



# Verifying Array Manipulating Programs

Thanks to Shrawan Kumar

# Array manipulating programs

- Program manipulates/access array elements in a loop
  - Finding minimum
  - Searching for a value
  - Initialising/Copying/reversing
  - ...

```
#define N 100000  
int a[N]
```

```
for(i=0; i< N; i++)  
    if (i != N/2)  
        a[i] = 42
```

```
for (i=0; i< N; i++)  
    if (i != N/2)  
        assert(a[i]==42)
```

# What is the difficulty?

- Bounded model checkers do not scale (either want of memory or time)
- Theorem provers will need loop invariant
  - $\forall i. 0 \leq i < N \wedge i \neq \frac{N}{2} \Rightarrow a[i] = 42$
  - Getting such quantified loop invariant is hard

## A different idea

- Can we analyze the loop for a few elements and extrapolate
- When can we do that?
- If it is possible then program can be transformed accordingly
- A bounded model checker then can be pressed into service

# An example

```
int i, m;  
int a[N] = {2,4,6,8,11,2,2}  
m = a[0]  
i=0  
  
while(i < N)  
    if (m >= a[i]-1)    m = a[i]  
    i++  
  
assert  $\forall j \in [0..N-1] . (m \leq a[j])$ 
```

- Intended to compute minimum
- Property being checked accordingly
- Erroneously min is checked against  $a[i]-1$  instead of  $a[i]$
- It computes the last value in longest subsequence  $a[i_1], a[i_2], \dots$ 
  - Such that  $a[i_1] = \min$  and  $a[i_{k+1}] \leq a[i_k] + 1$
- Here  $\min=2$  and such a sequence is  $[2,2,2]$  with  $m$  being computed as 2
- Therefore property holds
- However changing last element to 3 will make the sequence as  $[2,2,3]$  with  $m$  being 3 and property will fail

# An example

```
int i, m;  
int a[N] = {2,4,6,8,11,2,3}  
m = a[0]  
i=0  
  
while(i < N)  
    if (m >= a[i]-1)    m = a[i]  
    i++  
  
assert  $\forall j \in [0..N-1] . (m \leq a[j])$ 
```

- Intended to compute minimum
- Property being checked accordingly
- Erroneously min is checked against  $a[i]-1$  instead of  $a[i]$
- It computes the last value in longest subsequence  $a[i_1], a[i_2], \dots$ 
  - Such that  $a[i_1] = \min$  and  $a[i_{k+1}] \leq a[i_k] + 1$
- Here  $\min=2$  and such a sequence is  $[2,2,2]$  with  $m$  being computed as 2
- Therefore property holds
- However changing last element to 3 will make the sequence as  $[2,2,3]$  with  $m$  being 3 and property will fail

## ...Example

```
int i, m
int a[N]={2,4,6,8,11,2,2}

m = a[0]  i=0

while(i < N)
    if (m >= a[i]-1)    m = a[i]
    i++

assert   $\forall j \in [0..N-1] . (m \leq a[j])$ 
```

### Some observations

- min+1 should not occur after last min
- Conservative check: no two elements differ by 1
- compute m from any two elements and check it against those two elements
- Rather than array elements we would think in terms of loop iterations
- So m from iterations 2 and 3 (i.e. from elements  $a[1]$  and  $a[2]$ ) would be 4 and  $4 \leq a[1]$  and  $4 \leq a[2]$
- However, after changing last element to 3, the iterations 1 and 7 will make m to be 3 and  $3 \leq a[0]$

# Observation summary

- Only two iterations are needed to establish the property
- Shrinkable loops and Shrink factor
  - Loops for which only  $k$  iterations are needed are called shrinkable loops
  - and  $k$  is the shrink factor for the loop



# Abstraction

```
int i, m, a[N]={2,4,6,8,11,2,2}
unsigned li, it[2]
m = a[0] i=0
it[0]=nondet() it[1]=nondet()
assume(1 <= it[0] && it[0]<it[1])
for (li=0; li < 2 ; li++)
    i = it[li] - 1
    if (!(i < N)) break
    if(m >= a[i]-1) m = a[i]
    i++

assume(li==2)
assert  $\forall t \in it . (m \leq a[t-1])$ 
```

- New *for* loop equivalent to two unrolling of the original loop for two iterations it[0] and it[1]
  - Residual loop
- The new property is checked over array elements corresponding to chosen iterations
  - Residual property

# A Couple of More Examples

```
// property is violated for  $K > 1$ 
// but not for  $K=1$ 
int a[N]
for(i=0; i< N-1; i++)
    if (a[i] > a[i+1])
        swap(a[i], a[i+1])
for (i=0; i< N-1; i++)
    assert(a[i] <= a[i+1])
```

```
// property is violated for  $K=1$ 
// but holds for any  $K > 1$ 
int a[N], min = -1, max = -1, f = 0, i
for (i=0; i< N; i++)
    assume (a[i] > 0)
    if (a[0]!=a[i])
        f = 1
    if (min==-1 || min > a[i])
        min = a[i]
    if (max==-1 || max < a[i])
        max = a[i]

assert (f==0 && max==min ||
        f==1 && max > min)
```

# Program Characteristics

- For technique to be amenable
  - The array processing loop and property checking loop have same number of iterations
    - A loop free property can be seen in a loop of any iterations
- For technique to work
  - The accelerable index expressions of an array in array processing loop are a super set of accelerable index expressions of same array in property checking loop

# Some Notations

- Program state
  - A map  $\sigma : \text{Var} \rightarrow \text{Val}$
- Iteration sequence
  - A sequence of integers ( $> 0$ ) in ascending order representing the iterations to be considered
  - Given a sequence  $T$  of size  $> k$ ,  $P_k(T)$  represents set of subsequences of  $T$  of size  $k$
- Loop acceleration
  - Variables whose value in an iteration  $j$  can be expressed as  $f(j)$ . e.g.  $i=j-1$  in the example program

# Residual Loop and Property

Program : while ( C ) { B }  $\psi$

$T = [j_1, j_2, \dots, j_n]$  is an iteration sequence

Residual loop for T

$\{S_{j_1}, S_{j_2}, \dots, S_{j_n}; \text{loop\_exit:}\}$

Where  $S_{j_r}$  is

$\{A_{j_r}; \text{if ( C ) \{ B \} else goto loop\_exit} \}$

$A_{j_r}$  assignments of accelerable variables

residual property is  
conjunction/disjunction of clauses  
corresponding to each iteration

```
i=3-1
if (i < N)
    if (m >= a[i]-1) m = a[i]
    i++
else goto loop_exit
i=5-1
if (i < N)
    if (m >= a[i]-1) m = a[i]
    i++
else goto loop_exit
assert  $\forall t \in \{3,5\} . (m \leq a[t-1])$ 
loop_exit:
```

# Over Approximation

- Program  $(L, \psi)$  to be over-approximated (abstracted) by  $(L_U, \psi_U)$
- Where  $U$  is a small sub-sequence of iterations chosen non deterministically
- Assume  $\phi$  is set of states before  $L$

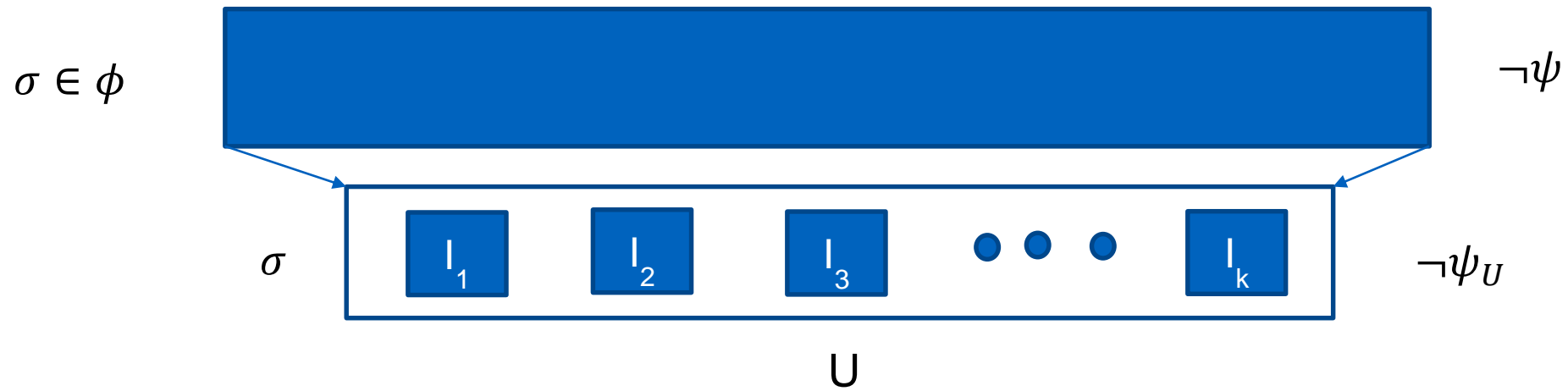
## Shrinkable loops

- Loop  $L$  is  $k$ -shrinkable wrt property  $\psi$ , iff starting from any state  $\sigma \in \phi$ ,  $L$  satisfies  $\psi$  whenever all residuals of  $k$ -sized sequences satisfy their corresponding residual property

$$\forall \sigma \in \phi : ((\forall U \in P_k(T) : \{\sigma\} L_U \{\psi_U\}) \Rightarrow \{\sigma\} L \{\psi\})$$

# Loop k-Shrinkability

Loop L



# Verifying programs with shrinkable loop

- To verify a  $k$  shrinkable loop for  $\psi$ ,
- Verify an abstraction  $(L_U, \psi_U)$  with a  $k$ -sized iteration sequence  $U$  chosen non-deterministically
- Abstraction has loops of size  $k$  CBMC can be used



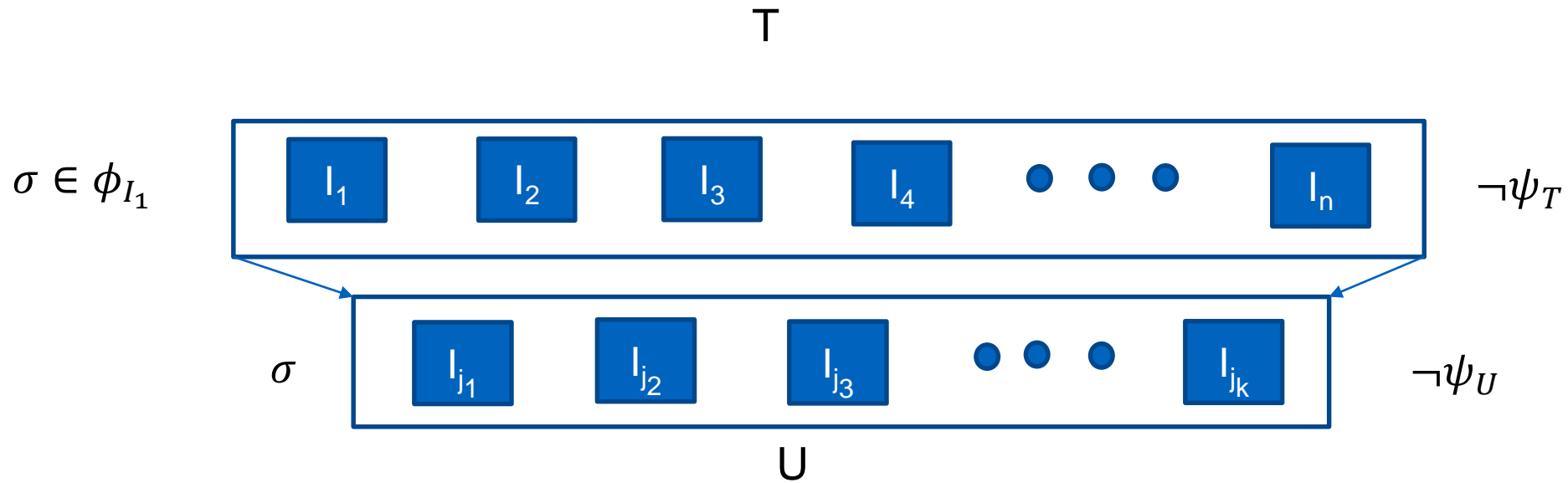
# How to know if a loop is k-shrinkable

- Aim is to decide it by examining only smaller sequences
- Idea of sequence k-shrinkability
- So what is set of states at beginning of a residual loop ?
- We approximate it for iteration i as follows:

$$\phi_1 = \phi, \phi_i = sp(S_{i-1}, \phi_{i-1}) + \phi_{i-1}$$

- The set of states at beginning of iteration i includes set of states at beginning of iteration i-1

# Sequence k-Shrinkability



# Sequence k-shrinkability

- Sequence  $T=j:T'$  is k-shrinkable wrt property  $\psi$ ,  
iff starting from any state  $\sigma \in \phi_j$ ,  $L_T$  satisfies  $\psi_T$   
whenever all residuals of k-sized sub-sequences  
of  $T$  satisfy their corresponding residual property

$$\forall \sigma \in \phi_j: ((\forall U \in P_k(T) : \{\sigma\}L_U\{\psi_U\}) \Rightarrow \{\sigma\}L_T\{\psi_T\})$$

- Every iteration sequence of length 3 is 2-shrinkable for the given example

```
int i, m
int a[N]={2,4,6,8,11,2,2}
m = a[0]  i=0
while(i < N)
  if (m >= a[i]-1)
    m = a[i]
  i++

assert   $\forall j \in [0..N-1]$  .
           (m <= a[j])
```

# Shrinkable sequences to shrinkable loop

- k-shrinkability of complete sequence means loop is k-shrinkable
- Goal
  - k-shrinkability of shorter sequences assures k-shrinkability of larger ones
- sequences of length  $k+1$  are k-shrinkable → larger sequences are k-shrinkable ?
  - Unfortunately no
  - 3-size sequences are 2 shrinkable
  - 4-size sequences are not 3 shrinkable

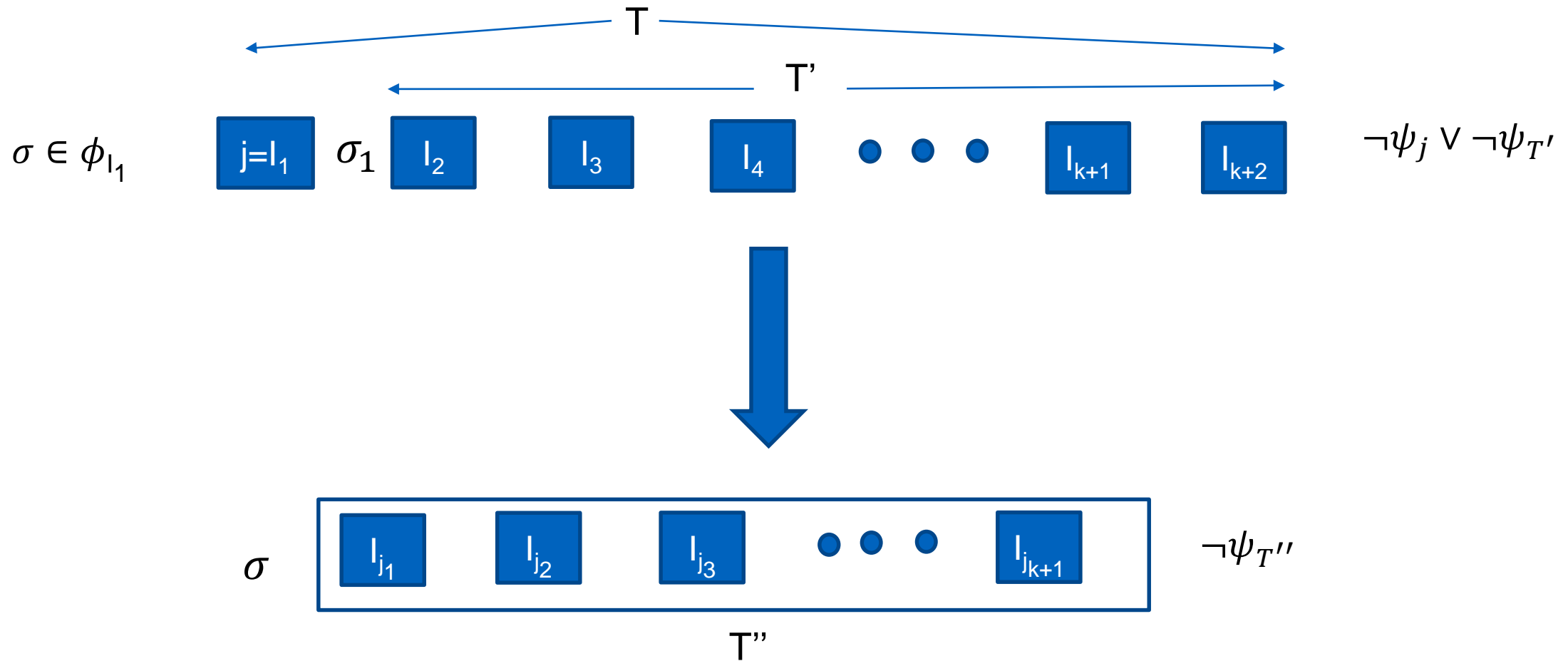
```
int i, m, a[S]
m = a[0] i=0
while(i < S)
    if(m >= a[i]-1) m = a[i]
    i++

assert  $\forall j \in [0..S-1] .$ 
                               (m <= a[j]+2)
```

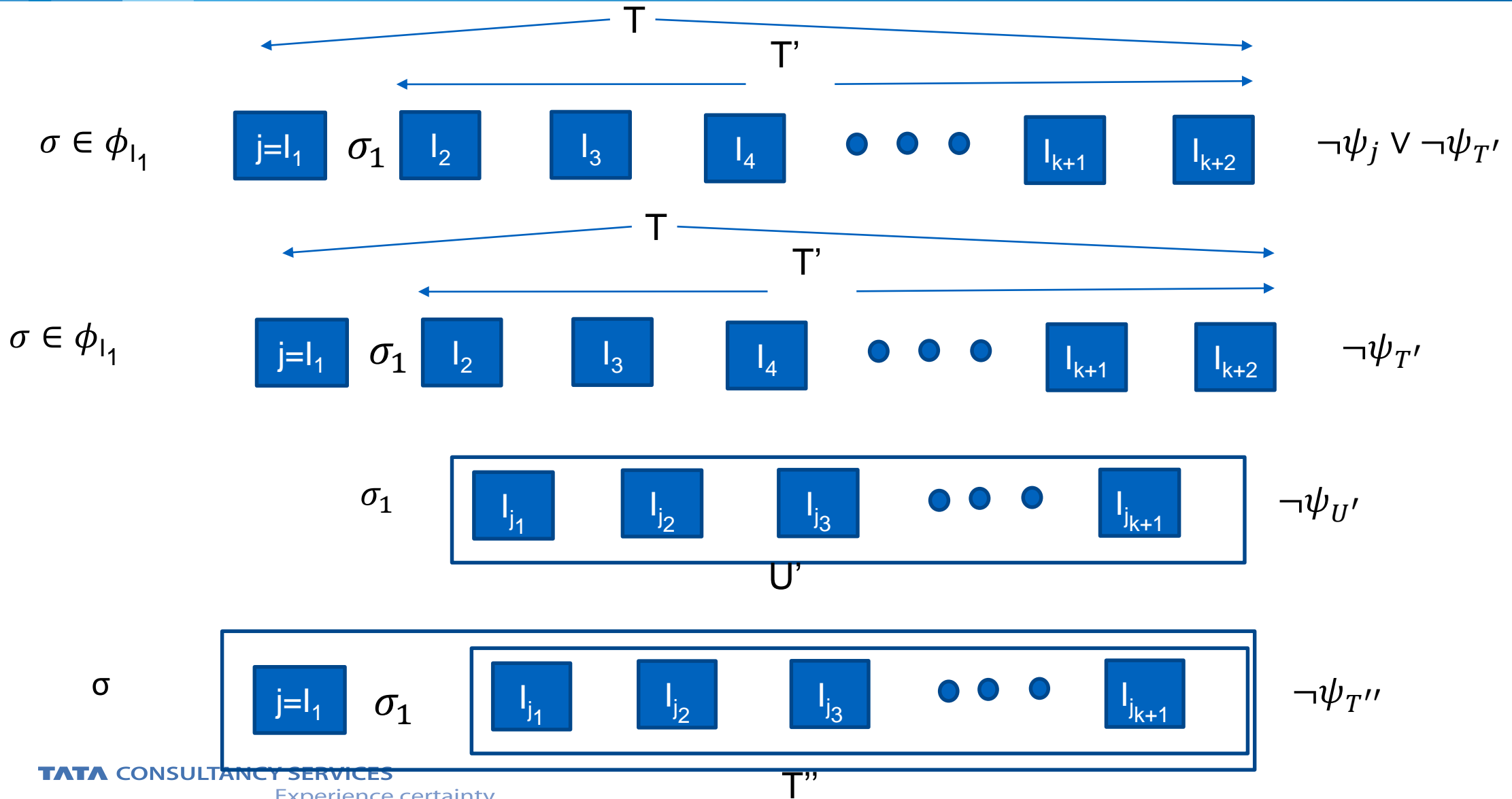
# What is missing?

- Suppose all  $k+1$  sized sequences are  $k$ -shrinkable
- Let  $T = j:T'$  be of size  $k+2$
- For  $T$  to be  $k$ -shrinkable, if  $\{\sigma\} L_T \{\neg\psi_T\}$  then there should be a  $U \in P_k(T)$  such that  $\{\sigma\} L_U \{\neg\psi_U\}$
- It is sufficient if we find  $T''$  of size  $k+1$  such that  $\{\sigma\} L_{T''} \{\neg\psi_{T''}\}$
- Assume we are dealing with conjunctive property

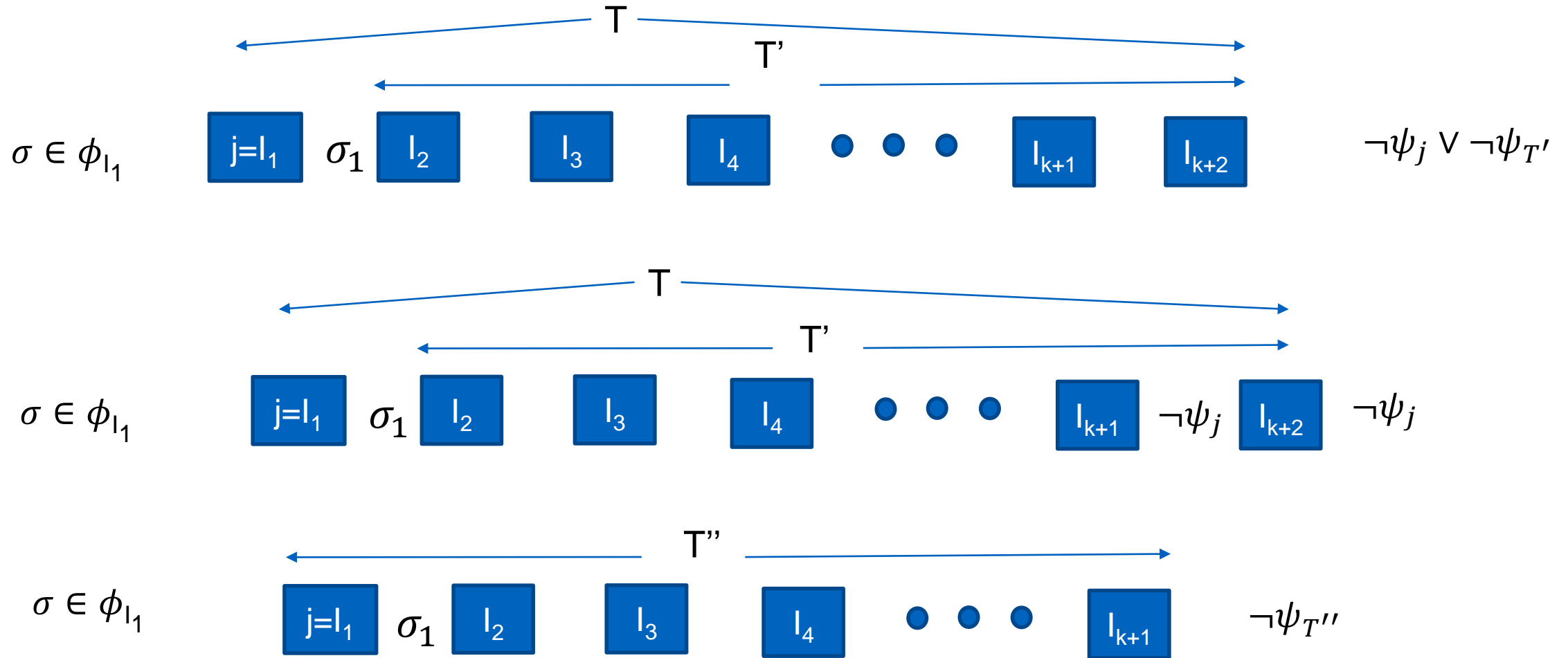
# Sequence k-Shrinkability



# Case (1) : $\psi_{\{T'\}}$ is violated

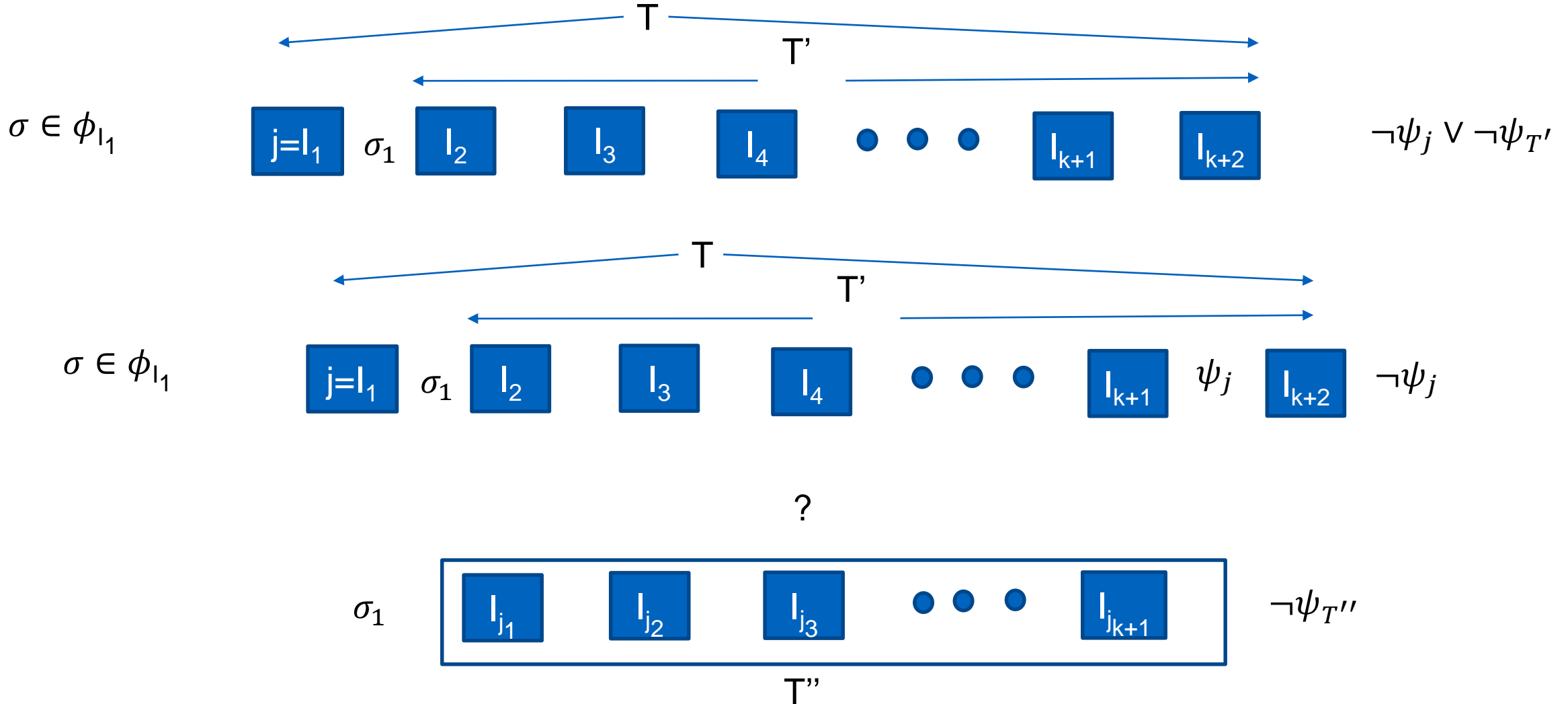


## Case (2): $\psi_j$ violates after last but one

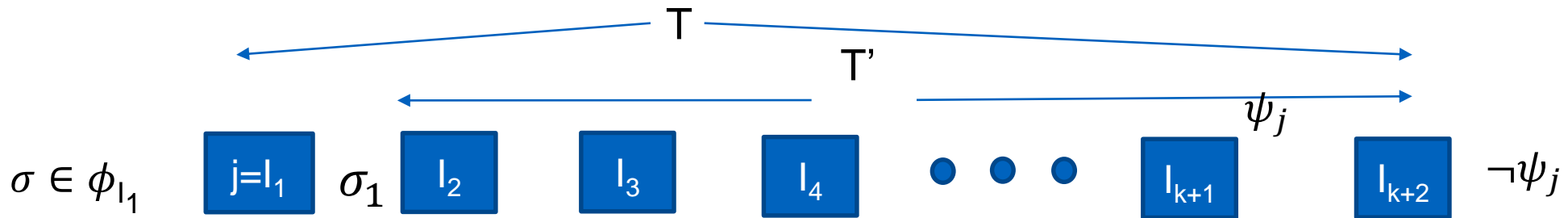
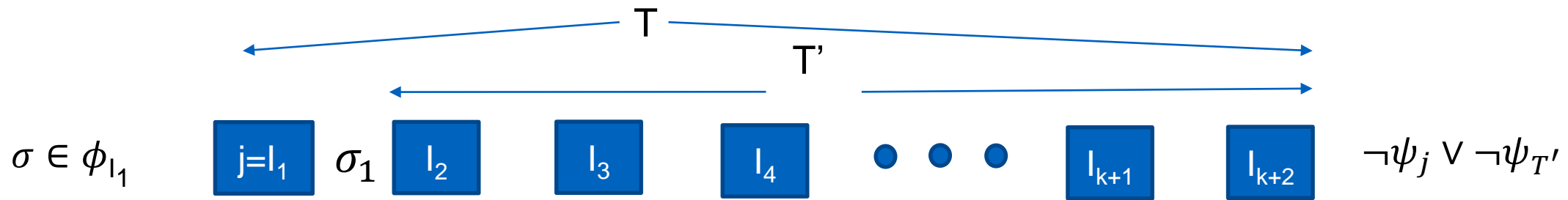




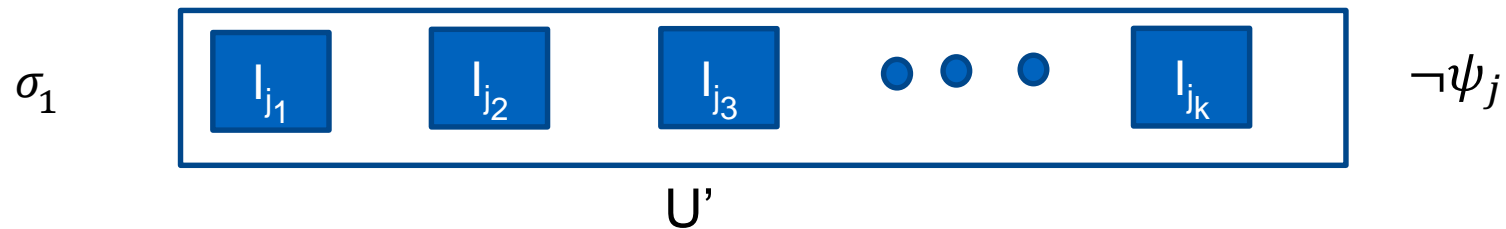
# Case (3) : Only $\psi_j$ violates and only at the end



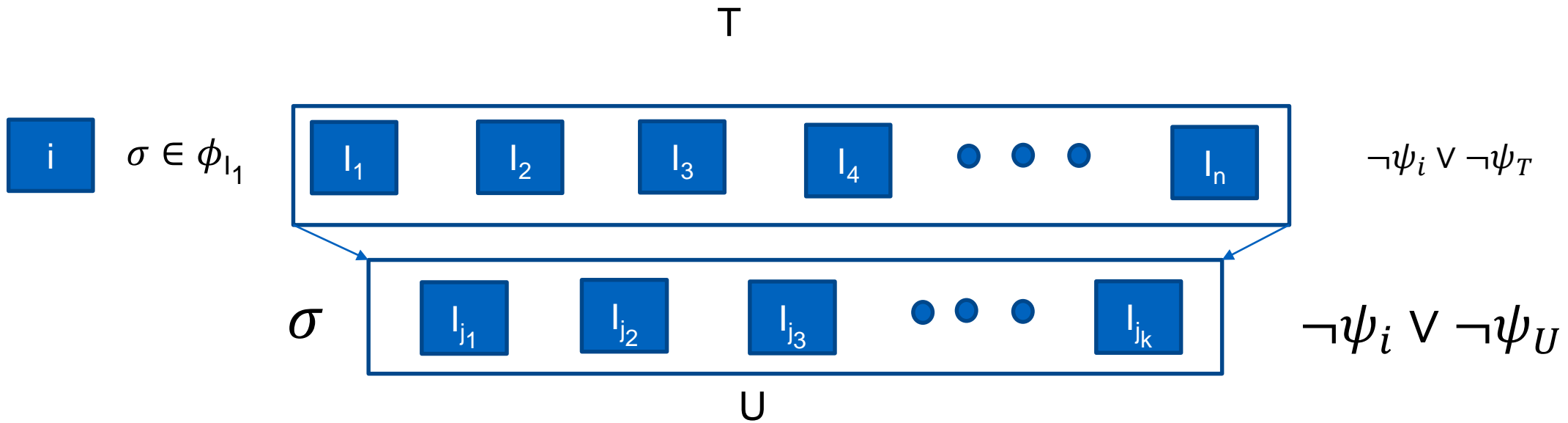
Case (3) : Only  $\psi_j$  violates and only at the end



If



# Refined Sequence k-Shrinkability



# Sequence k-shrinkability (refined)

- $T=j:T'$  is k-shrinkable wrt property  $\psi$ ,  
iff  
    given a past iteration  $i$  ( $0 \leq i < j$ )  
    starting from any state  $\sigma \in \phi_j$ ,  
     $L_T$  satisfies  $\psi_i \wedge \psi_T$   
    whenever all residuals of k-sized sub-sequences of  $T$   
satisfy their corresponding residual property and  $\psi_i$   
 $\forall i, \forall \sigma \in \phi_j : ((\forall U \in P_k(T) : \{\sigma\} L_U \{\psi_U \wedge \psi_i\}))$

```
int i, m, a[S];
m = a[0]; i=0;
while(i < S){
    if(m >= a[i]-1)
        m = a[i];
    i++;
}
assert  $\forall j \in [0..S-1] .$ 
           (m <= a[j]+2);
```

## Important result

If all sequences of  $k+1$  are  $k$ -shrinkable then the loop is  $k$ -shrinkable

# Proof

- Show a stronger condition that all sequences longer than  $k+1$  are  $k$ -shrinkable and hence loop will be  $k$ -shrinkable
- Let  $T=j:T'$  be a sequence of size  $n$  ( $>k+1$ ) and assume all sequences of size up to  $n-1$  are  $k$ -shrinkable

Suppose  $\exists i . 0 \leq i < j, \exists \sigma \in \phi_j : \{\sigma\} L_T \{\neg\psi_i \vee \neg\psi_T\}$

show that  $\exists U \in P_k(T) : \{\sigma\} L_U \{\neg\psi_i \vee \neg\psi_U\}$

Let  $\{\sigma\} L_j \{\sigma_1\}$

$\{\sigma_1\} L_{T'} \{\neg\psi_i \vee \neg\psi_j \vee \neg\psi_{T'}\}$

$\{\sigma_1\} L_{T'} \{\neg\psi_i \vee \neg\psi_{T'}\}$  OR  $\{\sigma_1\} L_{T'} \{\neg\psi_j \vee \neg\psi_{T'}\}$

Here  $i$  and  $j$  both are past iterations for  $T'$ . So

$\exists U' \in P_k(T') : \{\sigma_1\} L_{U'} \{\neg\psi_i \vee \neg\psi_{U'}\}$  OR  $\{\sigma_1\} L_{U'} \{\neg\psi_j \vee \neg\psi_{U'}\}$

$\{\sigma\} L_j ; L_{U'} \{\neg\psi_i \vee \neg\psi_j \vee \neg\psi_{U'}\}$

Let  $T'' = j:U'$ . Obviously  $T''$  is of size  $k+1$  and therefore shrinkable

$\exists U \in P_k(T'') : \{\sigma\} L_U \{\neg\psi_i \vee \neg\psi_U\}$

But  $T'' \subset T$  and therefore  $U \in P_k(T)$

# Finding k-shrinkability

```
check_loop(k)
{
  choose an arbitrary
  iteration-sequence
  T of size k+1
  check_iter_seq(T);
}
```

Check property for check\_loop for k=1,2,.. till property is satisfied

```
check_iter_seq(T)
{
  j = head(T); i = nondet();
  assume(0 <= i < j);
  X_initial= nondet(); c = true;
  for each k sized U ⊂ T {
    X = X_initial; LU; c = ψi ∧ ψU ;
    if (!c) break;
  }
  X = X_initial ; LT; r = ψi ∧ ψT ;
  assert(c → r);
}
```

$$\forall i, \forall \sigma \in \phi_j : ((\forall U \in P_k(T) : \{\sigma\} L_U \{\psi_U \wedge \psi_i\}) \implies \{\sigma\} L_T \{\psi_T \wedge \psi_i\})$$

## Example of residual loop

```
int a[p];
int i=0,t=0;
while(i < n)
{
    a[t] = i;
    i+=2; t++;
}
```

```
int a[p], T[k], l, i=0, t=0;
init(T) ; //  $\forall l \in 1..k - 1 : 1 \leq T[l - 1] < T[l]$ 
for (l=0;l<k;l++) {
    j = T[l]; i = (j-1)*2;
    t = j-1;
    if (!(i < n)) break;
    assume(0<=t<p),
    a[t] = i;
    i+=2; t++;
}
assume(l==k);
```



# Handling Multiple loops

- It can handle computation consisting of a cascaded series of multiple loops
- If such cascaded loops can be coalesced into one equivalent loop

```
for (i=0; i< N; i++)  
    sum1 = sum1+a[i];  
for(i=0; i< N; i++)  
    sum2 = sum2+a[i];  
assert (sum1==sum2);
```

```
for (i=0; i< N; i++)  
{  
    sum1 = sum1 + a[i];  
    sum2 = sum2 + a[i];  
}  
assert(sum1==sum2)
```

# Results on SVCOMP 2018

| Programs                  | True | False | Total |
|---------------------------|------|-------|-------|
| Total                     | 123  | 44    | 167   |
| Correct result by VeriAbs | 109  | 33    | 142   |
| Could not decide          | 14   | 11    | 25    |

VeriAbs came FIRST in Arrays sub-category