



# Automated Software Transplantation

Alexandru Marginean

CREST, University College London





**UCL** 

# People from CREST







Earl T. Barr

Mark Harman

Yue Jia





William B. Langdon Justyna Petke





































## Why A ~ 100 players Insplantation?

**VLC** 

Check open source repositories

Stat from scratch

Why not

handle

**H.264?** 

Alexandru Marginean — Automated Software Transplantation

C R E S T





#### 2013 — Harman et al.

2014 — Petke et al

#### Genetic Programming for Reverse Engineering

Genetic Programming for Reverse Engineering Mark Hamar', William B. Langdor' and Worldy Weiner' "University College Londor, CREST come, UK "University of Vergine', Vergine, USA

Introduced the idea of using GP for autotransplantation

Using Genetic Ir Code Transplan C++ Program to



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2013 — Harman et al.

2014 — Petke et al

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ntroduced the a of using GP for otransplantation Using Genetic Improvement and Code Transplants to Specialise a C++ Program to a Problem Class

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#### 2014 — Petke et al.

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ntroduced the a of using GP for otransplantation Using Genetic Improvement and Code Transplants to Specialise a C++ Program to a Problem Class



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2014 — Harman et al.

2015



2014 — Harman et al.

2015

el Pidgin: SBSE Can Grow and ft Entirely New Functionality into a Real World System



#### Automated Software Transplantation



Auto by H Acro

2015

#### – Harman et al.

#### 2015 — Barr et al.

#### Automated Software Transplantation

| Earl T. Barr Mark Harman Yue Jia   | all   |  |  |  |
|--|---|--|--|--|
|  | Alexandru Marginean Justyna Petke   |  |  |  |
| CREST, University College London, Malet Pisce, London, WOTE 687, UK<br>{e.barr,m.harman,yue.jia,alexandru.marginean.13,i.petke}@ucl.ac.uk  |   |  |  |  |
| ABSTRACT   | dependence analysis [3, 22, 29, 30] and feature extraction  |  |  |  |
| Automated transplantation would open many exciting av-<br>ences for software development: suppose we could autotrans-<br>plant code from one system into another, entirely unrelated,  | techniques [24, 33, 44]. However, the overall process remains<br>largely unautomated, particularly the critical transplantation<br>of code that implements useful functionality from a <i>donor</i>   |  |  |  |
| system. This paper introduces a theory, an algorithm, and<br>a tool that achieve this. Leveraging lightweight annotation,<br>reverses analysis identifies an overan (interesting behavior to   | into a target system, which we call the host.<br>What if we could automate the process of extracting func-<br>tionality from one system and transplanting it into another?  |  |  |  |
| transplant); testing validates that the organ exhibits the de-<br>sired behavior during its extraction and after its implantation  | This is the goal we set ourselves in this paper. That is, we are<br>the first to develop and evaluate techniques to implement an-<br>tomated software transmission from one system to another   |  |  |  |
| into a host. While we do not claim automated transplanta-<br>tion is now a solved problem, our results are encouraging:<br>we report that in 12 of 15 experiments, involving 5 donors  | which one of the authors proposed (hitherto unimplemented<br>and unevaluated) in the keywote of the 2013 WCRE [28].   |  |  |  |
| and 3 hosts (all popular real-world systems), we successfully<br>autotransplanted new functionality and passed all regression<br>tests. Autotransplantation is also already useful: in 26 hours  | A programmer must not normaly nate entry point of cone<br>that implements a feature of interest. Given an entry point<br>in the donor and a target implantation point in the host   |  |  |  |
| computation time we successfully autotransplanted the H 264<br>video encoding functionality from the x264 system to the  | program, the goal of automated transplantation is to identify<br>and extract an organ, all code associated with the feature<br>of interest, then transform it to be commatible with the   |  |  |  |
| VLC, a task that we estimate, from VLC's version history,<br>took human programmers an average of 20 days of elapsed,  | name space and context of its target site in the host. The<br>programmer also supplies test suites that guide the search for<br>down each modified in momentum to make it fully assured   |  |  |  |
| as opposed to dedicated, time.   | (and pass all test cases) when deployed in the host.<br>This is a deallowing within of tenerglantation. Income  |  |  |  |
| D.2.13 [Software Engineering]: Reusable Software; D.2.5<br>[Software Engineering]: Testing and Debugging   | code from one system is unlikely to even compile when it is<br>re-located into an unrelated foreign system without extensive<br>modification, let alone execute and pass test cases. The ex-  |  |  |  |
| Keywords   | traction of the code also involves identifying all semantically<br>required code and the successful insertion of the code orran   |  |  |  |
| Automated software transplantation, autotransplantation,<br>genetic improvement  | into the host requires nontrivial modifications to the organ to<br>ensure it adds the required feature without breaking existing<br>functionality. In this name, we research results that demon-  |  |  |  |
| 1. INTRODUCTION  | strate that this vision of automated software transplantation<br>is indeed achievable, efficient and notentially useful.  |  |  |  |
| Sortware engineers spend a great data of time extracting,<br>porting, and rewriting existing code to extend the function-<br>ality of existing software systems. Currently, this is tedious,   | Feature identification is well studied [14, 16, 58]. Extract-<br>ing a component of a system, given the identification of a   |  |  |  |
| laborious, and slow [15]. The research community has pro-<br>vided analyses and partial support for such manual code<br>reuse: for example, clone detection [5, 32, 36, 60], code  | suitable feature is also well studied, through work on shicing<br>and dependence analysis [22, 24, 29, 33, 44]. The challenges<br>of automatically extracting a feature from one system, trans-<br>plantions is into an automatically actions and matchillion   |  |  |  |
| migration [38, 58], code salvaging [12], reuse [13, 14, 16],   | painting it into an entrety university system, and insensity<br>executing it in the organ beneficiary, however, have not pre-<br>viously been studied in the literature.<br>We developed µTrans, an algorithm for automated software  |  |  |  |
| Permission to make adjuit or hard copies of parts or all of this work for personal or<br>classroom one is guared whereas for provided that copiest are not mainly or distributed<br>on the fort page. Copyrights for this party components of this work must be honored.<br>For all other ways, context the Owner/Author.<br>Constraint is half the documentation. | transplantation, based on a new kind of genetic program-<br>ming, augmented by a novel form of program slicing, $\mu$ Trans<br>synergizes analysis and tosting: analysis extracts an 'organ',<br>an executable slice from a denor; testing guides all phases<br>of autotransolutative, identifying the organ in the denor |  |  |  |
| 2557A'15, July 12-17, 2015, Baltimore, MD, USA   | minimizing and placing the organ into an ice-box, and fi-   |  |  |  |

#### Automatic Error Elimination by Horizontal Code Transfer Across Multiple Applications

| <section-header><section-header><section-header><section-header><text><text><text><text><text><text><text><text><text><text><text><text></text></text></text></text></text></text></text></text></text></text></text></text></section-header></section-header></section-header></section-header>  | Stelios Sidiroglou-Douskos Eric I   | ahtinen Fan Long Martin Rinard  |  |  |  |
|---|---|---|--|--|--|
| <section-header><section-header><section-header><text><text><text><text><text><text><text><text><text><text><text><text></text></text></text></text></text></text></text></text></text></text></text></text></section-header></section-header></section-header>   | {stclios,clahtinen,fan<br>MIT CSAIL, Ca   | Lrinard) @ csail.mit.edu<br>mbridos. MA, USA  |  |  |  |
| <text><text><text><text><text><text><text><text><text><text><text><text><text></text></text></text></text></text></text></text></text></text></text></text></text></text>   |   | MIT CSAL, Campridge, MA, USA  |  |  |  |
| <text><text><text><text><text><text><text><text><text></text></text></text></text></text></text></text></text></text>   | Abstract  | 1.1 The Code Phage (CP) Code Transfer System  |  |  |  |
| <text><text><text><text><text><text><text><text><text><list-item></list-item></text></text></text></text></text></text></text></text></text>  | We present Code Phage (CP), a system for automatically transferring   | We present Code Phage (CP), a novel horizontal code transfer system   |  |  |  |
| <text><text><text><text><text><text><text><text><text><text><list-item></list-item></text></text></text></text></text></text></text></text></text></text>   | correct code from donor applications into recipient applications  | that automatically eliminates errors in recipient software application  |  |  |  |
| <text><text><text><section-header><text><text><text><text><list-item><list-item><list-item></list-item></list-item></list-item></text></text></text></text></section-header></text></text></text>   | trai process the same inputs to successfully eliminate errors in the<br>recircient. Experimental results using seven donor applications to  | code from the donor into the recipient. The result is a softwar   |  |  |  |
| <text><text><text><text><text><text><text><text><text><text></text></text></text></text></text></text></text></text></text></text>  | eliminate ten errors in seven recipient applications highlight the  | hybrid that productively combines beneficial code from multipl  |  |  |  |
| <text><text><text><text><text><text><list-item><list-item><list-item><list-item><list-item><list-item><list-item><list-item></list-item></list-item></list-item></list-item></list-item></list-item></list-item></list-item></text></text></text></text></text></text>  | ability of CP to transfer code across applications to eliminate out of  | applications:   |  |  |  |
| <text><text><text><section-header><list-item><list-item><text><list-item></list-item></text></list-item></list-item></section-header></text></text></text>  | bounds access, integer overflow, and divide by zero errors. Because   | · Description of the second   |  |  |  |
| <text><text><text><text><text><text><text><text><text><text></text></text></text></text></text></text></text></text></text></text>  | c.r works with remary assors with no need for source code or<br>combolic information it connects a wide range of use cases. To the  | <ul> <li>Denor Selection: Cr starts with an application and two inputs: a<br/>input that triggers on error and a seed input that does not trigger th</li> </ul> |  |  |  |
| <text><text><text><text><text><text><text><text><text><text></text></text></text></text></text></text></text></text></text></text>  | best of our knowledge. CP is the first system to automatically transfer   | error. Working with a database of applications that can read thes   |  |  |  |
| <text><text><section-header><text><text><text><text><text></text></text></text></text></text></section-header></text></text>  | code across multiple applications.  | inputs, it locates a donor that processes both inputs successfull   |  |  |  |
| <text><text><text><text><text><text><text><text></text></text></text></text></text></text></text></text>  |   | The hypothesis is that the donor contains a check, missing i  |  |  |  |
| <text><text><section-header><text><text><text><text><text></text></text></text></text></text></section-header></text></text>  | Categories and Subject Descriptors D.2.5 [Testing and Debug-  | the recipient, that enables it to process the error-inggering inpu-<br>connectly. The evol is to temp for that shack form the domorant                          |  |  |  |
| <text><section-header><list-item><list-item><list-item><list-item><list-item><list-item><list-item></list-item></list-item></list-item></list-item></list-item></list-item></list-item></section-header></text>   | nance, and Enhancement]: Corrections  | the recipient (and eliminate the error in the recipient).   |  |  |  |
| <b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Constant</b><br><b>Cons</b> |   | <ul> <li>Candidate Check Discovery: To identify the check that enable</li> </ul>  |  |  |  |
| Markan Sama Sama Sama Sama Sama Sama Sama Sa  | Keywords automatic code transfer, program repair, data structure  | the donor to survive the error-triggering input, CP analyzes th   |  |  |  |
| <ol> <li>Harrisonta</li> <li>Harrisonta Martine Martin</li></ol>  | Iranslabon  | take different directions for the seed and emortripatering innut  |  |  |  |
| 1. Introduction: 1. Introduction: 1. Marking are under a fragen and and an end of the  |   | The hypothesis is that if the check eliminates the error, the see   |  |  |  |
| How has been a subject to the many of program in the many of th   | 1. Introduction   | input will pass the check but the error-triggering input will fa  |  |  |  |
| <ul> <li>of the difference speaking. Tangebase has had been from the difference of the difference</li></ul>   | Horizontal gene transfer is the transfer of genetic material between  | the check (and therefore change the branch direction).  |  |  |  |
| (b) dup dup a dup of dup regular is produced produced (TA) is produced by the produced dup of the produ   | cells in different organisms. Examples include plasmid transfer   | <ul> <li>Paten Excision: CF performs an instrumented execution of<br/>the domos on the arms biogening input to obtain a symbolic</li> </ul>                     |  |  |  |
| Many implementation of the state of the s   | (which plays a major role in acquired antibiotic resistance [17]),  | expression tree that expresses the check as a function of th  |  |  |  |
| <ul> <li>biotic biotic biotiobiotic biotic biotic biotic biotic biotic biotic biotic biob</li></ul>  | variaty-mediated gene therapy [28], and the transfer of insect totin<br>many from hostanic to formal combinents [16]. Baccore of its shifts   | input fields that determine its value. This execution translates th   |  |  |  |
| <ul> <li>tan under, harden im oppsachen aus statuetter ihrer er der statuetter e</li></ul>  | to directly transfer functionality evolved and refined in one organism  | check from the data structures and name space of the donor int  |  |  |  |
| <ul> <li>Bet is the formation of the second sec</li></ul>  | into another, horizontal gene transfer is recognized as a significant   | an application-independent representation satisfies for inservice<br>into souther combination   |  |  |  |
| Super additional to the the consense of the black that the profile the black that the black that the profile the black that the b   | factor in the development of many forms of life [29].   | <ul> <li>Patch Insertion: CP next uses an instrumented execution of th</li> </ul>   |  |  |  |
| See inglobal and show development of the control of the simulation of the simulat   | like mospical organisms, sooware applications over the cha-<br>lenges and threats from the environment in which they operate. De-   | recipient on the seed input to find candidate insertion points a  |  |  |  |
| shankifsting of emails insplorate creaters. Many of the control<br>of exploration of examples of the respect of emails of the respect of<br>emails of the respect of emails of the respect of<br>emails of the respect of emails of the respect of<br>emails of the respect of emails of the respect of<br>emails of the respect of emails of the respect of<br>emails of the respect of emails of the respect of<br>emails of the respect of emails of the respect of<br>emails of the respect of emails of the respect of<br>emails of the respect of the respect of the respect of<br>emails of the respect of  | spite significant software development effort, errors and security  | which all of the input fields in the excised check are available a  |  |  |  |
| and some provide the state before the state of the state before the st  | vulnerabilities still remain a important concern. Many of these errors  | recipient program expressions. At each such point, it is possible t<br>translate the check from the ambication-independent represent                            |  |  |  |
| and off change of the start  | are caused by an uncommon case that the developers of one (or more)   | tion into the data structures and name space of the recipient. Thi  |  |  |  |
| vance constraints for brande is<br>water constraints for brande is<br>and constraints of the brande is<br>and the second of the second<br>second of the second of the second of the second of the second of the second<br>of the second of the<br>second of the second of the second of the second of the second of the<br>second of the second of the second of the second of the second of the<br>second of the second of the second of the second of the second of the<br>second of the second of the second of the second of the<br>second of the second of the second of the second of the<br>second of the second of the second of the second of the<br>second of the second of the second of the second of the<br>second of the second of the second of the second of the<br>second of the second of the second of the second of the<br>second of the second of the<br>second of the second of the   | on un approximately the test anticipate, but in many cases, the devel-<br>oners of another anticipate did anticipate the uncommon case and  | translation, in effect, inserts the excised check into the recipien   |  |  |  |
| The second seco   | wrote correct code to handle it.  | <ul> <li>Patch Validation: CP inserts the translated check into the recip</li> </ul>  |  |  |  |
| Antion is used affed at least option of the proof of the output option of the proof  |   | validate the natch. It recommiles the amplication uses repression   |  |  |  |
| human on head of a data of any of all any of all on south a survey of any of all on south a survey of any of all on any of all o  |   | testing to verify that the patch preserves correct behavior on th   |  |  |  |
| stream are particular to the provide a provide the pro  | Permission to make digital or hard copies of all or part of this work for nersonal or   | regression suite, and checks that the patch enables the patche  |  |  |  |
| and training coupling the domains of the schedule state of the schedule  | classroom use is granted without fae provided that copies are not made or distributed   | recipient to correctly process the error-triggering input. As avail   |  |  |  |
| upper auron or a subbasica tribu, hoging alor global promotion data<br>in Disparaparationa International and any<br>Cryptife A laboration of the Linear to CAL<br>Appropriate, CP can also replate the energies of the<br>Cancel and any California any Californ   | on the first page. Copyrights for components of this work owned by others than ACM  | and, CP also returns error detecting tools to generate additional<br>error triggering instits, which it then uses to reconsische eliminat                       |  |  |  |
| In Experimentation from the end of the end o  | must be housed. Abstracting with crucht is permitted. To copy otherwise, or republish,<br>to post on servers or to indictribute to lists, requires prior specific permission and/or a | any residual or newly discovered errors.  |  |  |  |
| 72[27] J. Jan Li, T. 2015. Patient OR, USA.<br>72[27] J. Jan Li, T. 2015. Patient OR, USA.<br>73[27] J. 2015. Jan Li, T. 2   | for Report permissions from Permissions@acm.org.  | As appropriate, CP can also exploit the semantics of specifi  |  |  |  |
| ALEM 2712-1-2015 Auditor 1000 mil. UK. CA. person adatotism vanish seps. For integer overnov error<br>http://dx.dsi.org/10.1145/2737024.27337088 for example, CP analyzes the check, the expression that overflo  | copyright is sense by the obtain analysis. Particular and the sense of ACA.   | classes of errors (such as divide by zero or integer overflow) t  |  |  |  |
| mplatian.adjiu.11452/379242/37988   | PLDP 15, Julie 15–17, 2005, Portunal, OK, USA<br>ACM, 978-1-4503-3468-6/1506  | for example. CP analyzes the check, the expression that overflow  |  |  |  |
|   | ampioar.as.zegru.11452/37924.2/37988  |   |  |  |  |
| 43  |   | 43  |  |  |  |

20

2015 — Sidiroglou-Douskos 2015 — Barr et al. et al.

omatic Error Elimination Iorizontal Code Transfer oss Multiple Applications Automated transplantation of call graph and layout features into Kate



– Sidiroglou-Douskos et al.

2015 — Marginean et al.

omatic Error Elimination Iorizontal Code Transfer oss Multiple Applications Automated transplantation of call graph and layout features into Kate



– Sidiroglou-Douskos et al.

2015 — Marginean et al.

#### Babel Pidgin: SBSE can grow and graft entirely new functionality into a real world system

Mark Harman, Yue Jia, William B. Langdon



Thank you!

Yue Jia



# Babel Pidgin

Can we "grow" a software component and "graft" it to existing system automatically?





# Babel Pidgin

Can we "grow" a software component and "graft" it to existing system automatically?

Reduce the amount of tedious effort required by human programmer in order to develop and add new functionality into an existing system.









Alexandru Marginean — Automated Software Transplantation





# What if we want to transplant a new functionality, which we could not find it in any existing donors?



# **GGG** Grow and Graft for Genetic Improvements

Host



Grow code for new functionality, rather than to improve existing non-functional properties of the system.

Alexandru Marginean — Automated Software Transplantation

# **GGG** Grow and Graft for Genetic Improvements

Host



Grow code for new functionality, rather than to improve existing non-functional properties of the system.



# Pidgin

#### Version 2.10.9 C/C++ Instant message client used by million users worldwide





# Babel Pidgin



# Awards



## Awards







### Awards





8

ssbse2014

August 26 - 29, 2014

Fortaleza - Brazil




### Awards



Cited by 27 Related articles All 12 versions Cite Save

Any time



### Awards



'grow and graft'approach to Genetic Improvement (GI) that transplants new functionality ...

Cited by 27 Related articles All 12 versions Cite Save

£581,560 Grant 28 October 2015 — 27 October 2019 Pioneering research Microsoft, Visa Europe



Any time

and skills



#### **Automated Software Transplantation**

Earl T. Barr, Mark Harman, Yue Jia, Alexandru Marginean, Justyna Petke

#### Automated Transplantation of Call Graph and Layout Features into Kate

Alexandru Marginean, Earl T. Barr, Mark Harman, Yue Jia





**UCL** 



| Donor   | Host  |
|---|---|
| <pre>char *vF;<br/>vF = getFile();<br/>initCodec(vF);</pre> | <pre>char * iF = getInputFile(); char * oF = getOutputFile();</pre> |
|   |   |
|   | <pre>Stream *ds = decodeFile(vF);<br/>encodeStream(ds, out);</pre>  |
|   |   |

Alexandru Marginean — Automated Software Transplantation







| Donor   | Host  |
|---|---|
| <pre>char *vF;<br/>vF = getFile();<br/>initCodec(vF);</pre> | <pre>char * iF = getInputFile(); char * oF = getOutputFile();</pre> |
|   |   |
|   | <pre>Stream *ds = decodeFile(vF);<br/>encodeStream(ds, out);</pre>  |
|   |   |

Alexandru Marginean — Automated Software Transplantation



| Donor   | Host  |
|---|---|
| <pre>char *vF;<br/>vF = getFile();<br/>initCodec(vF);</pre> | <pre>char * iF = getInputFile(); char * oF = getOutputFile();</pre> |
|   |   |
|   | <pre>Stream *ds = decodeFile(iF);<br/>encodeStream(ds, oF);</pre>   |
|   |   |

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| Donor   | Host  |
|---|---|
| <pre>char *vF;<br/>vF = getFile();<br/>initCodec(vF);</pre> | <pre>char * iF = getInputFile(); char * oF = getOutputFile();</pre> |
|   |   |
|   | <pre>Stream *ds = decodeFile(iF);<br/>encodeStream(ds, oF);</pre>   |
|   |   |

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#### Donor

#### Host

char \* iF = getInputFile(); char \* oF = getOutputFile();

char \*vF; vF = getFile(); initCodec(vF);

Stream \*ds = decodeFile(iF);
encodeStream(ds, oF);



## Host Donor char \* iF = getInputFile(); iF = getFile(); initCodec(iF);





| Donor | Host  |
|-------|---|
|       | <pre>char * iF = getInputFile(); char * oF = getOutputFile();</pre> |
|       |   |
|       | <pre>iF = getFile();<br/>initCodec(iF);</pre>                       |
|       |   |
|       | <pre>Stream *ds = decodeFile(iF);<br/>encodeStream(ds, oF);</pre>   |
|       |   |

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## Host Donor char \* iF = getInputFile(); iF = getFile(); initCodec(iF);









| Donor | Host  |
|-------|---|
|       | <pre>char * iF = getInputFile(); char * oF = getOutputFile();</pre> |
|       |   |
|       | i <del>F = getFile();</del><br>initCodec( <b>i</b> F);              |
|       |   |
|       | <pre>Stream *ds = decodeFile(iF); encodeStream(ds, oF);</pre>       |
|       |   |

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### Human Organ Transplantation





## Autotransplantation



#### Organ Test Suite





## Autotransplantation



#### **Experimental Corpus**

| Subjects        | Туре  | Size KLOC  | Reg. Tests |  |  |  |
|-----------------|-------|------------|------------|--|--|--|
| Empirical Study |       |            |            |  |  |  |
| Idct            | Donor | 2.3        | -          |  |  |  |
| Mytar           | Donor | 0.4        | -          |  |  |  |
| Cflow           | Donor | 25         | -          |  |  |  |
| Webserver       | Donor | 1.7        | -          |  |  |  |
| TuxCrypt        | Donor | 2.7        | -          |  |  |  |
| Pidgin          | Host  | 363        | 88         |  |  |  |
| Cflow           | Host  | 25         | 21         |  |  |  |
| SoX             | Host  | 43         | 157        |  |  |  |
|                 | Ca    | se Studies |            |  |  |  |
| VLC             | Host  | 422        | 27         |  |  |  |
| Kate            | Host  | 50         | 238        |  |  |  |
| x264            | Donor | 63         | _          |  |  |  |
| Cflow           | Donor | 22         | _          |  |  |  |
| Indent          | Donor | 26         | _          |  |  |  |



#### Aggregate Statistics (Size)

| Minimum            | 0.4k |
|--------------------|------|
| Maximum            | 422k |
| Donor<br>(Average) | 16k  |
| Host<br>(Average)  | 213k |

**UCL** 



### Experimental Methodology and Setup



**UCL** 



### Experimental Methodology and Setup



**UCL** 



### Experimental Methodology and Setup



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### **Experimental Methodology**



x 20

**UCL** 



# **Transplant Validation**





# **Transplant Validation**



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# **Transplant Validation**



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|       |        |            | Execution T | ime (minutes) |
|-------|--------|------------|-------------|---------------|
| Donor | Host   | Successful | Average     | Total (hours) |
| Idct  | Pidgin | 16         | 5           | 97            |
| Mytar | Pidgin | 16         | 3           | 65            |
| Web   | Pidgin | 0          | 8           | 160           |
| Cflow | Pidgin | 15         | 58          | 1151          |
| Tux   | Pidgin | 15         | 29          | 574           |
| ldct  | Cflow  | 16         | 3           | 59            |
| Mytar | Cflow  | 17         | 3           | 53            |
| Web   | Cflow  | 0          | 5           | 102           |
| Cflow | Cflow  | 20         | 44          | 872           |
| Tux   | Cflow  | 14         | 31          | 623           |
| ldct  | SoX    | 15         | 12          | 233           |
| Mytar | SoX    | 17         | 3           | 60            |
| Web   | SoX    | 0          | 7           | 132           |
| Cflow | SoX    | 14         | 89          | 74            |
| Tux   | SoX    | 13         | 34          | 94            |
| TO    | TAL    | 188/300    | 334         | 72            |

**UCL** 

Alexandru Marginean — Automated Software Transplantation



|       |        |          | Fvecution T | ime (minutes) |
|-------|--------|----------|-------------|---------------|
| Donor | HSL    | lccessfi | rage        | Total (hours) |
| Idct  | Piagin | 10       | 5           | 97            |
| Mytar | Pidgin | 16       | 3           | 65            |
| Web   | Pidgin | 0        | 8           | 160           |
| Cflow | Pidgin | 15       | 58          | 1151          |
| Tux   | Pidgin | 15       | 29          | 574           |
| ldct  | Cflow  | 16       | 3           | 59            |
| Mytar | Cflow  | 17       | 3           | 53            |
| Web   | Cflow  | 0        | 5           | 102           |
| Cflow | Cflow  | 20       | 44          | 872           |
| Tux   | Cflow  | 14       | 31          | 623           |
| ldct  | SoX    | 15       | 12          | 233           |
| Mytar | SoX    | 17       | 3           | 60            |
| Web   | SoX    | 0        | 7           | 132           |
| Cflow | SoX    | 14       | 89          | 74            |
| Tux   | SoX    |          | 34          | 94            |
| TO    | TAL    | 188/300  | 334         | 72            |
|       |        |          |             |               |

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CREST



|       |                 |        |     | Execution T | im | e (minutes)   |
|-------|-----------------|--------|-----|-------------|----|---------------|
| Donor | Host            | Succes | A   | verage      |    | Total (hours) |
| Idct  | Pid <u>g</u> in | Ĩ      | 6   | 5           |    | 97            |
| Mytar | Pidgin          |        | 6   | 3           |    | 65            |
| Web   | Pidgin          |        | 0   | 8           |    | 160           |
| Cflow | Pidgin          |        | 5   | 58          |    | 1151          |
| Tux   | Pidgin          | -      | 5   | 29          |    | 574           |
| Idct  | Cflow           |        | 6   | 3           |    | 59            |
| Mytar | Cflow           |        | 7   | 3           |    | 53            |
| Web   | Cflow           |        | 0   | 5           |    | 102           |
| Cflow | Cflow           | 2      | 20  | 44          |    | 872           |
| Tux   | Cflow           | -      | 4   | 31          |    | 623           |
| ldct  | SoX             |        | 5   | 12          |    | 233           |
| Mytar | SoX             |        | 7   | 3           |    | 60            |
| Web   | SoX             |        | 0   | 7           |    | 132           |
| Cflow | SoX             |        | 4   | 89          |    | 74            |
| Tux   | SoX             |        | 3   | 24          |    | 94            |
| TO    | TAL             | 188/30 | )() | 334         | 1  | 72            |

**UCL** 

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|       |        |            | Execution T | ime (minutes) |     |
|-------|--------|------------|-------------|---------------|-----|
| Donor | Host   | Successful | Average C   | otal (hou     | rs) |
| ldct  | Pidgin | 16         | 5           | 97            |     |
| Mytar | Pidgin | 16         | 3           | 65            |     |
| Web   | Pidgin | 0          | 8           | 160           |     |
| Cflow | Pidgin | 15         | 58          | 1151          |     |
| Tux   | Pidgin | 15         | 29          | 574           |     |
| ldct  | Cflow  | 16         | 3           | 59            |     |
| Mytar | Cflow  | 17         | 3           | 53            |     |
| Web   | Cflow  | 0          | 5           | 102           |     |
| Cflow | Cflow  | 20         | 44          | 872           |     |
| Tux   | Cflow  | 14         | 31          | 623           |     |
| ldct  | SoX    | 15         | 12          | 233           |     |
| Mytar | SoX    | 17         | 3           | 60            |     |
| Web   | SoX    | 0          | 7           | 132           |     |
| Cflow | SoX    | 14         | 89          | 74            |     |
| Tux   | SoX    | 13         | 34          | Q1            |     |
| TO    | TAL    | 188/300    | 334         | 72            |     |

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CREST

### Kate





**UCL** 



### Kate

#### C Call Graphs?





**UCL** 

C Layout

Feature?







### Kate







**LOU** 



### Kate



**UCL** 






**UCL** 



## Kate

奈 🖪 🕴 🖂 📧 🜒 15:40 🔱



**UCL** 



|        |      |            | Execution Ti | me (minutes)  |
|--------|------|------------|--------------|---------------|
| Donor  | Host | Successful | Average      | Total (hours) |
| Cflow  | Kate | 16         | 101          | 33            |
| Indent | Kate | 18         | 31           | 11            |
| TOTAL  |      | 34/40      | 132          | 44            |

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|        |      |            | Execution Ti | me (minutes)  |
|--------|------|------------|--------------|---------------|
| Donor  | Host | Successful | Average      | Total (hours) |
| Cflow  | Kate | 16         | 101          | 33            |
| Indent | Kate | 18         | 31           | 11            |
| TOTA   | _    | 34/40      | 132          | 2 44          |

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|        |      |            | Execution T | ime (minutes) |
|--------|------|------------|-------------|---------------|
| Donor  | Host | Successful | Average     | Total (hours) |
| Cflow  | Kate | 16         | 101         | 33            |
| Indent | Kate | 18         | 31          | 11            |
| TOTA   |      | 34/40      | 132         | 44            |

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#### Donor







#### Award winning tool for H.264 encoding [2,3,4]





#### Donor

Host

**L** Alexar





#### Award winning tool for H.264 encoding [2,3,4]

#### "Most popular desktop video player" [1]



#### Donor

Host

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#### Award winning tool for H.264 encoding [2,3,4]

#### "Most popular desktop video player" [1]



#### Donor

Host

















# Case Study: x264 & VLC

#### **Automatic Transplantation of H264 Encoder**

|          | Time    | Regression | Manual | Acceptance |
|----------|---------|------------|--------|------------|
|          | (hours) | Tests      | Tests  | Tests      |
| μScalpel | 26      | 100%       | 100%   | 100%       |







### **Autotransplantation is Human Competitive!**



















Upgrade of x264 within VLC: average of 20 days of elapsed time [6]

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μSCALPEL





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MSU Sixth MPEG-4 AVC/H.264 Video Codecs Comparison [4]









MSU Sixth MPEG-4 AVC/H.264 Video Codecs Comparison [4]









MSU Sixth MPEG-4 AVC/H.264 Video Codecs Comparison [4]

x264 won with ~24% better encoding than second place







MSU Sixth MPEG-4 AVC/H.264 Video Codecs Comparison [4]









MSU Sixth MPEG-4 AVC/H.264 Video Codecs Comparison [4]













MSU Sixth MPEG-4 AVC/H.264 Video Codecs Comparison [4]



#### 2.4% faster









MSU Sixth MPEG-4 AVC/H.264 Video Codecs Comparison [4]







### 2.4% faster

We automatically transplanted new functionality!









MSU Sixth MPEG-4 AVC/H.264 Video Codecs Comparison [4]



#### 2.4% faster





### Social Media Reactions: "Am I Obsolete?"

### Social Media Reactions: "Am I Obsolete?"

| 5th August 2015 10:48  |   | <u>#1</u>   |                         |
|--|---|---|-------------------------|
| DimPrawn ∘<br>Richer than sasquru  | 🗎 I am obsolete   |   | UK                      |
| DimPrawn - scorchio!   | Code 'transplant' could revolutionise programming (Wired UK)<br>Code has been automatically "transplanted" from one piece of software to another for the first time, with<br>researchers claiming the breakthrough could radically change how computer programs are created.<br>The process, demonstrated by researchers at University College London, has been likened to organ transplantation<br>in humans. Known as MuScalpel, it works by isolating the code of a useful feature in a 'donor' program and<br>transplanting this "organ" to the right "vein" in software lacking the feature. |   | Contractor<br>Forum [7] |
| Join Date: Jul 2005<br>Location: In a state of<br>dysphoria<br>Posts: 30,793<br>Thanks (Given): 206<br>Thanks (Perceived): 516 | Bugger, no one is going to hire me now.   | 9   |                         |
| Likes (Received): 2612   | 5th August 2015 10:53   |   |                         |
|  | BrilloPad<br>TripleIronDad  | Couple that to a 3D printer and the ruling class will not p | and the plate coop      |
| *  | BrilloPad is a fount of<br>knowledge  |   |                         |

### Social Media Reactions: "Am I Obsolete?"

| 🗋 5th August 2015 10:48   |   | <u>#1</u>  |                               |
|---|---|--|-------------------------------|
| DimPrawn •<br>Richer than sasguru<br>DimPrawn - scorchio!   | <ul> <li>I am obsolete</li> <li>Code 'transplant' could revolutionise programming (Wired UK)</li> <li>Code has been automatically "transplanted" from one piece of software to another for the first time, with researchers claiming the breakthrough could radically change how computer programs are created.</li> <li>The process, demonstrated by researchers at University College London, has been likened to organ transplantation in humans. Known as MuScalpel, it works by isolating the code of a useful feature in a 'donor' program and</li> </ul> |  | UK<br>Contractor<br>Forum [7] |
| Join Date: Jul 2005<br>Location: In a state of<br>dysphoria<br>Posts: 30,793<br>Thanks (Given): 206<br>Thanks (Received): 516 | Bugger, no one is going to hire me now.   |  |                               |
| Likes (Given): 2695<br>Likes (Received): 2612   | 5th August 2015 10:53   |  |                               |
|   | BrilloPad •<br>TripleIronDad  | Couple that to a 3D printer and the ruling class will not no | eed the plebs soon.           |
| *   | knowledge   |  |                               |



🔅 🛛 🕹 Follow

MuScalpel - code transplantation is here. So in the next 10 years there would be no jobs for computer programmers...





Coding 'transplant' could revolutionise programming wired.uk/HZhIID

| T I |                                       |
|-----|---------------------------------------|
| 18  | <pre>void loop()</pre>                |
| 19  | {                                     |
| 20  |                                       |
| 21  | //MCU Task TASK CNT = 0: ((NUM_FN_TAS |
| 22  | for (NUM_FN_TASK_COM                  |
| 23  | {                                     |
| 24  |                                       |
| 25  | FO INUM FN_TASK_ONTI                  |
| 26  | tf (fn [NUM_FN_TASK_CNT]              |
| 27  | (                                     |

WIRED

article, with more than 2000 shares



Coding 'transplant' could revolutionise programming wired.uk/HZhIID

| T 1 |                                  |
|-----|----------------------------------|
| 18  | <pre>void loop()</pre>           |
| 19  | {                                |
| 20  |                                  |
| 21  | //MCU TASK CNT = 0; ((NUM_FN_TAS |
| 22  | for (NUM_FN_TASK_Catt            |
| 23  | {                                |
| 24  | 1T ((million and a               |
| 25  | fn [NUM_FN_TASK_CNT]             |
| 26  | tf(fn[NUM_FN_TASK_CNTT           |
| 27  | (                                |

WIRED

### article, with more than 2000 shares



tation CREST

Coding 'transplant' could revolutionise programming wired.uk/HZhIID







Coding 'transplant' could revolutionise programming wired.uk/HZhIID

| T 1 |                                  |
|-----|----------------------------------|
| 18  | <pre>void loop()</pre>           |
| 19  | {                                |
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| 21  | //MCU TASK CNT = 0; ((NUM_FN_TAS |
| 22  | for (NUM_FN_TASK_Catt            |
| 23  | {                                |
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| 25  | fn [NUM_FN_TASK_CNT]             |
| 26  | tf(fn[NUM_FN_TASK_CNTT           |
| 27  | (                                |

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### article, with more than 2000 shares



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| T / |  |
|-----|--|
| 18  | <pre>void loop()</pre>                   |
| 19  | {  |
| 20  |  |
| 21  | //MCU Task<br>TASK CNT = 0; ((NUM_FN_TAS |
| 22  | for (NUM_FN_TASK_Str                     |
| 23  | {  |
| 24  | i in alles and a                         |
| 25  | fn INUM_FN_TASK_CNTI                     |
| 26  | tf(fn[NUM_FN_TASK_CNTT                   |
| 27  | ()(at, [10], (at, [1], (at, [1])))       |

WIRED

### article, with more than 2000 shares







Coding 'transplant' could revolutionise programming wired.uk/HZhIID

| T., |  |
|-----|--|
| 18  | void loop()                                |
| 19  | {  |
| 20  |  |
| 21  | //MCU Task<br>I TASK CNT = 0; ((NUM_FN_TAS |
| 22  | for (NUM_FN_TASK_Stress                    |
| 23  | {  |
| 24  |  |
| 25  | fn [NUM_FN_TASK_ONT]                       |
| 26  | ff(fn[NUM_FN_TASK_CNTT                     |
| 27  | (  |

WIRED

### article, with more than 2000 shares

### More shares for Autotransplantation!





# ACM Distinguished Paper Award at ISSTA '15



# ACM Distinguished Paper Award at ISSTA '15



#### **Featured on:**



### MOTHERBOARD



MuScalpel Is an Algorithmic Code Transplantation Tool A new system offers an automated way of reusing ("transplanting") existing code into new projects. motherboard.vice.com

## Humies 2016





## Humies 2016





cash awards for humancompetitive results that were produced by any form of genetic and evolutionary computation



# Humies 2016





cash awards for humancompetitive results that were produced by any form of genetic and evolutionary computation







## Humies 2016 Gold Medal





"it has been won for the past five years by games - except one where the gold medal was shared but still with a game" [8]



## Humies 2016 Gold Medal





"it has been won for the past five years by games - except one where the gold medal was shared but still with a game" [8]





## Humies 2016 Gold Medal





"it has been won for the past five years by games - except one where the gold medal was shared but still with a game" [8]







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#### Silver Medal at Humies 2014

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Silver Medal at Humies 2014

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#### **SSBSE 2014 Challenge Track Winner**

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### Silver Medal at Humies 2014

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#### **SSBSE 2014 Challenge Track Winner**

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#### **ISSTA 2015 Distinguish Paper Award**

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### Silver Medal at Humies 2014

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#### **SSBSE 2014 Challenge Track Winner**

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#### **ISSTA 2015 Distinguish Paper Award**

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#### **Gold Medal at Humies 2016**

Alexandru Marginean — Automated Software Transplantation

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#### Silver Medal at Humies 2014

#### **SSBSE 2014 Challenge Track Winner**

### **CREST Research is World Leading in Code Transplants!**

and and a second and a second second and a second and a second a second and a second and a second and second a

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#### **ISSTA 2015 Distinguish Paper Award**

#### **Gold Medal at Humies 2016**



#### **Code Transplants**



Using Genetic Improvement and Code Transplants to Specialise a C++ Program to a Problem Class

|   | Home State S |
|---|--|
| oduced the<br>f using GP for<br>ansplantation | Most cited paper   |
|   |  |

2014 — Petke et al.

#### **People from CREST**



t al.











Earl T. Barr Mark Harman









William B. Langdon

#### Justyna Petke

#### **Public Recognition**

ACM Distinguished Paper Award at **ISSTA '15** 

#### Featured on:



MOTHERBOARD

Yue Jia

### Autotransplantation

#### Silver Medal at Humies 2014

#### **SSBSE 2014 Challenge Track Winner**

#### the state of the set we and the set **CREST Research is World Leading in Code** Transplants!

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#### The second second ATTAL STATISTIC TO SAL ROY ST CALCOLIN **ISSTA 2015 Distinguish Paper Award**

#### PARTE & MARIA BI SAL SO 9 4 10 Bala **Gold Medal at Humies 2016**



#### Awards



28 October 2015 - 27 October 2019 Microsoft, Visa Europe

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Humies 2016 Gold Medal



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"it has been won for the past five years by games - except one where the gold medal was shared but still with a game"





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