

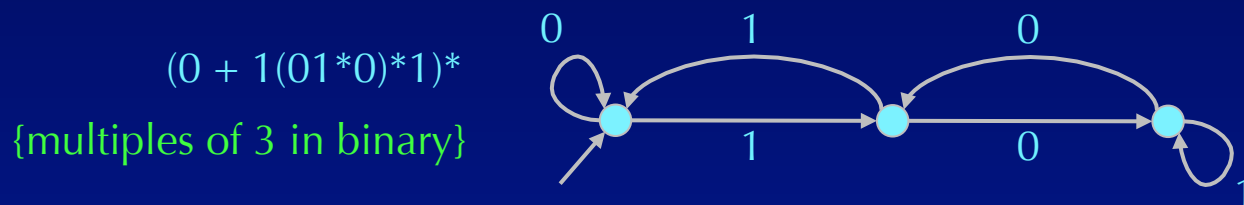
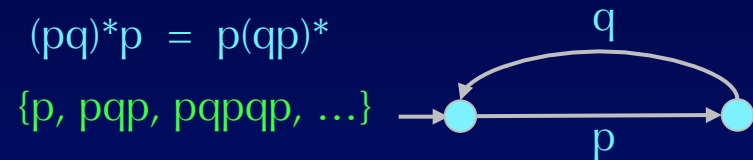
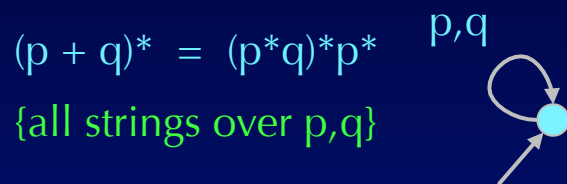
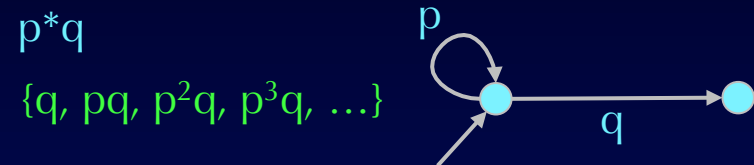
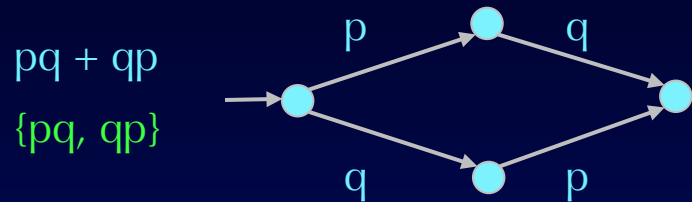
Kleene Algebra with Tests and the Static Analysis of Programs

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Kleene Algebra (KA)

is the algebra of **regular expressions**



Axioms of KA

- K is an **idempotent semiring** under $+$, \cdot , 0 , 1

$$(p + q) + r = p + (q + r)$$

$$p + q = q + p$$

$$p + p = p$$

$$p + 0 = p$$

$$(pq)r = p(qr)$$

$$p1 = 1p = p$$

$$p0 = 0p = 0$$

$$p(q + r) = pq + pr$$

$$(p + q)r = pr + qr$$

- $p^*q = \text{least } x \text{ such that } q + px \leq x$
- $qp^* = \text{least } x \text{ such that } q + xp \leq x$

$$x \leq y \stackrel{\text{def}}{\iff} x + y = y$$

Models

- standard model
 - regular sets of strings over a finite alphabet
- models useful in program semantics
 - binary relations
 - traces (computation paths)
- other more esoteric interpretations
 - min,+ algebra for shortest path problems
 - convex sets used in computational geometry

Completeness and Complexity

- Deductively complete for regular sets of strings and binary relations [K 94]
- Equational theory decidable in PSPACE [Meyer +Stockmeyer 74]
- Hoare theory (Horn theory with premises $p = 0$) decidable in PSPACE [Cohen 93]

Matrices over a KA

$$\begin{pmatrix} a & b \\ c & d \end{pmatrix} + \begin{pmatrix} e & f \\ g & h \end{pmatrix} \stackrel{\text{def}}{=} \begin{pmatrix} a+e & b+f \\ c+g & d+h \end{pmatrix}$$

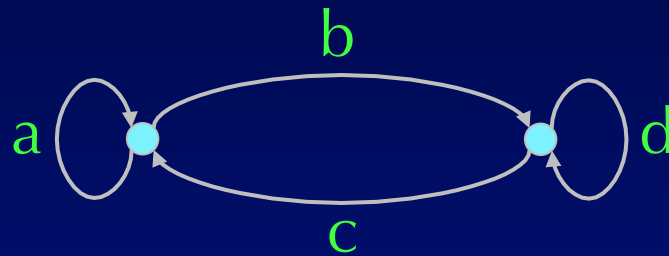
$$\begin{pmatrix} a & b \\ c & d \end{pmatrix} \cdot \begin{pmatrix} e & f \\ g & h \end{pmatrix} \stackrel{\text{def}}{=} \begin{pmatrix} ae+bg & af+bh \\ ce+dg & cf+dh \end{pmatrix}$$

$$0 \stackrel{\text{def}}{=} \begin{pmatrix} 0 & 0 \\ 0 & 0 \end{pmatrix} \quad 1 \stackrel{\text{def}}{=} \begin{pmatrix} 1 & 0 \\ 0 & 1 \end{pmatrix}$$

$$\begin{pmatrix} a & b \\ c & d \end{pmatrix}^* \stackrel{\text{def}}{=} \begin{pmatrix} (a+bd^*c)^* & (a+bd^*c)^*bd^* \\ (d+ca^*b)^*ca^* & (d+ca^*b)^* \end{pmatrix}$$

Matrices over a KA

$$\begin{bmatrix} a & b \\ c & d \end{bmatrix}^* \stackrel{\text{def}}{=} \begin{bmatrix} (a+bd^*c)^* & (a+bd^*c)^*bd^* \\ (d+ca^*b)^*ca^* & (d+ca^*b)^* \end{bmatrix}$$



Matrices over a KA

- Representation of finite automata
- Construction of regular expressions
- Solution of linear equations
- Connectivity and shortest path algorithms

Kleene Algebra with Tests (KAT)

$(K, B, +, \cdot, *, \bar{}, 0, 1)$

- $(K, +, \cdot, *, 0, 1)$ is a Kleene algebra
- $(B, +, \cdot, \bar{}, 0, 1)$ is a Boolean algebra
- $(B, +, \cdot, 0, 1) \subseteq (K, +, \cdot, 0, 1)$

Completeness and Complexity

- Deductively complete for regular sets of guarded strings and relations [K+Smith 96]
- Equational theory decidable in PSPACE [K+S 96, Cohen+K+S 97]
- Hoare theory (Horn theory with premises $p = 0$) decidable in PSPACE [K+S 96]

Modeling Programs

[Fischer + Ladner 74]

if b then p else q \equiv $bp + \bar{b}q$

while b do p \equiv $(bp)^*\bar{b}$

Hoare Logic [C. A. R. Hoare 69]

$\{b\}p\{c\}$ partial correctness assertion

“If b holds in the current state, and if p is executed starting in the current state, then if p halts, c will be true of the halting state.”

KAT subsumes Hoare Logic

$\{b\}p\{c\}$ equivalent to $b p \leq p c$

$$\frac{\{b_1\}p_1\{c_1\}, \{b_2\}p_2\{c_2\}, \dots, \{b_n\}p_n\{c_n\}}{\{b\}p\{c\}}$$

equivalent to the Horn formula

$$b_1 p_1 \leq p_1 c_1 \wedge \dots \wedge b_n p_n \leq p_n c_n \rightarrow b p \leq p c$$

Rules of Hoare Logic

$$\{b[x/e]\} x:=e \{b\}$$

assignment rule

$$\frac{\{b\}p\{c\}, \{c\}q\{d\}}{\{b\}pq\{d\}}$$

composition rule

$$\frac{\{bc\}p\{d\}, \{\bar{b}c\}q\{d\}}{\{c\}\text{if } b \text{ then } p \text{ else } q\{d\}}$$

conditional rule

$$\frac{\{bc\}p\{c\}}{\{c\}\text{while } b \text{ do } p\{\bar{b}c\}}$$

while rule

$$\frac{b' \rightarrow b, \{b\}p\{c\}, c \rightarrow c'}{\{b'\}p\{c'\}}$$

weakening rule

Theorem

All Hoare rules are theorems of KAT

Completeness Theorem [K 99]

All relationally valid rules of the form

$$\frac{\{b_1\}p_1\{c_1\}, \dots, \{b_n\}p_n\{c_n\}}{\{b\}p\{c\}}$$

are derivable in KAT (not so for HL)

Counterexample

$$\frac{\{c\}\text{if } b \text{ then } p \text{ else } p\{c\}}{\{c\}p\{c\}}$$

is trivially unprovable in Hoare Logic, but
easily provable in KAT

Applications of KAT

- Compiler optimization
- Static analysis & verification
- Complexity of substructural logics
- Unique ordered BDDs
 - a special case of Myhill-Nerode theorem for automata on guarded strings

Reasoning under Assumptions

Self-evident premises about the atomic or local behavior of individual instructions and tests



correctness of global code restructuring

$$p_1 = q_1 \wedge p_2 = q_2 \wedge \dots \wedge p_n = q_n \rightarrow p = q$$

Static Analysis

- Derivation of information about the execution state at various points in a program at compile time or load time, prior to execution
- Approaches
 - type inference
 - dataflow analysis
 - abstract interpretation
 - set constraints
- Applications
 - code optimization
 - verification

Software Model Checking with SLAM

Thomas Ball

Testing, Verification and Measurement

Sriram K. Rajamani

Software Productivity Tools

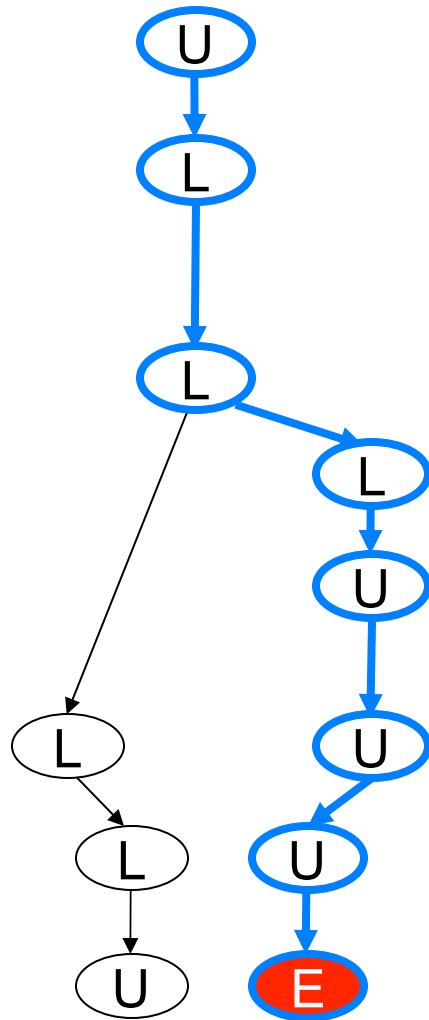
Microsoft Research

<http://research.microsoft.com/slam/>

Example

b : (nPacketsOld == nPackets)

Add new predicate
to boolean program
(c2bp)



do {

KeAcquireSpinLock() ;

nPacketsOld = nPackets; b = true;

if(request) {

request = request->Next;

KeReleaseSpinLock() ;

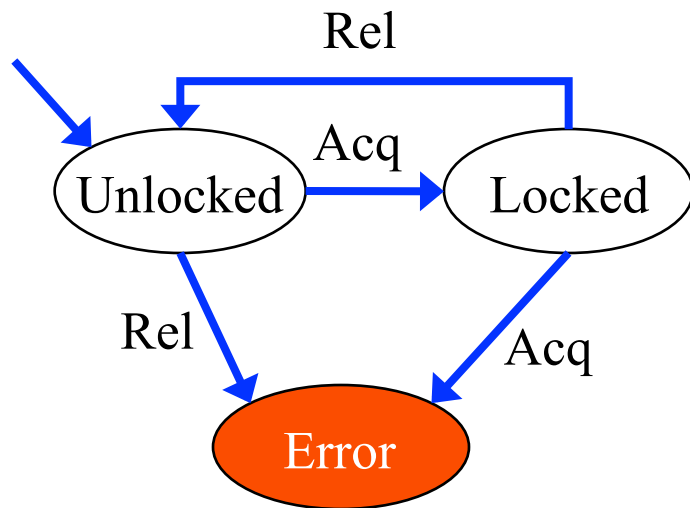
nPackets++; b = b ? false : *;

}

} while (**nPackets != nPacketsOld**); **!b**

KeReleaseSpinLock() ;

State Machine for Locking



Locking Rule in SLIC

```
state {  
    enum {Locked,Unlocked}  
    s = Unlocked;  
}
```

```
KeAcquireSpinLock.entry {  
    if (s==Locked) abort;  
    else s = Locked;  
}
```

```
KeReleaseSpinLock.entry {  
    if (s==Unlocked) abort;  
    else s = Unlocked;  
}
```

```
do {
    KeAcquireSpinLock();
    nPacketsOld = nPackets;
    if (request) {
        request = request->Next;
        KeReleaseSpinLock();
        nPackets++;
    }
} while (nPackets != nPacketsOld);
KeReleaseSpinLock();
```

```
do {  
    kA;  
    n;  
    if (R) {  
        u;  
        kR;  
        m;  
    }  
} while (~B);  
kR;
```



```
do {  
  kA;  
  n;  
  if (R) {  
    u;  
    kR;  
    m;  
  }  
} while (~B);  
kR;
```

```
do p while C  
= p (Cp) * ~C
```

```
if C then p  
= Cp + ~C
```

```

do {
  kA;
  n;
  if (R) {
    u;
    kR;
    m;
  }
} while (~B);
kR;

```

```

do p while C
= p (Cp) * ~C

if C then p
= Cp + ~C

```

$$kA \ n \ (R \cup \ kR \ m \ + \ \sim R)$$

$$(\sim B \ kA \ n \ (R \cup \ kR \ m \ + \ \sim R)) \ * \ B \ kR$$

Preconditions for safe execution

operation

k_A (acquire)

k_R (release)

precondition

$\sim A$ (unlocked)

A (locked)

Global precondition: initially unlocked

Original program

$\sim A \ k_A \ n \ (R \cup \ k_R \ m \ + \ \sim R)$

$(\sim B \ k_A \ n \ (R \cup \ k_R \ m \ + \ \sim R)) \ * \ B \ k_R$

Annotated program

$\sim A \ \sim A \ k_A \ n \ (R \cup \ A \ k_R \ m \ + \ \sim R)$

$(\sim B \ \sim A \ k_A \ n \ (R \cup \ A \ k_R \ m \ + \ \sim R)) \ * \ B \ A \ k_R$

$$kA = kA \bar{A}$$

$$kR = kR \sim A$$

$$Bm = Bm \sim B$$

$$n = nB$$

$$An = nA$$

$$Au = uA$$

$$Am = mA$$

$$Bu = uB$$

$$BkR = kRB$$

- acquiring the lock acquires it
- releasing the lock releases it
- if two integer variables are equal and we increment one, then they are no longer equal
- setting one variable equal to another makes them equal
- commutativity conditions

$$k_A = k_A A$$

$$\rightarrow k_R = k_R \sim A$$

$$\rightarrow B_m = B_m \sim B$$

$$\rightarrow n = n B$$

$$\rightarrow A_n = n A$$

$$\rightarrow A_u = u A$$

$$\rightarrow A_m = m A$$

$$\rightarrow B_u = u B$$

$$\rightarrow B k_R = k_R B$$

$$\rightarrow \sim A k_A n (R u k_R m + \sim R)$$

$$(\sim B k_A n (R u k_R m + \sim R)) * B k_R$$

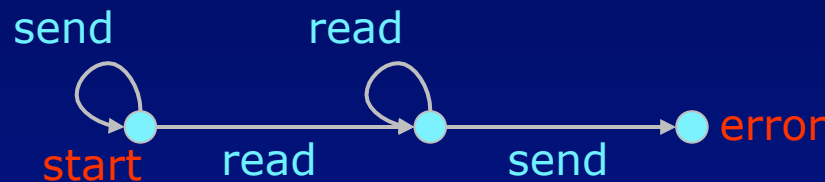
=

$$\sim A \sim A k_A n (R u A k_R m + \sim R)$$

$$(\sim B \sim A k_A n (R u A k_R m + \sim R)) * B A k_R$$

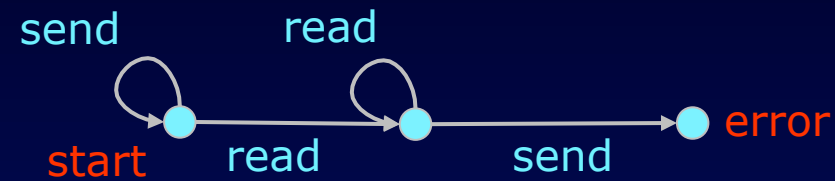
Security Automata [Schneider 98]

- General mechanism for enforcement of security policies at runtime
- Policy is specified by a finite automaton M
- Code is instrumented to call M before all critical operations (ones that could change state of M)
- M aborts the computation if the operation causes a transition to an error state
- Can handle a robust class of policies



Example

no send
after read



- Code is instrumented to call M before each read and send instruction
- Purely a runtime mechanism

Security Automata and KAT

Idea: use KAT to propagate state information statically to eliminate unnecessary calls to M

- Assertion U for each state of M
- Premises $UV = 0$ for $U \neq V$
- Premise $Up \leq pV$ for atomic transition

$$U \xrightarrow{p} V$$

- Premise $Up \leq pU$ if p is noncritical
- Safe states Safe_p for critical p – those not leading to an error state under p

Eliminating Runtime Checks

- $\text{Pre}(r)$ = prefixes of r (defined inductively)
- $\text{Pre}(r)'$ = substitute $\text{Safe}_p; p$ for p in $\text{Pre}(r)$

Soundness Theorem

r is safe with respect to M in any model if

$$\text{KAT} \vdash A \rightarrow S; \text{Pre}(r) = S; \text{Pre}(r)'$$

where

- A are the premises $\bigcup p \leq pV$ and $\bigcup V = 0$
- S is the start state of M

Eliminating Runtime Checks

Weak Completeness Theorem

If KAT cannot prove

$$A \rightarrow S; \text{Pre}(r) = S; \text{Pre}(r)'$$

then r is unsafe in some relational model

More Generally...

Let L be an upper semilattice such that all ascending chains are finite (ACC). Elements are called **types** or **abstract values**.

Associated with each atomic action p is a strict monotone map $f_p : L \rightarrow L$ called its **transfer function**.

Take premises $X_p \leq p \ f_p(X)$ and propagate information as before (ACC needed for *).

$\text{Safe}_p = \text{dom } f_p$.

For details, please see

- D. Kozen. Kleene Algebra with Tests and the Static Analysis of Programs. TR 2003-1915, Computer Science, Cornell, November 2003

Other papers on applications of KAT in static analysis and compiler optimization

- L. Kot and D. Kozen. Second-Order Abstract Interpretation via Kleene Algebra. Technical Report 2004-1971, Computer Science, Cornell, December 2004
- L. Kot and D. Kozen. Kleene Algebra and Bytecode Verification. Proc. Bytecode '05, April 2005, 201-215
- D. Kozen and M.-C. Patron. Certification of compiler optimizations using Kleene algebra with tests. Proc. CL2000, July 2000, 568-582

Thank you!