# Katana: A Hot Patching Framework for ELF Executables

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Abstract—Despite advances in software modularity, security, and reliability, offline patching remains the predominant form of updating or protecting commodity software. Unfortunately, the mechanics of hot patching (the process of upgrading a program while it executes) remain understudied, even though such a capability offers practical benefits for both consumer and mission-critical systems. A reliable hot patching procedure would serve particularly well by reducing the downtime necessary for critical functionality or security upgrades. Yet, hot patching also carries the risk - real or perceived - of leaving the system in an inconsistent state, which leads many owners to forego its benefits as too risky. In this paper, we propose a novel method for hot patching ELF binaries that supports (a) synchronized global data and code updates and (b) reasoning about the results of applying the hot patch. We propose a format, which we call a Patch Object, for encoding patches as a special type of ELF relocatable object file. Our tool, Katana, automatically creates these patch objects as a by-product of the standard source build process. Katana also allows an end-user to apply the Patch Objects to a running process. In essence, our method can be viewed as an extension of the Application Binary Interface (ABI), and we argue for its inclusion in future ABI standards.

"Some reports, such as the case of the Conficker outbreak within Sheffield Hospital's operating ward, suggest that even security- conscious environments may elect to forgo automated software patching, choosing to trade off vulnerability exposure for some perceived notion of platform stability..." – http://mtc.sri.com/Conficker/

#### I. INTRODUCTION

It is somewhat ironic that users and organizatations hesistate to apply patches whose stated purpose is to support availability or reliability precisely because the process of doing so can lead to downtime (both from the patching process itself as well as unanticipated issues with the patch). Periodic reboots in desktop systems — irrespective of the vendor — are at best annoying. Reboots in enterprise environments (*e.g.*, trading, e-commerce, core network systems), even for a few minutes, imply large revenue loss or an extensive backup and failover infrastructure with rolling updates. We question whether this *de facto* acceptence of significant downtime and redundant infrastructure should not be abandoned in favor of a reliable hot patching process.

Software, the product of an inherently human process, remains a flawed and incomplete artifact. This reality leads to the uncomfortable inevitability of future fixes, upgrades, and enhancements. Given the way such fixes are currently applied (*i.e.*, patch and reboot), downtime is a foregone conclusion even as the software is released.

While patches themselves are a necessity, we believe that the process of *applying* them remains rather crude. First, the target process is terminated, the new binary and corresponding libraries (if any) are then written over the older versions, the system is restarted if necessary, and finally the upgraded application begins execution. Besides the appreciable loss in uptime, all context held by the application is also lost, unless the application had saved its state to persistent storage [7], [6] and later restored it (which is expensive to design for, implement, and execute). In the case of mission-critical services, even after a major flaw is unveiled and a patch subsequently created, administrators likely wish to apply the patch and upgrade the process without actually restarting the program and losing state and time. This requirement serves as our motivation for hot patching.

#### A. Challenges of Patching

Requiring and encouraging the adoption of the latest security patches is a matter of common wisdom and prudent policy. It appears, however, that this wisdom is routinely ignored in practice. This disconnect suggests that we should look for the reasons underlying users' hesitancy to apply patches, as these reasons might be due to fundamental technical challenges that are not yet recognized as such. We believe that the current mechanics of applying patches prove to be just such a stumbling block, and we contend that the underlying challenges need to and can be addressed in a fundamental manner *by extending the core elements of the ABI and the executable file format*.

Mission-critical systems seem hardest to patch. They can ill afford downtime, and the owner may be reluctant to patch due to the real or perceived risk of the patch breaking essential functionality. For example, patching a

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component of a distributed system might lead to a loss or corruption of state for the entire system. An administrator might also suspect that the patch is incompatible with some legacy parts of the system. Even so, the patch may target a latent vulnerability in a software feature that is not now in active use, but also cannot be easily made unreachable via configuration or module unloading. The administrator is forced to accept a particularly thorny choice: inaction holds as much risk as a proactive "responsible" approach. Since the risks of patching must be weighed against those of staying unpatched, we seek to **shift the balance of this decision toward hot patching by making it not only possible, but also less risky in a broad range of circumstances**.

Our key observation is that current binary patches, whether "hot" or static, are almost entirely opaque and do not support any form of reasoning about the impact of the patch (short of reverse engineering both the patch and the targeted binary). In particular, it is hard for the software owner to find out whether and how a patch would affect any particular subsystem or compatibility of the target with other software in any other way than applying the patch on the test system and trying it out, somehow finding a way to faithfully replicate the conditions of the production environment.

Given these circumstances, our tool Katana and our Patch Object format not only seek to make possible the mechanics of hot patching, but also enable administrators to reduce the risk of applying a particular fix by providing them with enough information to support examination of the patch structure, reasoning<sup>1</sup> about its interaction with the rest of the system, and an understanding of the tradeoffs involved in applying it.

### B. Why Not Just Employ Redundancy?

Redundant infrastructure, containing replicas of nodes and service paths, often helps an organization bridge the service disruption stemming from patches. We believe, however, that redundancy isn't always the best approach for ensuring availability during an upgrade or security-critical patching process. Rather than an established best practice, we invite the reader to see redundancy as an extreme measure that needlessly duplicates hardware, networking, and software of the original system. We suggest that redundancy is:

- a. **expensive** especially in medium-sized enterprises where the cost of a single server, gateway, or switch is high enough to outweigh the benefits of redundancy.
- b. **wasteful** Redundant systems are typically passive bystanders, lying in wait for an active machine to initiate a failover.
- c. requires complicated logic Transferring application state (even across multiple homogenous systems) is

<sup>1</sup>By which we mean manual, human-level reasoning, although applying automated reasoning methods is an interesting (and open) avenue of research.

non-trivial, especially when the state transfer occurs within hardware (such as for call trunks).

d. **specialized** - The process of building system redundancy is not easily generalizable across heterogenous systems and requires full knowledge of the underlying protocol and application state in order to provide faithful failover and failback.

## II. KATANA DESIGN: TRACKING OBJECT DEPENDENCIES

Katana leverages the typical Unix Makefile build mechanism to track file-level dependencies. Normally, after applying a source patch file and performing a top-level make, only those object files whose underlying sources have changed are rebuilt. Katana thus tracks object-level (.o) dependencies as follows. We first replicate all object files and the ELF executable from the existing source tree. We then apply the patch to the *original* source tree. At this point, only source files have been modified. Next, using the Linux kernel's *inotify* mechanism<sup>2</sup>, Katana sets up a notification on the original source tree, so that it knows when an object file is created or modified under the original tree. Finally, we perform the top-level make under this source and record all created/modified object files, along with the newly created executable.



Figure 1. An Example Code Base. From the top: each source file creates a corresponding object file; multiple object files are combined into intermediate compilation units (CU); and multiple CUs are merged to form the executable. All shaded blocks indicate modified files.

Figure 1 illustrates how object files are modified by make as a result of source-level changes. Katana only considers objects that are closest to the source files and ignores all other intermediate object files and compilation units (CU). Hence, in Figure 1, Katana only records the shaded circleobjects along with the final executable.

To dynamically update the running application, Katana needs to patch both the **code** and the **data** within the process. It first creates a *patch object* (PO): an ELF file with sections

<sup>&</sup>lt;sup>2</sup>*inotify* allows the registration of filesystem triggers. We use inotify to avoid potentially expensive recursive directory comparisons.

that indicate the type of patch (code or data), the patch offsets and lengths within the process address space, patch data, function and data names, *etc*.

#### III. AUTOMATED PATCHING

In this section, we describe our data and code patching methods. We note that, compared to previous work, our PO data structures allow reasoning about the scope, extent, and impact of the patch (*e.g.*, whether it affects particular subsystems within the process).

Code Patching. This process involves several stages.

(i) *Code Identification:* Katana first needs to identify the section(s) of text that need to be modified within the running process. To do this, we consider the list of all modified object files from our tracking step, and identify all functions (both static and global) within these files from their symbol table. This list gives us the set of all functions that need to be patched within the executing application. We note that just because an object file has been modified does not mean *all* functions (at the source-level) within that object have necessarily been modified, but since it is not possible for us to determine which exact functions a patch modifies (as local and weak symbols are not unique within an executable), we resort to fully patching all functions within a modified object. Functions thus identified as needing patching are copied into the PO and marked as code.

(ii) Symbol Resolution: After identifying all functions that require a patch, we need to resolve outstanding symbol references within each function. Typically, symbol resolution for an application happens at both the linking stage (called *static linking*, when the symbol is present within another object file or archive), and the execution stage (or *dynamic linking*, when the symbol is present within a shared library). All code relocations are identified in the ELF sections .rel.text and .rela.text, within the object files and the final executable. Each relocation entry contains, among other information, the code offset that requires relocation, and the outstanding symbol that provides this fix-up.

For each relocation entry, Katana uses the replicated executable (from *before* the patch) to figure out the address of the symbol. If the symbol was provided by another object file, then the symbol table of the old executable contains this final address, and we update the PO accordingly, with this address as the patch target. Otherwise, if the symbol was dynamic (*i.e.*, present in a shared library such as libc), then the fixup value is the address of a corresponding entry in the procedure linkage table (*PLT*) of the executable. The PLT is essentially a jump table with entries for each symbol that needs to be resolved at runtime by the dynamic linker. When the process begins execution, the dynamic linker maps the required shared libraries into the address space of the process, and updates each PLT entry.

For dynamic symbols, Katana traverses the PLT entries of the replicated executable and compares the symbol name of each entry with the symbol name that requires relocation. If Katana finds a match, then the PO is updated with the corresponding symbol value. In our prototype, Katana is unable to handle calls to previously unused functions present in any shared libraries<sup>3</sup>

Finally, if the outstanding symbol's definition was not found within the replicated executable (either within the symbol table or the PLT), then it was newly added by the patch; it is marked as such and added to the PO.

(iii) *Patch Application:* Applying a code patch is simple enough, and has been researched in other systems [1], [2], [3], [20]. We map the new function in memory, and insert a trampoline jmp instruction at the beginning of the old function within the process memory image. This interposition allows the caller to execute our new function instead of the previous one at the cost of an extra jump. It is possible to avoid the overhead (from branch mis-prediction) of the jmp instruction by adding code in the old function which traces up the stack and modifies the caller's call instruction operand to point to the new address instead of the old one. Although this optimization would ensure that all subsequent calls from the same caller would execute the new patched function without stepping into the old one, it does makes the process of rolling back a patch non-trivial.

**Data Patching.** Patching data within a running process is significantly harder than patching application code. The primary challenge here is to synchronize the code and the data structures it acts on.<sup>4</sup>

Tracking down previously allocated data is nontrivial (one of the reasons why garbage collectors are interwoven with the language implementation). Even after identifying the allocated chunks of memory, in the absence of some kind of a type specification, the *internal structure* of memory remains opaque. We also need a method for extracting only the modified data variables from the patch and a means to discover the actual modifications that were performed.

We first note that any code that acts on patch-modified data is already taken care of by Katana's code patching process. This is because we rely on make to build the object files that correspond to all modified sources. We resolve the previously identified problems towards patching data by leveraging DWARF<sup>5</sup> debugging information within the application executable. This requires the object files to be compiled with debugging support, but we do not see this as a limitation. Since we only need DWARF information while building the PO, all debugging symbols can be stripped from the executable during application deployment, if so desired.

<sup>5</sup>http://dwarfstd.org

<sup>&</sup>lt;sup>3</sup>This would require creation of new PLT and GOT entries and either subsequent re-basing of the following segments of the executable, or creation of a new segment to allocate the extra entries. Although ELF rewriting systems like ERESI or Diablo show that such manipulations can be made practical, we chose not to complicate Katana with them.

<sup>&</sup>lt;sup>4</sup>For example, consider adding a new member to a C struct definition and an additional clause to the logic that processes it.

We recall the representation of types in the DWARF format and then detail the various steps in Katana's data patching process.

**DWARF type information.** The DWARF structure is laid out as a tree of DIEs (*Debugging Information Entries*) within the executable file. Each DIE has an associated tag and a set of attributes. The DIE that defines type information has the tag as one of DW\_TAG\_base\_type, DW\_TAG\_structure\_type or DW\_TAG\_union\_type. Typedefs and other type modifiers (such as const, volatile, pointer *etc.*) are referenced by the DIE that defines the type. In case of structures or unions, each member is contained as a separate DIE within the parent DIE that identifies the struct/union. It is important to note that DWARF annotates types of *all* visibilities from the program sources - local, global and static.

Katana's data patching process contains a number of steps:

(i) *Type Discovery:* We set out to discover all newly created or modified data types – those that are primarily user-defined (such as structures and unions in **C**). Katana traverses the type information (as identified by the above DWARF tags) from the newly created executable, and for each encountered type, it searches for the corresponding type-name within the *replicated* executable (from before the patch). If so found, the full types (i.e. the number, type and position of all member variables contained within) are compared to determine if they are identical. If not identical, the parent type identifying the struct/union is inserted into the PO. Else, if the type name itself was not found within the replicated executable, then the current type was created by the patch, and is added as such to the PO.

(ii) Data Traversal: The next step is to traverse all variables defined within the new application, and for each one encountered, we first determine its lexical scope. If the scope is local, then we ensure that the corresponding function (the one that defines this variable) does not have an activation frame on the program stack while applying the patch. Else, the variable has been defined as either global or static. We first check if the replicated executable defines the same variable. If not, then this variable has been created by the patch and we need not worry about it and leave the symbol resolution upto the compiler (as only new code can use this variable). Otherwise, we verify whether the variable's type is one of the modified types identified during type discovery. If it is, then we add the variable along with its *original* address from the replicated executable, its new address from the patch, and type information to the PO. At the end of this stage, Katana would have identified all newly created or modified variables from the patch.

(iii) *Patch Application:* Applying a data patch consists of first tracking down the relevant symbols in program memory. Katana reads in the PO, and for each data variable encountered, it checks if the variable is a pointer or not. If it is, then the current validity of the pointer is verified (by bounds-

checking the pointer value to within heap boundaries). If the pointer is found to be invalid, no further action is taken. If the pointer is valid, then memory for the new type(s) is allocated, the older structure is copied into the new one taking into account the difference in structure definition, the old memory is then freed, and the pointer is modified to point to the new segment (in case of structures such as lists, trees, since we have the type specification, we can repeat this process recursively for each node on the list or tree). Else if the variable is not a pointer, then Katana modifies all its references in the program text to the updated memory location from the patch. Katana automatically zeros all *new* member variables within structures.

**Challenges.** Hot patching still faces a number of challenges, including dealing with multithreaded programs and address space randomization (which slight changes to the OS loader can help us overcome). Furthermore, dynamic updates require some knowledge of the program's execution state so that the application is quiescent with respect to the code and data being altered by Katana as it applies the Patch Object. We consider the program to be in a safe state if all activation records are free of functions contained in the PO and all activition records are free of functions that (1) access any global or static symbols we identify during Katana's *Data Traversal* stage and (2) do not define any local variables of modified types identified during our Type Discovery phase. Katana uses the ptrace interface to pause execution and query this state.

## IV. DISCUSSION

When to apply the patch. Dynamically updating a running application requires diligence and patience. One cannot update the target application without any knowledge of the program's execution state, by which we mean the program stack, processor registers *etc*. Even after possessing this information, the application has to be in what we call a "safe state" for Katana to apply the patch. We characterize a program state as a *safe state* if the following two conditions hold:

- All activation frames in the program stack belong to functions that *do not* get updated during code patching. It is easy to verify this by comparing each function on the stack to the list of upgradeable functions contained within the PO.
- All activation frames in the program stack belong to functions that do not access any global/static symbols identified during *Data Traversal*, and do not define any local variables of the modified types identified during *Type Discovery*. Again, since we maintain type and variable definitions within the PO, verifying this condition is easy.

Given the patch object, Katana uses Linux's ptrace interface to temporarily halt the execution of the target process, query the current execution stack and determine if the application is currently in a safe state. If so, then Katana applies the code patch followed by the data patch. We note that it is not possible to apply the code and data patches at different times since new code likely uses the new data, and hence postponing data patching to when only the second condition is satisfied is impractical and unsafe.

Let A denote be the current activation frame on the program stack, and the notation (X : Y) define all frames from X to Y (on a time scale, X precedes Y) on the stack; so (1 : A) defines the current stack. Now, in case we determine (1 : A) to be an unsafe state, we could repeatedly keep querying the stack until the application reaches some safe state. However, this is highly inefficient and cumbersome.

Instead, when we determine the program to be in an unsafe state, we traverse up the stack from A, and for each preceding frame (say A'), we determine if (1 : A') is a safe state. This takes into consideration only A' and all other frames preceding it. If (1 : A') is a safe state, then we insert a breakpoint on the return instruction pointer (EIP) pointed to by the successive frame: (A' + 1). What this guarantees us is that when this breakpoint is hit, the state of the program stack will be (1 : A'). Since we just determined this to be a safe state, we can reliably conduct the patching procedure. If however, no such frames preceding A satisfy a safe state, then it means that the application cannot be patched successfully in its current execution since there will always be a function that violates our safety condition.

Finally we note that even after inserting a breakpoint, the problem of determining *when* the breakpoint will be hit is essentially a hard one, and so in such cases, Katana can provide no time-bounding guarantees. Still, this is a cleaner and more efficient approach than just naïvely retrying the full update procedure, which is both an expensive and incomplete solution.

Address Space Randomization. Load-time address randomization has become a stable and popular way of raising the bar for attackers, and so we must discuss how it interacts with our patching scheme. The gist of randomization schemes is invalidating various default assumptions regarding the locations of code and data elements that might facilitate exploitation. In particular, the virtual addresses of loadable segments are displaced by random<sup>6</sup> offsets by the loader, which *relocates* them (using their accompanying relocation sections).

Patching relocated code with our PO files requires knowledge of the displacements introduced at loading-andrelocation time. While there is no common ABI standard for saving this information, conceptually it is no different from saving virtual addresses of other files' loaded symbols in the *Global Offset Table* (GOT). We note that the names of the constituent object files themselves are customarily included in the symbol tables, and that the symbol table entry format can be easily adopted for storing virtual addresses of the relocated objects.

Thus, at the cost of small modifications to the OS loader and the dynamic linker, we can make the information on the layout of the "randomly" relocated executable and libraries available to our patching process driven by our POs.<sup>7</sup>

**Future work.** Katana is a work in progress, and must address several important engineering issues, such as interaction of patched code with dynamically loaded libraries (including the *dlopen* mechanism), and assuring that accumulation of administered patches does not lead to unacceptable performance degradation. It also poses a broader question of describing and detecting software designs not amenable to its runtime patching and steering programmers to avoid them if possible.

#### V. RELATED WORK

Maintaining continuous availability, even in the absence of disruptive events like patches, is both a challenging technical exercise and the driving need for research on dependability, reliability, and fault tolereance [21].

The work most closely related to Katana focuses on enabling a software application to continue providing service or survive significant events like errors, exploits, and patches. This body of work includes research on dynamic kernel updates, software survivability, and software selfhealing. However, other research areas also addressed the challenge of enabling software to adapt at runtime, e.g., the area of software evolution (e.g., [18]).

The concept of crash-only software [7] advocates microrebooting: the procedure of retrofitting each component of a system with the ability to crash and reboot safely as the default mode of operation. Despite its appeal as a design principle, such an approach would be difficult to retrofit to legacy software. Although restarting a particular service or application is disruptive enough, rebooting the operating system itself multiplies this disruption. The need to avoid that kind of downtime helped drive the creation of frameworks like Loadable Kernel Modules for Linux, which allow for extending the kernel during runtime without a reboot. The ability to update the running kernel (as opposed to adding or removing modules) without rebooting was achieved at least ten years ago [8] and recently rediscovered, albiet mostly for research, rather than commodity, kernels [14], [4], [17]). Even so, dynamic updates of the kernel during runtime that don't require a reboot are difficult to apply to a commodity

<sup>&</sup>lt;sup>6</sup>In reality, the choice of offset is still limited by the platform's alignment requirements.

<sup>&</sup>lt;sup>7</sup>We note that saving this information about the post-relocation layout of the process does not weaken "randomization", because the latter does not assume the attacker's ability to arbitrarily read process memory (in which case the addresses of required symbols are easily found by scanning it for their code or data patterns), but rather breaks hard-coding of these symbols' expected addresses.

OS, although several efforts have been successful for the K42 experimental system [17], [5].

Software self-healing aims at ensuring continuous or increased availability for systems subjected to exploited vulnerabilities, either by automatically generating patches [19], [15] to gradually harden the application or seeking to avoid a restart altogether by modifying certain runtime aspects (*e.g.*, the memory subsystem [12], properties of the execution environment [11]), or selected control paths [16], [9]) of the system in response to attacks. One major risk of employing self-healing in production environments is that the semantics of follow-on execution remain largely uncontrolled, although recent work in automatically correcting memory errors [10] seems to achieve fairly reliable results. Both automated responses and traditional patches can make it difficult for an administrator to understand the implications of a particular fix [13].

## VI. CONCLUSION

We introduce a method for hot patching: a technique we believe to be a promising alternative to redundancy, ad hoc self-healing techniques, "patch and pray," or other approaches to dynamic software updates. Hot patching has the potential for aligning actual practices with acknowledged "best practices" relating to critical security or functionality updates. We hold that one major impediment to hot patching is the opaque nature of most patches (be it proprietary or open software), and our method of patching along with the PO file format are first attempts at providing a basis for informed reasoning about the structure and implications of a patch.

#### REFERENCES

- [1] http://pannus.sourceforge.net/.
- [2] http://ukai.jp/Software/livepatch/.
- [3] J. Arnold and M. F. Kaashoek. Ksplice: Automatic Rebootless Kernel Updates. In *Proceedings of EuroSys*, 2009.
- [4] A. Baumann, J. Appavoo, R. W. Wisniewski, D. D. Silva, O. Krieger, and G. Heiser. Reboots Are for Hardware: Challenges and Solutions to Updating an Operating System on the Fly. In *Proceedings of the USENIX Annual Technical Conference*, June 2007.
- [5] A. Baumann, G. Heiser, J. Appovoo, D. D. Silva, O. Krieger, R. Wisniewski, and J. Kerr. Providing Dynamic Update in an Operating System. In *Proceedings of the USENIX Annual Technical Conference*, pages 279–291, 2005.
- [6] A. Brown and D. A. Patterson. Rewind, Repair, Replay: Three R's to dependability. In 10<sup>th</sup> ACM SIGOPS European Workshop, Saint-Emilion, France, Sept. 2002.
- [7] G. Candea and A. Fox. Crash-Only Software. In Proceedings of the 9<sup>th</sup> Workshop on Hot Topics in Operating Systems (HOTOS-IX), May 2003.

- [8] S. Cesare. Runtime Kernel kmem Patching, 1998. http://vx. netlux.org/lib/vsc07.html.
- [9] M. E. Locasto, A. Stavrou, G. F. Cretu, and A. D. Keromytis. From STEM to SEAD: Speculative Execution for Automatic Defense. In *Proceedings of the USENIX Annual Technical Conference*, pages 219–232, June 2007.
- [10] G. Novark, E. D. Berger, and B. G. Zorn. Exterminator: Automatically correcting memory errors with high probability. *Commun. ACM*, 51(12):87–95, 2008.
- [11] F. Qin, J. Tucek, J. Sundaresan, and Y. Zhou. Rx: Treating Bugs as Allergies – A Safe Method to Survive Software Failures. In *Proceedings of the Symposium on Systems and Operating Systems Principles (SOSP)*, 2005.
- [12] M. Rinard, C. Cadar, D. Dumitran, D. Roy, T. Leu, and J. W Beebee. Enhancing Server Availability and Security Through Failure-Oblivious Computing. In *Proceedings* 6<sup>th</sup> Symposium on Operating Systems Design and Implementation (OSDI), December 2004.
- [13] M. C. Rinard. Technical perspective patching program errors. *Commun. ACM*, 51(12):86–86, 2008.
- [14] sd. Linux on-the-fly Kernel Patching Without LKM. http: //doc.bughunter.net/rootkit-backdoor/kernel-patching.html.
- [15] S. Sidiroglou, M. E. Locasto, S. W. Boyd, and A. D. Keromytis. Building a Reactive Immune System for Software Services. In *Proceedings of the USENIX Annual Technical Conference*, pages 149–161, April 2005.
- [16] A. Smirnov and T. Chiueh. DIRA: Automatic Detection, Identification, and Repair of Control-Hijacking Attacks. In Proceedings of the 12<sup>th</sup> Symposium on Network and Distributed System Security (NDSS), February 2005.
- [17] C. A. N. Soules, J. Appavoo, K. Hui, R. W. Wisniewski, D. da Silva, G. R. Ganger, O. Krieger, M. Simon, M. Auslander, M. Ostrowski, B. Rosenburg, and J. Xenidis. System Support for Online Reconfiguration. In *Proceedings of the* USENIX Annual Technical Conference, pages 141–154, 2003.
- [18] A. D. Stefano, G. Pappalardo, and E. Tramontana. An infrastructure for runtime evolution of software systems. *Computers* and Communications, IEEE Symposium on, 2:1129–1135, 2004.
- [19] W. Weimer, T. Nguyen, C. L. Goues, and S. Forrest. Automatically Finding Patches Using Genetic Programming. In *International Conference on Software Engineering (ICSE)*, 2009.
- [20] K. Yamato and T. Abe. A Runtime Code Modification Method for Application Programs. In *Proceedings of the Ottawa Linux Symposium*, 2009.
- [21] Y. Zhou, D. Marinov, W. Sanders, C. Zilles, M. d'Amorim, S. Lauterburg, R. M. Lefever, and J. Tucek. Delta Execution for Software Reliability. In *Proceedings of the Third Workshop on Hot Topics in System Dependability (HotDep'07)*, June 2007.