. Kapfhammer Department of Computer Science Allegherry College gkapfham@allegherry.edu

#### ABSTRACT

The intermet is the sampling of submet softward has been due to an exist in the program. In order to address the shares of the sampling of th

Engineering) Testing and Debugging General Terms: Experimentation, Performance Keywordisi warch-based and greedy test prioritization

#### 1. INTRODUCTION

Software developers often introduce-defects during the inplanematician presense. Begivision testing methods establish a contribution in the correctness of and isolate defects within a program by maxing a callestion of total known as a tost with. Since approxima testing can be very time commaning, the produce a testing of the trends that methods in produces a test method provide table methods in the suffix's securition than would otherwise be possible.

Suppose that a test same  $T = \{t_1, t_1, t_2, ..., t_n\}$  covers the set of requirements  $\mathcal{R}(T) = \{r_1, r_2, r_3, ..., r_n\}$ . Each test case  $t_i \in T$  is associated with the non-empty set  $\mathcal{R}(k) \subseteq \mathcal{R}(T)$  [1, 5]. During the empirical study of search-based

Permitteion in make digital or hard copies of all or part of this work for present or classroom one is granted without los provided due copies an not make or distributed for prefit or summerical advance gata all tat copies bene thin cosize and the Hill classion on the hits page. To copy otherwise, to republish, to part one services as to accumulate the kine, require plots ejective provintions and/or a line. CALCOV 74, July 21, 112, 112, Perchand, Gaugoan, USA.

Cupyingla 2030 ACM 978-1-4503-0877-5/10/07 -\$18.80.



#### Figure 1: Execution Time - Fully Rando

and grantly that takes its prioritization, measures with the soft beam of the takes of take

#### Conclusion

- Synthetic test suite generation is efficient
- Enable the identification of fundemental trade-offs

#### **Future Work**

- Apply our technique to genetic and other algorithms
- Implement and evaluate new and different synthetic generators

http://www.cs.allegheny.edu/~gkapfham/research/kanonizo/

#### Using Synthetic Test Suites to Empirically Compare Search-Based and Greedy Prioritizers

Zachary D. Williams Department of Computer Science Allegheny College williaz@allegheny.edu Gregory M. Kapfhammer Department of Computer Science Allegherry College gkapfham@allegherry.edu

#### ABSTRACT

The intermet is the sampling of submet softward has been due to an exist in the program. In order to address the shares of the sampling of th

Engineering) Testing and Debugging General Terms: Experimentation, Performance Keywordisi warch-based and greedy test prioritization

#### 1. INTRODUCTION

Software developers often introduce defets during the implementation process. Begivisoin to using methods establish a contribution in the correctness of and isolation of the program by maxing a collection of totak lazers as a tota state. Since negatisation for that defets within the processor is an endering grave the way three commaning, the processor is an endering grave the recent halos where its the state's securition than would otherwise her possible stranges of the state  $t = T_{\rm end} (t_{\rm e$ 

Suppose that a tota size  $T = \{t_1, t_1, t_2, ..., t_n\}$  cover the set of requirements  $\mathcal{R}(T) = \{r_1, r_2, r_3, ..., r_n\}$ . Each test case  $t_i \in T$  is associated with the non-empty set  $\mathcal{R}(h) \subseteq$  $\mathcal{R}(T)$  [1, 5]. During the empirical study of search-based

Permitteion in make digital or hard copies of all or part of this work for present or classroom one is granted without los provided due copies an not make or distributed for prefit or summerical advance gata all tat copies bene thin cosize and the Hill classion on the hits page. To copy otherwise, to republish, to part one services as to accumulate the kine, require plots ejective provintions and/or a line. CALCOV 74, July 21, 112, 112, Perchand, Gaugoan, USA.

Cupyingla 2030 ACM 978-1-4503-0877-5/10/07 -\$18.80.

#### Figure 1: Execution Time - Fully Randor

and good by the study is prediction. Second study is set of the study of the study

#### Conclusion

- Synthetic test suite generation is efficient
- Enable the identification of fundemental trade-offs

#### **Future Work**

- Apply our technique to genetic and other algorithms
- Implement and evaluate new and different synthetic generators

http://www.cs.allegheny.edu/~gkapfham/research/kanonizo/

#### Using Synthetic Test Suites to Empirically Compare Search-Based and Greedy Prioritizers

Zachary D. Williams Department of Computer Science Allegheny College williaz@allegheny.edu Gregory M. Kapfhammer Department of Computer Science Allegherry College gkapfham@allegherry.edu

#### ABSTRACT

The formula is the simplify of subsets software how the distribution of the simplify of subsets and the simplify the simulation of the simplify of the simplify software the advance of the simulation of the simulations of the simulation of the si

Engineering) Testing and Debugging General Terms: Experimentation, Performance Keywordisi warch-based and greedy test prioritization

#### 1. INTRODUCTION

Software developers often introduce defets during the implementation precess. Repression toming methods establish a contidence in the correctness of and isolate defects within a program by running a celleticit of test known as a test suite. Since regression testing can be very time communing, interne use search-based and greetly pointimization techniques to produce a test ordering that will reveal halls endire in the suite's measures that well reveals that suite models.

set of requirements  $\mathcal{R}(T) = \{r_1, r_2, r_3, ..., r_m\}$ . Each test case  $t_i \in T$  is associated with the non-empty set  $\mathcal{R}(t_i) \subseteq$  $\mathcal{R}(T)$  [1, 5]. During the empirical study of search-based

Perminsion is make digital or hard copies of all or part of this work for present in classroom use a granted without he provided that copies are not make or distributed for prefit or summerical advances grant hat copies bear discussion and the first leastion on the herspage. To copy otherwise, to regulable, is good an exercise or as or accounts where a provide provide providences and/or a first. Second second provide provide provide providences and/or a first. Second provide provide provide *DECCOP* 76, 149, 211, 2010, Perdiand, Gaugoa, USA.

Copyright 2030 ACM 978-1 4503-0877-5/10/07 ...\$18.80.

#### Figure 1: Execution Time - Fully Randos

and good by the study is prediction. Second study is set of the study of the study

#### Conclusion

- Synthetic test suite generation is efficient
- Enable the identification of fundemental trade-offs

#### **Future Work**

- Apply our technique to genetic and other algorithms
- Implement and evaluate new and different synthetic generators

#### http://www.cs.allegheny.edu/~gkapfham/research/kanonizo/