

# **Dynamische Programmanalysen für nebenläufige Programme - Data Race Prediction mit TSan V2**

Seminararbeit

Student:	Frank Ling
Matrikelnummer:	79496
Universität:	Hochschule Karlsruhe – Technik und Wirtschaft
Studiengang:	Informatik, Master
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Betreuer:	Prof. Martin Sulzmann
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# 1 Introduction

Nowadays concurrent programs are very common in order to make use of 'hyper-threading and multi-core architectures' [1, p. 14]. 'Due to the highly non-deterministic behavior of concurrent programs' [2, p. 1] data races may arise but can also be hard to find, as they also 'may only arise under a specific schedule' [2, p. 1]. This will be elaborated in the following section. This seminar work specifically analyzes the data race prediction algorithms of FastTrack and ThreadSanitizer (TSan) V2. TSan V2 uses a slightly modified version of the FastTrack algorithm and differentiates itself from the first version by utilizing happens-before methods instead of the lockset method.

Firstly the motivation and background for dynamic data race prediction tools will be shown. Then the FastTrack and TSan algorithms will be demonstrated along with examples showing the limitations of FastTrack and TSan. In the following the same notation as in [2] will be used for traces and events.

## 2 Motivation and Examples

As stated in the introduction concurrent programs are commonly used and are inherently prone to data races. The problem with data races is that they can cause undefined behavior and crashes while also being hard to reproduce. This makes data races hard to find and they might not always be apparent. This chapter will show a few examples from [3] but rewritten in the programming language C++. The following example shows a program, which exhibits a data race (see chapter 3):

```
1  #include "pthread.h"
2
3  int var1;
4  pthread_mutex_t var2;
5
6  void *Thread1(void *x) {
7      // w(x)1
8      var1++;
9      // acq(y)2
10     pthread_mutex_lock(&var2);
11     // rel(y)3
12     pthread_mutex_unlock(&var2);
13     return NULL;
14 }
15
16 void *Thread2(void *x) {
17     // acq(y)4
18     pthread_mutex_lock(&var2);
19     // w(x)5
20     var1--;
21     // rel(y)6
22     pthread_mutex_unlock(&var2);
23     return NULL;
24 }
25
26 int main() {
27     pthread_t t[2];
28     pthread_create(&t[0], NULL, Thread1, NULL);
29     pthread_create(&t[1], NULL, Thread2, NULL);
30     pthread_join(t[0], NULL);
31     pthread_join(t[1], NULL);
32 }
```

Listing 1: Program containing conflicting events

Generally the corresponding event in the resulting trace is seen above each operation as a comment in the code. For example acquiring and releasing a lock is accomplished by the

`pthread_mutex_lock()`- and the `pthread_mutex_unlock()`-method, which is used in line 10, where a lock on the variable `var2` is acquired. The corresponding event in the trace would be  $1\#acq(y)_2$  which is indicated by the method name and the comment above in line 9. The method name shows which thread the event is from and the comment specifies the event. As a write event a variable can simply be incremented or assigned a value. A simple read event could be printing a variable in the console as it accesses the value of the variable. The following trace can be generated for the program 1:

	1#	2#
1.	w(x)	
2.	acq(y)	
3.	rel(y)	
4.		acq(y)
5.		w(x)
6.		rel(y)

Table 1: Possible trace of listing 1

In the trace 1 the events  $1\#w(x)_1$  and  $2\#w(x)_5$  do not appear right next to each other which might indicate that these two events are not part of a data race. By rerunning the program 1 eventually the following trace can be obtained:

	1#	2#
4.		acq(y)
5.		w(x)
1.	w(x)	
6.		rel(y)
2.	acq(y)	
3.	rel(y)	

Table 2: Trace 1 reordered

The trace 2 shows the two events  $1\#w(x)_1$  and  $2\#w(x)_5$  are now right next to each other and hence they are part of a data race. This also shows that there are data races that can only be detected under a specific schedule. Data race prediction tools use various methods to try to predict such cases. This report will analyze

## 3 Background

### 3.1 Dynamic Data Race Prediction

Race prediction can be done static or dynamic. Static race prediction uses static analysis, meaning it tries to find data races before running the code. For more details on static race prediction see [4].

Dynamic data race prediction tools run a program and then try to find data races by reordering the obtained trace. The method of reordering traces to try to predict data races is called dynamic data race prediction, see [3, p. 2], and will be discussed in this work. The approach of finding all possible reorderings is used in exhaustive predictive methods. Since modern programs may utilize multiple threads each executing large blocks of code, finding all possible reorderings might not always be feasible. Therefore effective predictive methods are employed which compromise *completeness* and *soundness* for better coverage. FastTrack and TSan are examples for dynamic data race prediction using effective predictive methods.

Sulzmann and Stadtmüller [2, p. 2] define completeness and soundness as follows:

Sound means that races reported by the algorithm can be observed via some appropriate reordering of the trace. If unsound, we refer to wrongly a classified race as a *false positive*. Complete means that all valid reorderings that exhibit some race can be predicted by the algorithm. If incomplete, we refer to any not reported race as a *false negative*.

### 3.2 Happens-Before Relation and Data Race

As stated in [3, p. 4], the happens-before relation is used to partially order the events in a system. The happens-before relation is defined as a strict partial order so the ordering is transitive but irreflexive.

Events can either be ordered and therefore a happens-before relation can be established between them, or they can not be ordered in which case both events 'are said to be *concurrent*' [5, p. 2]. Further two events '[...] *conflict* if they both access (read or write) the same variable, and at least one of the operations is a write. Using this terminology, a trace has a race condition if it has two concurrent conflicting accesses.' [6, p. 2]. An example of a data race can be seen in the trace 2.

In FastTrack and TSan Lamport's happens-before relation [5], referred to as HB relation, is used. The HB relation additionally to the above imposes the program order condition and critical section order condition. The program order condition defines that two events  $e$  and  $f$  belonging to the same thread, with  $e$  appearing before  $f$  in the trace, then  $e <^{HB} f$  applies.  $<^{HB}$  denotes the HB ordering relation. The critical section order condition imposes that for two acquire and release events  $acq(y)$  and  $rel(y)$  on the same lock  $y$  where

both events result from different threads with  $rel(y)$  appearing before  $acq(y)$  in the trace, then  $rel(y) <^{HB} acq(y)$  applies [3, p. 4].

### 3.3 Vector-Clock

As stated by Flanagan and Freund [6, p. 1]:

Typically, the happens-before relation is represented using vector clocks (VCs) [...]. Vector clocks are expensive, however, because they record information about each thread in a system. Thus, if the target program has  $n$  threads, then each VC requires  $O(n)$  storage space and each VC operation requires  $O(n)$  time. Motivated in part by the performance limitations of vector clocks, a variety of alternative imprecise race detectors have been developed, which may provide better coverage but can report false alarms on race-free programs.

Sulzmann and Stadtmüller define vector clocks as follows [2, p. 7]:

A vector clock  $V$  is a list of time stamps of the following form.

$$v ::= [i_1, \dots, i_n] \tag{1}$$

We assume vector clocks are of a fixed size  $n$ . Time stamps are natural numbers and each time stamp position  $j$  corresponds to the thread with identifier  $j$ . We define

$$[i_1, \dots, i_n] \sqcup [j_1, \dots, j_n] = [\max(i_1, j_1), \dots, \max(i_n, j_n)] \tag{2}$$

to synchronize two vector clocks by building the point-wise maximum. We write  $V[j]$  to access the time stamp at position  $j$ . We write  $\text{inc}(V, j)$  as a short-hand for incrementing the vector clock  $V$  at position  $j$  by one. We define vector clock  $V_1$  to be smaller than vector clock  $V_2$ , written  $V_1 < V_2$ , if (1) for each thread  $i$ ,  $i$ 's time stamp in  $V_1$  is smaller or equal compared to  $i$ 's time stamp in  $V_2$ , and (2) there exists a thread  $i$  where  $i$ 's time stamp in  $V_1$  is strictly smaller compared to  $i$ 's time stamp in  $V_2$ . [...] For each thread  $i$  we maintain a vector clock  $Th(i)$ . [...] Initially, for each vector clock  $Th(i)$  all time stamps are set to 0 but position  $i$  where the time stamp is set to 1.

Sulzmann and Stadtmüller further state that for two events  $e$  and  $f$  with vector clocks  $V_1$  assigned to  $e$  and  $V_2$  assigned to  $f$ , if  $V_1 < V_2$  then it can be said that  $e <^{HB} f$ . Further for synchronization the following applies.  $V_1 = V_2 \sqcup V_3$  then  $V_1 \leq V_2$  and  $V_1 \leq V_3$ .

With Lamport's HB relation vector clocks are incremented after processing an event to enforce the program order condition. That results in events having a pre vector clock and a post vector clock. As an example in trace 1,  $1\#w(x)$  will have the pre vector clock  $[1, 0]$ , as we are in the first thread we must initialize set the time stamp at position one to zero, and the post vector clock  $[2, 0]$ . For following events the pre vector clock be the same as

the post vector clock of the previous event. So for  $2\#acq(y)$  the pre vector clock will be  $[2, 0]$  and the post vector clock  $[3, 0]$ . To enforce the critical section order condition the pre vector

### **3.4 Epoch**



## 4 FastTrack + TSan

```
1 #include <pthread.h>
2
3 int var;
4
5 void *Thread1(void *x) {
6     // w(x)1
7     var++;
8     return NULL;
9 }
10
11 void *Thread2(void *x) {
12     // w(x)2
13     var--;
14     // w(x)3
15     // this write will not be reported as part of a data race
16     var++;
17     return NULL;
18 }
19
20 int main() {
21     pthread_t t[2];
22     pthread_create(&t[0], NULL, Thread1, NULL);
23     pthread_create(&t[1], NULL, Thread2, NULL);
24     pthread_join(t[0], NULL);
25     pthread_join(t[1], NULL);
26 }
```

Listing 2: Program demonstrating the incompleteness of TSan

As seen in [7] Lamport’s happens-before relation is also unsound. Because FastTrack and TSan both use the HB relation they might produce false positives as a result. The following program 3 shows an example in which TSan produces a false negative:

```
1 #include <pthread.h>
2
3 int var1;
4 int var2;
5
6 void *Thread1(void *x) {
7     // r(x)1
8     // w(y)2
9     var2 = var1 + 5;
10    return NULL;
11 }
12
```

```

13 void *Thread2(void *x) {
14     // r(y)3
15     if (var2 == 5)
16         // w(x)4
17         var1 = 10;
18     else
19         while (true);
20     return NULL;
21 }
22
23 int main() {
24     pthread_t t[2];
25     pthread_create(&t[0], NULL, Thread1, NULL);
26     pthread_create(&t[1], NULL, Thread2, NULL);
27     pthread_join(t[0], NULL);
28     pthread_join(t[1], NULL);
29 }

```

Listing 3: Program demonstrating the unsoundness of TSan

The program 3 may produce the following trace 3:

	1#	2#
1.	r(x)	
2.	w(y)	
3.		r(y)
4.		w(x)

Table 3: Possible trace of listing 3

## 5 Conclusion

## List of Literature

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