Concurrency Attacks and Defenses

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Final Report

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Concurrency Attacks and Defenses

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Multithreaded programs are getting increasingly pervasive and critical. Unfortunately, they remain extremely difficult to write. This difficulty has led to many subtle but serious concurrency vulnerabilities such as race conditions in real-world multithreaded programs. Just as vulnerabilities in sequential programs can lead to security exploits, concurrency vulnerabilities can also be exploited by attackers to gain privilege, steal information, inject arbitrary code, etc. The objective of this project is to take a holistic approach to creating novel program analysis/protection techniques and a system called DASH to secure multithreaded programs and harden traditional defense techniques in a concurrency environment.

Concurrency attacks, Multithreading, Vulnerability, Security, Software Hardening
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Final Report:
Project Concurrency Attacks & Defenses

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2. Research Objectives

Multithreaded programs are getting increasingly pervasive and critical. Unfortunately, they remain extremely difficult to write. This difficulty has led to many subtle but serious concurrency vulnerabilities such as race conditions in real-world multithreaded programs. Just as vulnerabilities in sequential programs can lead to security exploits, concurrency vulnerabilities can also be exploited by attackers to gain privilege, steal information, inject arbitrary code, etc. Concurrency attacks targeting these vulnerabilities are impending (see CVE [http://www.cvedetails.com/vulnerability-list/cweid-362/vulnerabilities.html](http://www.cvedetails.com/vulnerability-list/cweid-362/vulnerabilities.html)), yet few existing defense techniques can deal with concurrency vulnerabilities. In fact, many of the traditional defense techniques are rendered unsafe by concurrency vulnerabilities.

The objective of this project is to take a holistic approach to creating novel program analysis/protection techniques and a system called DASH to secure multithreaded programs and harden traditional defense techniques in a concurrency environment. We do so by selectively combining static and dynamic techniques, thus getting the best of both worlds. We anticipate numerous contributions from this project; the main ones are: (1) a thorough understanding of concurrency attacks and their implications to traditional defense techniques;
(2) accurate and effective techniques to detect, avoid, and survive concurrency vulnerabilities; and (3) hardening of traditional defense techniques for multithreaded programs. The greatest impact of our project is a novel approach and the DASH system for improving software security and reliability, thus greatly benefiting the Nation’s cyber security. DASH can also be used for offense: the Military can gain new competitive means in cyber warfare by running DASH to identify concurrency vulnerabilities in the infrastructure of hostile nations.

3. **Brief Description of the proposed efforts**

Two trends have caused multithreaded programs to become pervasive and critical. The first is a hardware trend: the rise of multicore computing. For years, sequential code enjoyed automatic speedup as computer architects steadily made single-core multiprocessors faster. Recently, however, this “free lunch is over”: power and wire-delay constraints have forced microprocessors into multicore designs, and adding more cores does not automatically speed up sequential code. Thus, developers, including those working for various government agencies, are writing more and more multithreaded code.

The second trend is a software one: the coming storm of cloud computing. More and more services, including many traditionally offered on desktops (e.g., word processing), are now served from distributed “clouds” of servers to meet the current computing demands for high scalability, always-on availability, everywhere connectivity, and desirable consistency. These services are also getting ever richer and more powerful—and thus computation and data intensive. To cope with this massive workload, practically all services today employ threads to increase performance.

Unfortunately, despite our increasing reliance on multithreaded programs, they remain extremely difficult to write. This difficulty has led to many subtle but serious concurrency vulnerabilities such as race conditions in real-world multithreaded programs. Multithreaded programs are the most widespread parallel programs, yet many luminaries in computing consider parallel programming one of the top challenges facing computer science. As John Hennessy once put: “when we start talking about parallelism and ease of use of truly parallel computers, we’re talking about a problem that’s as hard as any that computer science has faced.” Just as vulnerabilities in sequential programs can lead to security exploits, concurrency vulnerabilities can similarly compromise security and lead to what we call concurrency attacks. Our recent study of real concurrency vulnerabilities shows that these vulnerabilities are very dangerous: they allow attackers to corrupt arbitrary program data, inject malicious code, and escalate privileges. Worse, in addition to being directly exploited by attackers, concurrency vulnerabilities also compromise key defense techniques we used to trust. For instance, consider an information flow tracking mechanism that tracks whether each piece of program data is classified or not using a metadata tag. An attacker may exploit a race condition on program
data to make the data and the tag inconsistent, thus evading the information flow tracking mechanism.

We believe concurrency attacks are an imminent threat to the Nation’s cyber security: they are becoming a major form of future cyber-attacks. Unfortunately, we currently lack a thorough understanding of concurrency attacks. Nor do we have automated and effective techniques to detect, avoid, or survive concurrency vulnerabilities. Despite repeated efforts, precisely and comprehensively analyzing multithreaded programs has been an open challenge for at least three decades.

The key reason that multithreaded programs are so difficult to analyze is that each run of a multithreaded program may interleave the threads differently. For a typical multithreaded program, the number of these thread interleavings, or schedules, is enormous—asymptotically exponential in the program size. Existing methods to analyze multithreaded programs are either static (compile-time) or dynamic (runtime), yet both have difficulties analyzing this enormous number of schedules. Specifically, static techniques can analyze all statements that a compiler can see, but it is not good at reasoning about runtime behaviors such as all possible schedules that may occur. Thus, it has to over-approximate these schedules, often resulting in poor precision and tons of false positives when applied to concurrency vulnerability detection. Dynamic techniques can precisely reason about the schedules executed at runtime. However, they can analyze only the schedules occurred, and they rarely cover more than a tiny fraction of all possible schedules. Thus, the next execution of a multithreaded program may well use an unchecked schedule and run into a concurrency vulnerability.

The objective of this proposal is to take a holistic approach to creating novel program analysis/protection techniques and the DASH system to effectively detect, avoid, and survive concurrency vulnerabilities and harden traditional defense techniques in a concurrency environment. We address this open challenge of creating secure and reliable multithreaded programs by selectively combining static and dynamic techniques, thus getting the best of both worlds. Specifically, we guide static analysis using real schedules observed at runtime. By targeting static analysis toward only the schedules that matter, we drastically improve its precision. We then protect the execution of multithreaded programs by dynamically enforcing the schedules that are thoroughly checked and deemed free of concurrency vulnerabilities. The feedback loop formed by integrating static and dynamic analysis positively enhance each other, resulting in more secure and reliable multithreaded programs.

To fully evaluate our approach, we plan to go “from soup to nuts” in designing and building a prototype system of DASH and applying it to real multithreaded programs. Besides the DASH system and the novel approach of combining static and dynamic techniques to harden multithreaded programs, we anticipate five additional contributions within the proposed research:

- A thorough study of concurrency attacks and their implications to traditional defense techniques;
• **Schedule-guided detection**, a static analysis technique to accurately and effectively detect concurrency vulnerabilities;

• **Schedule enforcement**, a software protection technique to enforce the schedules that are well checked and deemed correct, thus avoiding potential concurrency vulnerabilities in unchecked schedules;

• **Schedule diversification**, a software diversification technique to survive previously unknown concurrency vulnerabilities; and

• **Hardening of traditional defense techniques** such as taint tracking and information flow tracking for multithreaded programs.

**Applications of the Proposed Research.** The greatest impact of our project is a novel approach and new, effective systems and technologies to improve software security and reliability, greatly benefiting the Nation’s cyber security. I plan to leverage my long-term connections with Microsoft, the biggest software company, and Coverity, a top software quality assurance startup, to make the technologies developed within this effort available to the public (see letters of support for technology transfer opportunities). We envision numerous applications of the proposed research. The main ones include:

1. The thorough understanding of concurrency vulnerabilities we develop helps other researchers and practitioners to come up with new defense techniques.

2. Developers of multithreaded programs can use DASH to accurately detect concurrency vulnerabilities in their code. By fixing these concurrency vulnerabilities, they create more secure and reliable multithreaded programs that can both efficiently use the power of multicore hardware and effectively fend off concurrency attacks.

3. Users of multithreaded programs can use DASH to avoid or survive concurrency vulnerabilities at runtime, further strengthening the Nation’s cyber infrastructure and increasing its resilience against concurrency attacks.

4. Builders of traditional defense techniques such as information flow tracking can use DASH to harden their techniques and achieve the same safety guarantees for both sequential and multithreaded programs.

5. Alternatively, DASH can be used for offense. For instance, the Military can gain new competitive means in cyber warfare by running DASH to identify concurrency vulnerabilities in the infrastructure of hostile nations. Furthermore, although we focus on multithreaded programs in this effort, many proposed techniques benefit concurrent programs written in other programming models, such as MPI and OpenMP.
4. **Results from the project**

Since the beginning of the project, we have made tremendous progress developing four components of the project, including the thorough study of concurrency attacks and their implications to traditional defense techniques; schedule-guided detection, a static analysis technique to accurately and effectively detect concurrency vulnerabilities; schedule enforcement and diversification, software protection techniques to enforce the schedules that are well checked and deemed correct, thus avoiding potential concurrency vulnerabilities in unchecked schedules; and Hardening of traditional defense techniques such as taint tracking and information flow tracking for multithreaded programs. Our results have led to total 15 publications at the best venues, 26 invited talks at many universities and research institutes, and several releases of open source software.

**Relevant Publications (total 15):**


12. Junfeng Yang, Heming Cui, and Jingyue Wu. *Determinism is overrated: What really makes multithreaded programs hard to get right and what can be done about it?* In the Fifth USENIX Workshop on Hot Topics in Parallelism (HOTPAR ’13), June 2013.


   Also appeared as journal publication:


   Also appeared as journal publication:

**Relevant Invited Talks (total 26):**


7. 02/2014 “Determinism Is Not Enough: Making Parallel Programs Reliable with Stable Multithreading.” UCLA. Host: Todd Millstein


10. 11/2013 “Determinism Is Not Enough: Making Parallel Programs Reliable with Stable Multithreading.” UCSD. Host: Yuanyuan Zhou

11. 11/2013 “Determinism Is Not Enough: Making Parallel Programs Reliable with Stable Multithreading.” Stanford University. Host: Alex Aiken

12. 10/2013 “Determinism Is Not Enough: Making Parallel Programs Reliable with Stable Multithreading.” Cornell University. Host: Andrew Myers

14. 08/2013 “Determinism Is Not Enough: Making Parallel Programs Reliable with Stable Multithreading.” Beijing University. Host: Yao Guo

15. 08/2013 “Determinism Is Not Enough: Making Parallel Programs Reliable with Stable Multithreading.” Shanghai Jiaotong University. Host: Haibo Chen

16. 07/2013 “Effectively Model Check Real-World Distributed Systems.” National University of Singapore. Host: Jin Song Dong


18. 04/2013 “Effectively Model Check Real-World Distributed Systems.” Rutgers. Host: Santosh Nagarakatte

19. 12/2012 “Effectively Model Check Real-World Distributed Systems.” CMU. Host: Garth Gibson

20. 10/2012 “Pervasive Detection of Process Races in Deployed Systems.” University of Southern California. Host: Minlan Yu

21. 06/2012 “Improving the Reliability and Security of Parallel Programs.” Tsinghua University. Host: Wenguang Chen

22. 06/2012 “Improving the Reliability and Security of Parallel Programs.” Beihang University. Host: Chunming Hu

23. 06/2012 “Improving the Reliability and Security of Parallel Programs.” Beijing University. Host: Yao Guo


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Junfeng Yang

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**Abstract**
Multithreaded programs are getting increasingly pervasive and critical. Unfortunately, they remain extremely difficult to write. This difficulty has led to many subtle but serious concurrency vulnerabilities such as race conditions in real-world multithreaded programs. Just as vulnerabilities in sequential programs can lead to security exploits, concurrency vulnerabilities can also be exploited by attackers to gain privilege, steal information, inject arbitrary code, etc. Concurrency attacks targeting these vulnerabilities are impending (see CVE http://www.cvedetails.com/vulnerability-list/cweid-362/vulnerabilities.html), yet few existing defense techniques can deal with concurrency vulnerabilities. In fact, many of the traditional defense techniques are rendered unsafe by concurrency vulnerabilities.

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**Research Objectives**

**Technical Summary**

**Funding Summary by Cost Category (by FY, $K)**
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