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CATERPILLAR: Iterative Concolic Execution for seed generation

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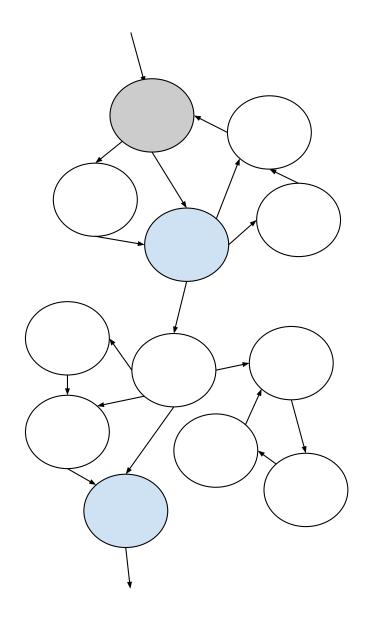
Agenda

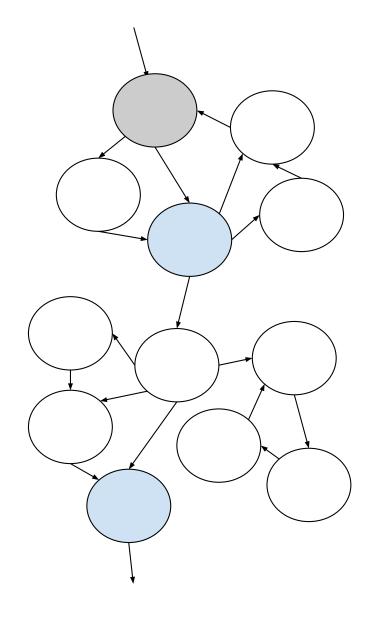
- Background
- 2 Original Idea and Evolution
- **3** Evaluation

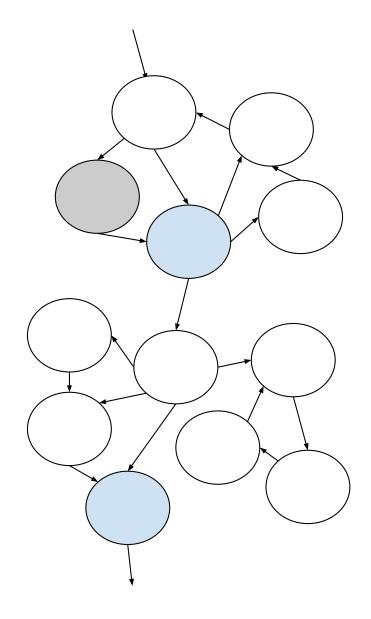
Stateful programs

Daemon

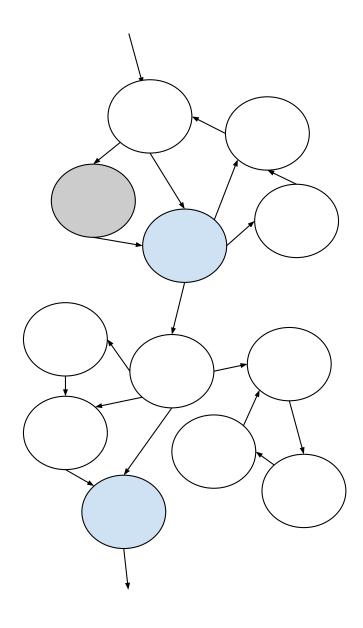
State changes as the result of processing commands



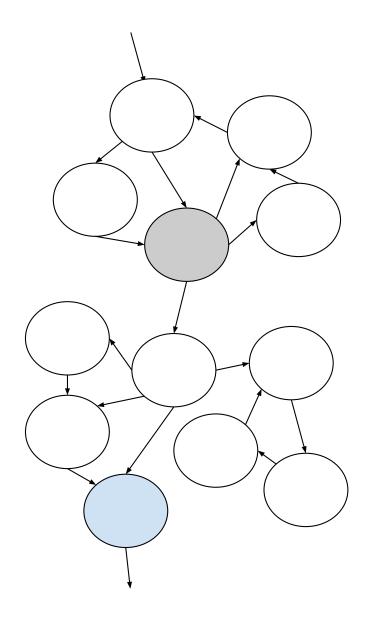




Request 2



Request 2



Current Approaches

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KLEE path explosion (plateau after a few hours)

AFL large input mutation (plateau after 1 hour)

Guided fuzzing (KLEE w/ AFL: SEFuzzer), often requires an initial seed

Our goals: CATERPILLAR

 Drive down the execution in a efficient way / navigate state machine

Generate quality inputs for a fuzzer

Bonus: find bugs during seed generation too

Stateful programs at Samsung

Android OS Trusted OS BankApp TA_Attestation SocialApp TA_KeyStore **ARM Secure Monitor**

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Android OS Trusted OS BankApp TA_Attestation SocialApp TA_KeyStore **ARM Secure Monitor**

```
int main() {
     while(1) {
          request_t req = {0};
          getClientRequest( &req );
          switch(req.command) {
                case CMD OPEN:
                     OpenSession(req.buf, req.len);
                     break:
                case CMD_INIT:
                     Init(req.buf, req.len);
                     break;
                case CMD WHATEVER:
                     Whatever(req.buf, req.len);
                     break;
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```
int main() {
      request t req = \{0\};
     // ... read client data
      Init(req.buf, req.len);
      OpenSession(req.buf, req.len);
      Decrypt(req.buf, req.len);
```

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int OpenSession(int sessionId,
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     Session t * session = 0;
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     if (validateAppData(buf, len)!= 0)
          return ERROR_DATA;
     if ( createNewSession(&session) != 0 )
          return ERROR CREATE;
     if ( generateSessionId(&session) != 0 )
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     // and so on and so forth
     session->state = SESSION_CLOSED;
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Key ideas

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- 2) Filter out "unsuccessful" states, i.e., that do not return OK
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 - i. Randomly pick a .ktest file and replay it concretely in new KLEE instance

Key ideas

- 1) Execute Init() symbolically in KLEE
- 2) Filter out "unsuccessful" states, i.e., that do not return OK
- 3) Concretize successful states as .ktest files and stop KLEE
 - Randomly pick a .ktest file and replay it concretely in new KI FF instance
 - ii. Switch to symbolic exploration in OpenSession()

```
M
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       // find session
Υ
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0
      // check session state
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C
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       if ( DoOpenSession(session, buf, len) != 0 )
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       // and so on and so forth
       session->state = SESSION OPENED;
       return OK;
```

Advantages

✓ Reduce path explosion

✓ Drive down the execution path efficiently

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X Lose in soundness (i.e., increase in false negative) which we make up for with a fuzzer

Every program is "stateful"

Stateful programs not predominant

- Other programs of interest:
 - e.g. X509 ASN1 certificate parsing (https, TLS)

```
int x509_crt_parse_der_core(
     u8 * buf, size t len)
     if( ( ret = mbedtls_asn1_get_tag( ... ) ) != 0 )
           mbedtls_x509_crt_free( crt );
           return( SOME ERROR );
     if( ( ret = mbedtls_asn1_get_tag( ... ) ) != 0 )
           mbedtls x509 crt free( crt );
           return( SOME_ERROR );
     if( ( ret = mbedtls_x509_get_sig_alg( ... ) ) != 0 )
           mbedtls_x509_crt_free( crt );
           return( ret );
     return OK;
```

```
int main() {
int x509 crt parse der core
     u8 * buf, size_t len)
                                                                    if (Init(req.buf, req.len) != OK)
     if( ( ret = mbedtls_asn1_get_tag( ... ) ) != 0 )
                                                                         return ERROR:
     {
           mbedtls x509 crt free( crt );
           return( SOME_ERROR );
     }
     if( ( ret = mbedtls_asn1_get_tag( ... ) ) != 0 )
                                                                    if (OpenSession(req.buf, req.len) != OK)
                                                                         return ERROR;
           mbedtls x509 crt free( crt );
           return( SOME_ERROR);
     }
     if( (ret = mbedtls \times 509 get sig alg(...))!= 0)
                                                                    if (Decrypt(req.buf, req.len) != OK)
                                                                         return ERROR;
           mbedtls_x509_crt_free( crt );
           return( ret );
     return OK;
                                                                    return OK;
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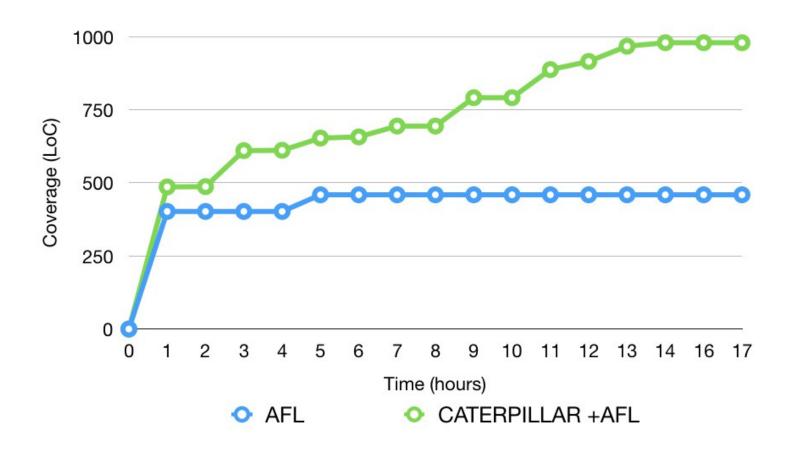
Setup

- 64-bit Ubuntu 16GB Intel Xeon E5-2650 @ 2GHz (16 cores)
- Analysis
 - KLEE alone
 - AFL alone
 - CATERPILLAR + AFL
 - CATERPILLAR and AFL run in parallel

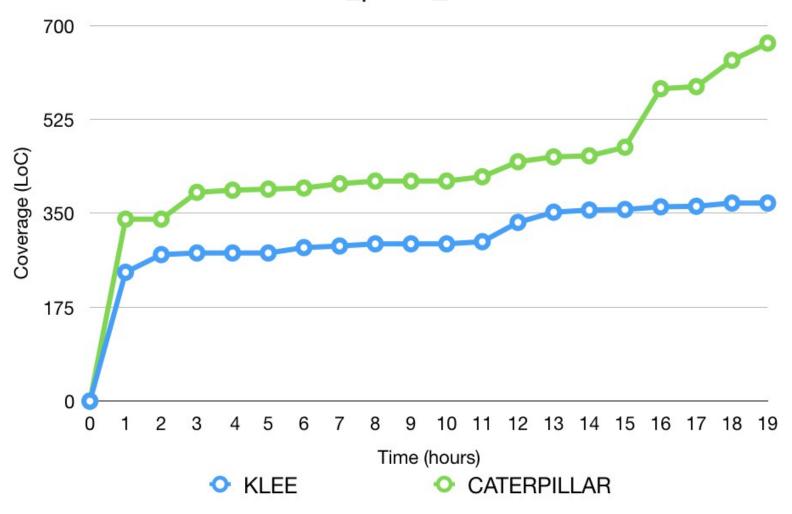
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CATERPILLAR (KLEE) seeds → AFL seeds

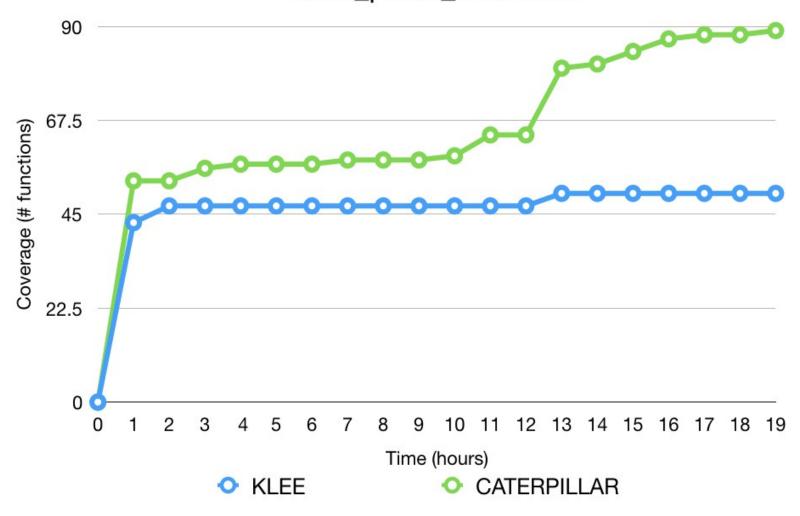
x509_parse_certificate



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x509_parse_certificate



 Automate function selection for switching ICE between symbolic and concrete execution

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Permutation of calls

- Automate function selection for switching ICE between symbolic and concrete execution
- Permutation of calls
- Adaptive selection execution between static and dynamic analysis
 - Block level coordination
 - Function level coordination

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 - Function level coordination

Laurent Simon

Semi-automated testing: a gap?

SAMSUNG

Questions? We offer internships :-)

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