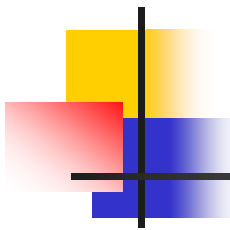


Approximate Search of Regular Expressions Using Bit-Parallel Algorithms

Kristo Tammeloja

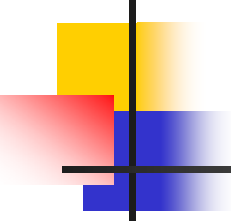
Jaak Vilo

Teooriapäevad Rõuges, 2007



Contents

- Regular expression (RE) syntax
- Glushkov's automaton
- Existing bit-parallel algorithms
 - Exact matching
 - Approximate matching
- New feature added
 - Error-free regions



Regular expression

- Syntax

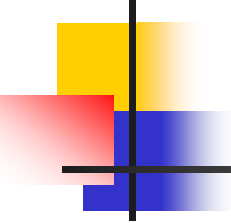
- (,)

- |

- Quantifier

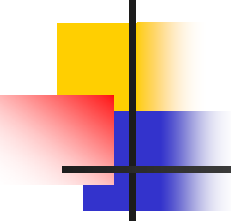
- *, +, ?, {m,n}, {m,}

- Character classes (example [a-z])



Regular expression

- Syntax
 - (,)
 - |
 - Quantifier
 - *, +, ?, {m,n}, {m,}
 - Character classes (example [a-z])
- Matching as used in presentation
 - Regular expression A^*
 - AAAAA match
 - BAAAC no match



Regular expression

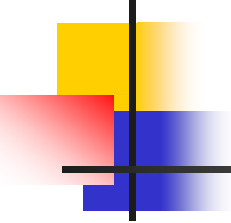
1 error allowed

$R(E | G)(EX)^*$

$1:R(E | G)(EX)^*$

$1:R<E | G>(EX)^*$

$1:R(E | G)<EX>^*$



Regular expression

1 error allowed

$R(E|G)(EX)^*$

$1:R(E|G)(EX)^*$

$1:R<E|G>(EX)^*$

R E

R G

R E E X

R G E X

R E E X E X

$1:R(E|G)<EX>^*$

Regular expression

1 error allowed

$R(E|G)(EX)^*$

$1:R(E|G)(EX)^*$

$1:R<E|G>(EX)^*$

$RE \longrightarrow R$ **R** } subst.

$RG \longrightarrow R$ ^{G} } del.

$RE\underline{EX} \longrightarrow RE ^{E} X } del.$

$1:R(E|G)<EX>^*$

$RG\underline{EX} \longrightarrow R$ **E** G EX

$RE\underline{EX}\underline{EX} \longrightarrow RE **E** EX EX } ins.$

$RE\underline{E} **$R$** X $EX$$

Regular expression

1 error allowed

$R(E|G)(EX)^*$

$1:R(E|G)(EX)^*$

$1:R<E|G>(EX)^*$

$RE \longrightarrow R \text{ R } \quad \text{subst.}$

no match

$RG \longrightarrow R \text{ ^ } \quad \text{del.}$

no match

$RE \underline{EX} \longrightarrow R \text{ ^ } \quad \text{del.}$

match

$1:R(E|G)<EX>^*$

$RG \underline{EX} \longrightarrow R \text{ E } \underline{EX}$

$RE \underline{EX} \underline{EX} \longrightarrow R \text{ E } \underline{EX} \underline{EX} \quad \text{ins.}$

$R \text{ E } \underline{EX} \underline{EX} \longrightarrow R \text{ E } \underline{EX} \underline{EX}$

Regular expression

1 error allowed

$R(E|G)(EX)^*$

$1:R(E|G)(EX)^*$

$1:R<E|G>(EX)^*$

$RE \longrightarrow R \text{ R } \quad \left. \begin{array}{l} \text{subst.} \end{array} \right\}$

no match

$RG \longrightarrow R \text{ ^ } \quad \left. \begin{array}{l} \text{del.} \end{array} \right\}$

no match

$RE \underline{EX} \longrightarrow R \text{ ^ } \text{ E } \underline{EX}$

match

$1:R(E|G)<EX>^*$

$RG \underline{EX} \longrightarrow R \text{ E } G \underline{EX}$

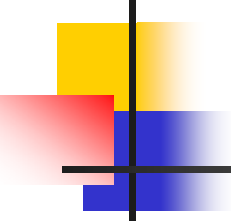
match

$RE \underline{EX} \underline{EX} \longrightarrow R \text{ E } \underline{EX} \underline{EX} \quad \left. \begin{array}{l} \text{ins.} \end{array} \right\}$

match

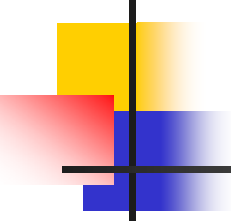
$RE \underline{E} \text{ R } \underline{X} \underline{EX}$

no match



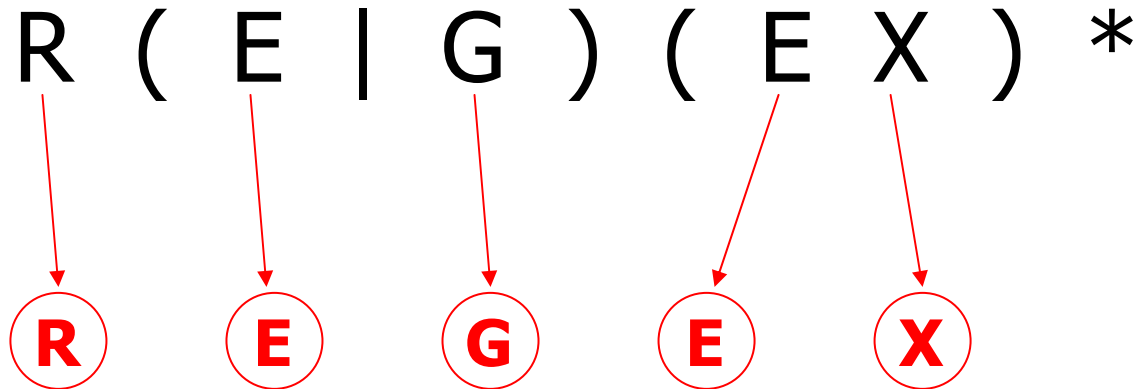
Glushkov's automaton

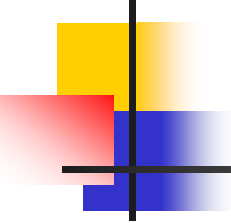
$R (E \mid G) (E X) ^ *$



Glushkov's automaton

- Character in RE = **state** in automaton





Glushkov's automaton

- Character in RE = **state** in automaton
+ one state for the beginning of the RE

R (E | G) (E X) *



Glushkov's automaton

- Character in RE = **state** in automaton
+ one state for the beginning of the RE
- **Transitions** show which characters/positions
can precede each other

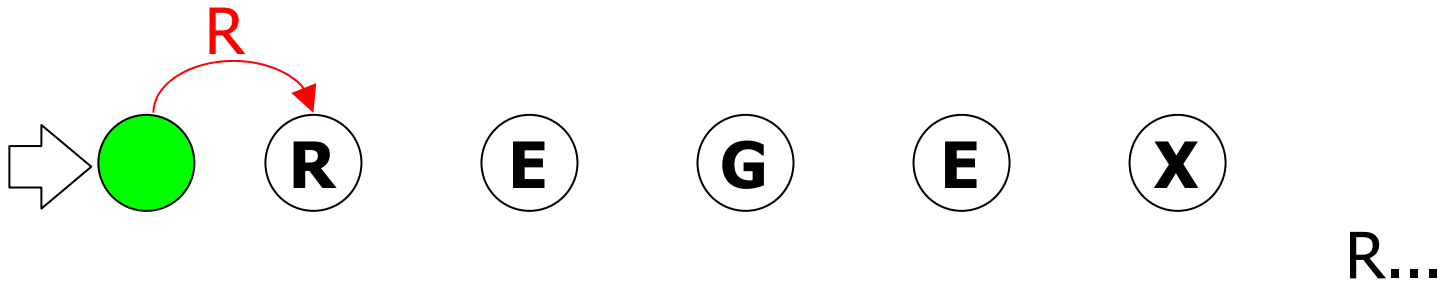
R (E | G) (E X) *



Glushkov's automaton

- Character in RE = **state** in automaton
+ one state for the beginning of the RE
- **Transitions** show which characters/positions can precede each other

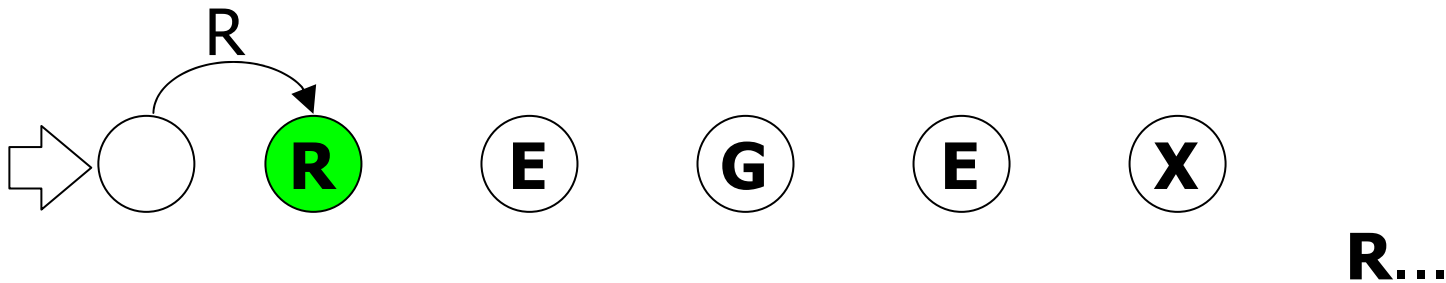
R (E | G) (E X) *



Glushkov's automaton

- Character in RE = **state** in automaton
+ one state for the beginning of the RE
- **Transitions** show which characters/positions can precede each other

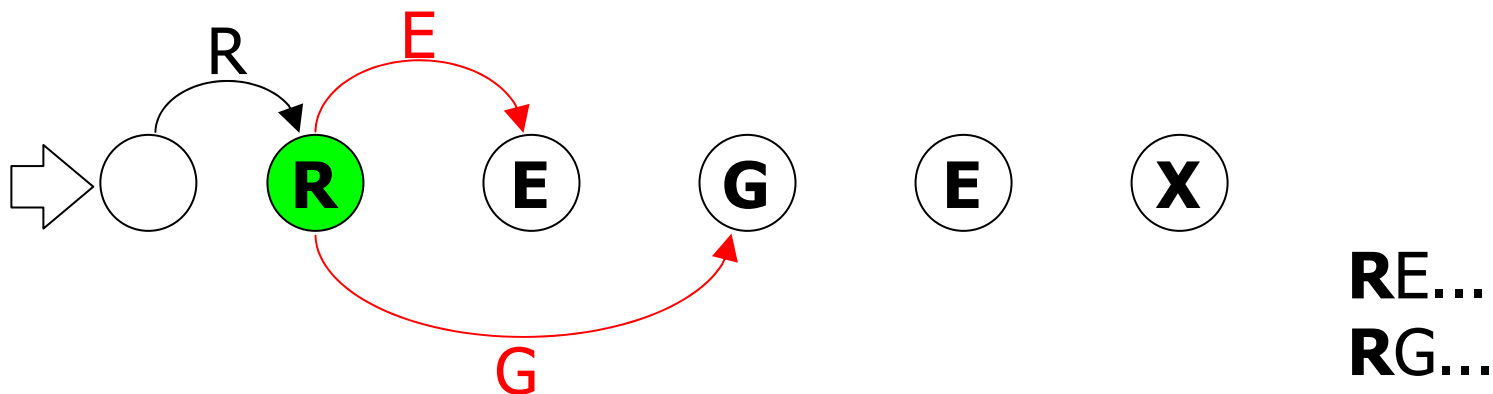
R (E | G) (E X) *



Glushkov's automaton

- Character in RE = **state** in automaton
+ one state for the beginning of the RE
- **Transitions** show which characters/positions
can precede each other

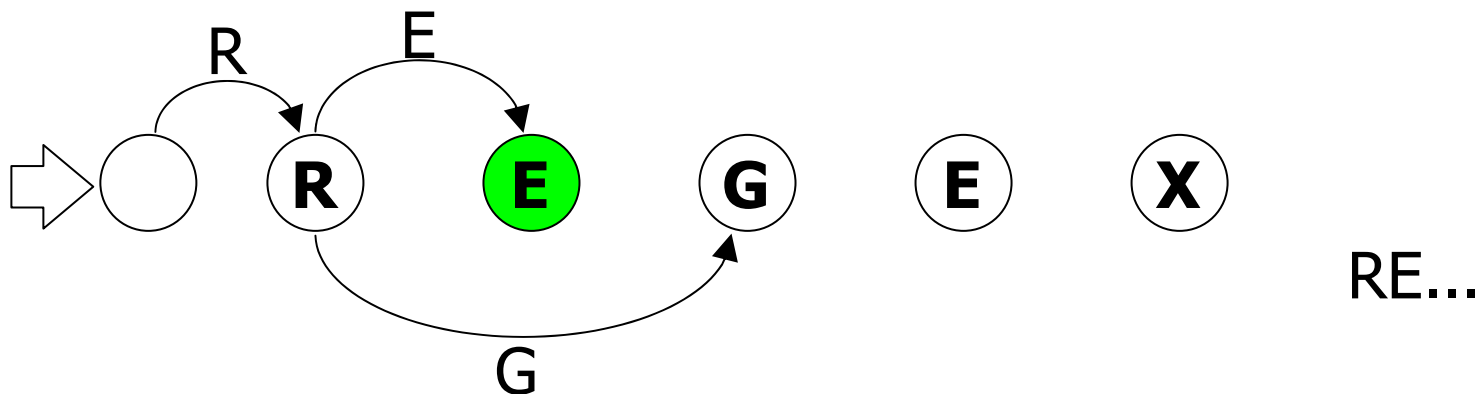
$R (E \mid G) (E X) ^ *$



Glushkov's automaton

- Character in RE = **state** in automaton
+ one state for the beginning of the RE
- **Transitions** show which characters/positions can precede each other

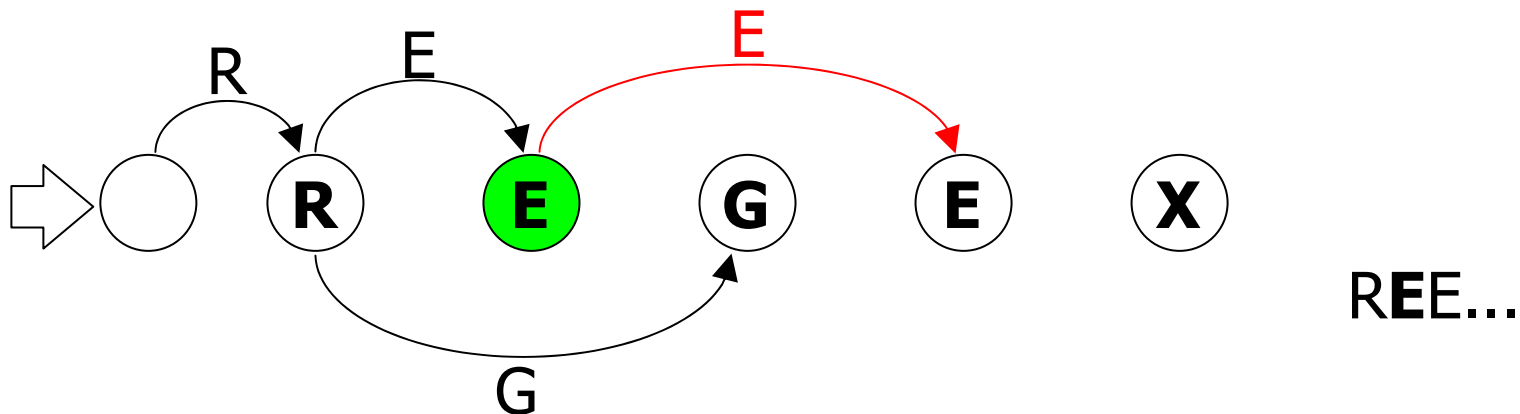
$R (E \mid G) (E X) ^ *$



Glushkov's automaton

- Character in RE = **state** in automaton
+ one state for the beginning of the RE
- **Transitions** show which characters/positions
can precede each other

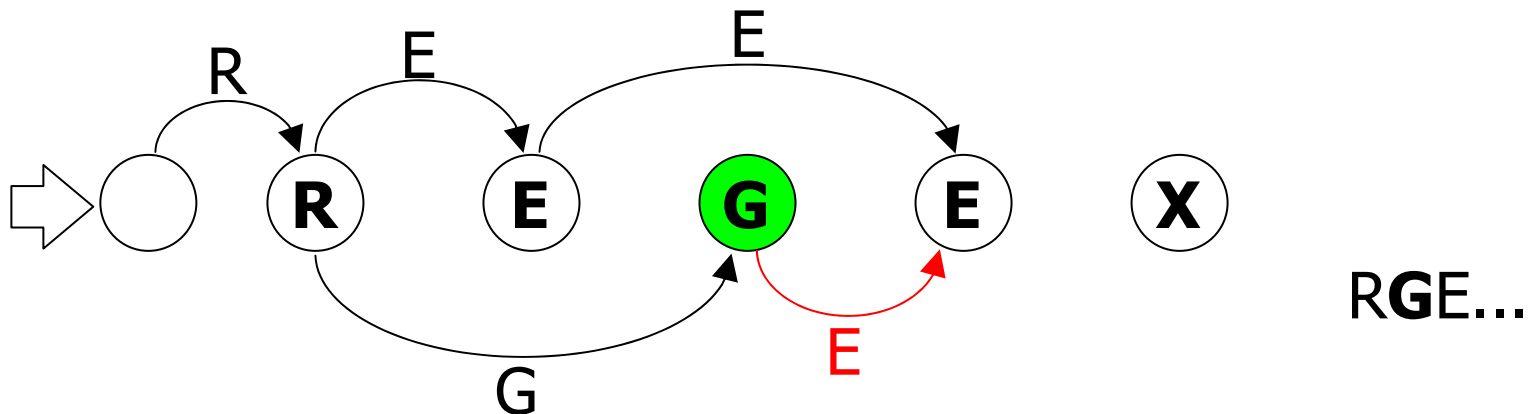
R (E | G) (E X) *



Glushkov's automaton

- Character in RE = **state** in automaton
+ one state for the beginning of the RE
- **Transitions** show which characters/positions
can precede each other

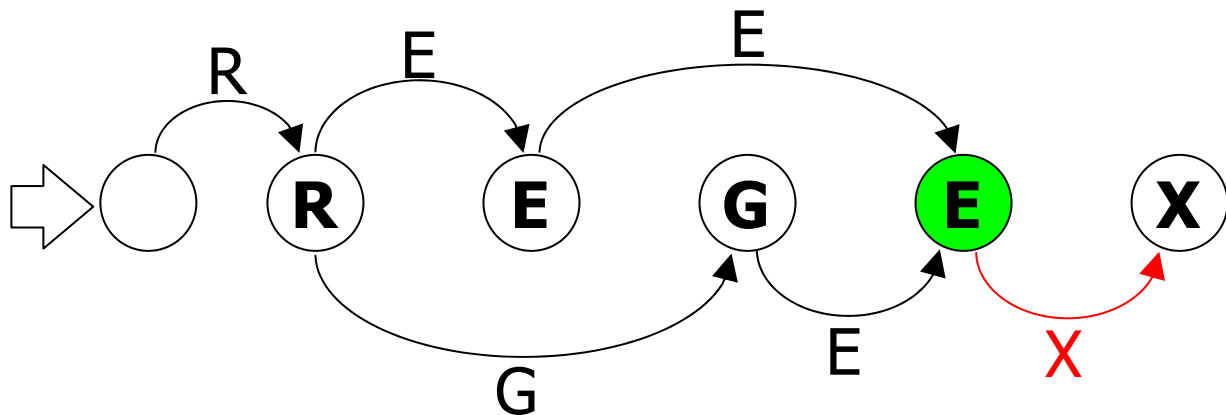
R (E | G) (E X) *



Glushkov's automaton

- Character in RE = **state** in automaton
+ one state for the beginning of the RE
- **Transitions** show which characters/positions
can precede each other

R (E | G) (E X) *

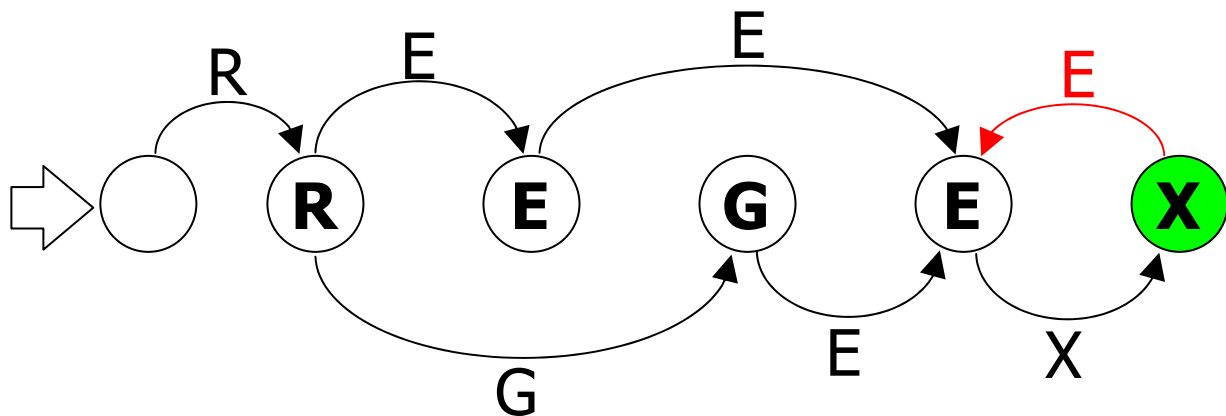


RGEX...

Glushkov's automaton

- Character in RE = **state** in automaton
+ one state for the beginning of the RE
- **Transitions** show which characters/positions
can precede each other

R (E | G) (E X) *

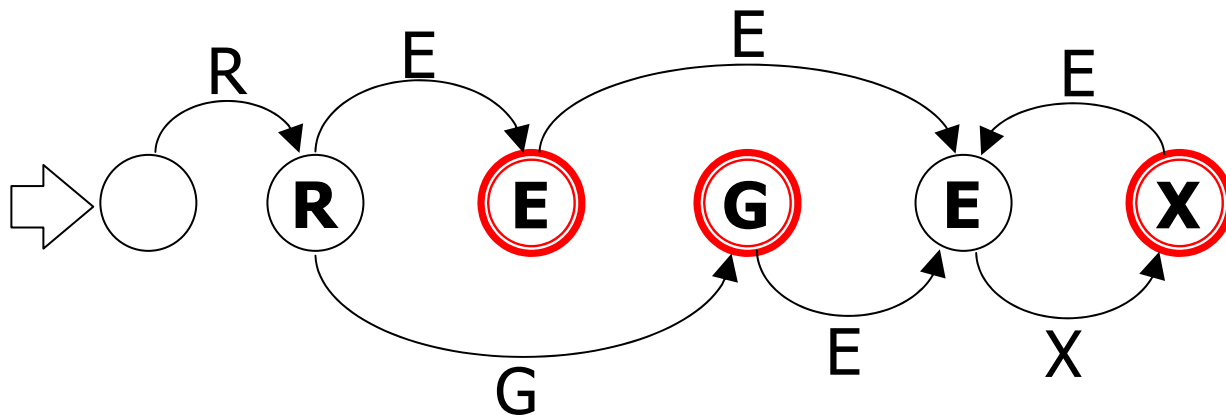


RGEXE...

Glushkov's automaton

- Character in RE = **state** in automaton
+ one state for the beginning of the RE
- **Transitions** show which characters/positions
can precede each other

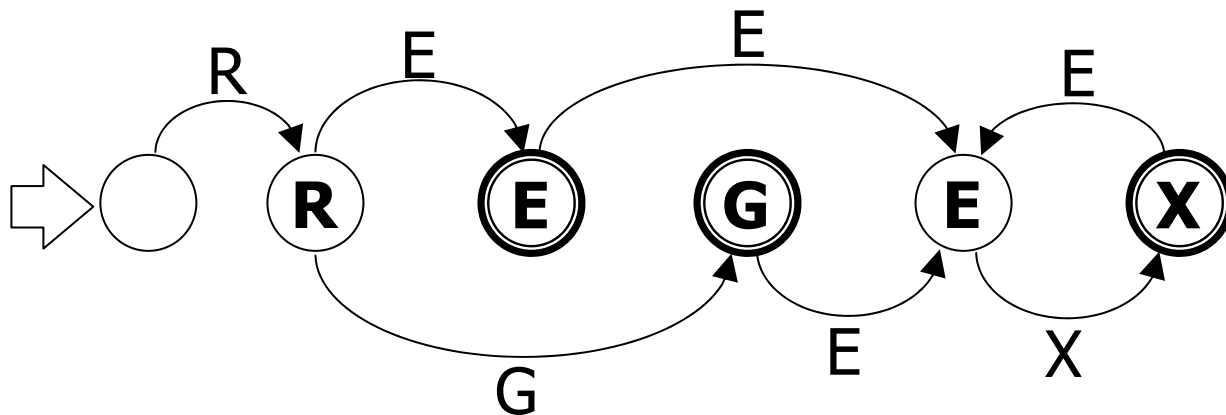
R (E | G) (E X) *



Glushkov's automaton

- All labels entering a node are labeled by the same character

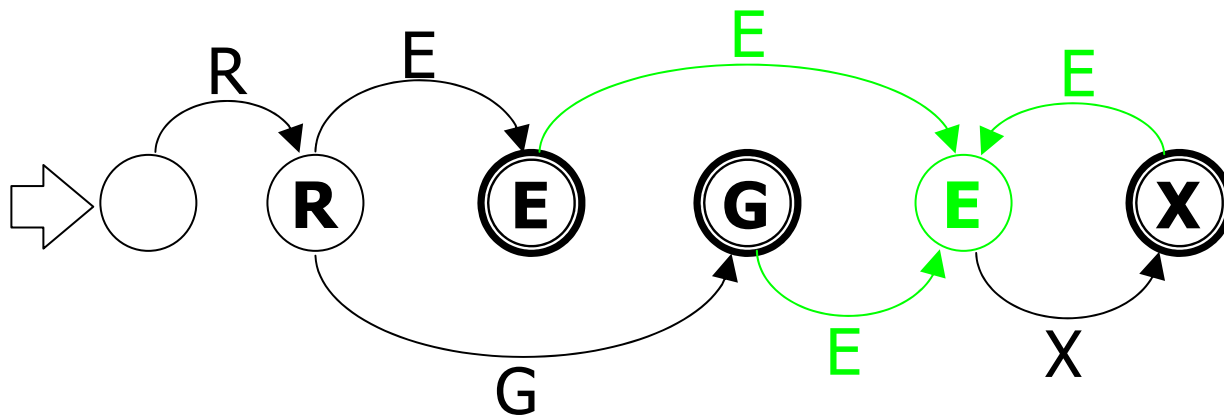
R (E | G) (E X) *



Glushkov's automaton

- All labels entering a node are labeled by the same character

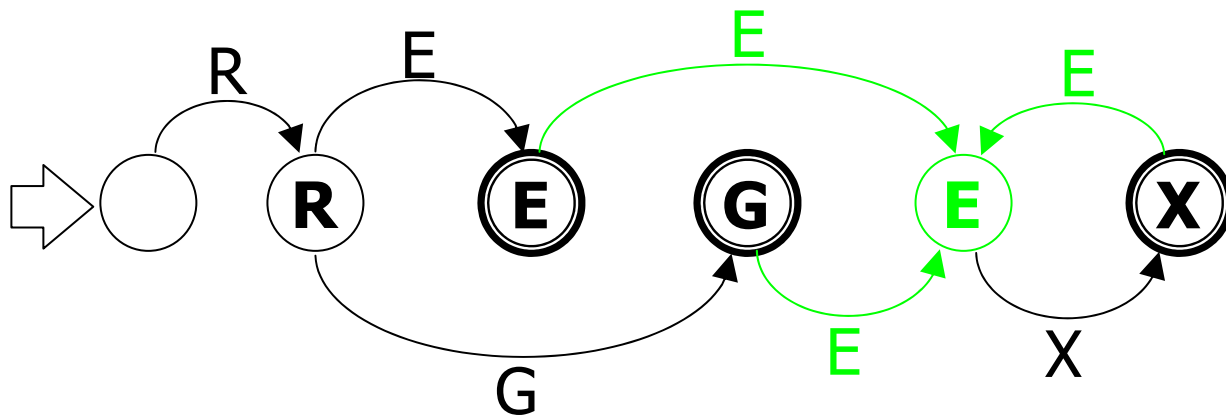
$R (E \mid G) (E X) ^ *$

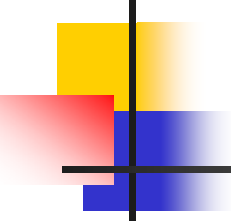


Glushkov's automaton

- All labels entering a node are labeled by the same character

for example **after reading character 'E'**
only states with label 'E' can be active



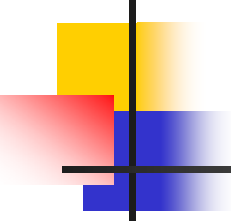


Exact search

- Simulation of NFA = changing active states based on the character read from the text
- We use bit-vectors (one bit for each state) to hold active states

$\delta(D, a)$

- D – bit-vector of active states
 - a – character read
 - Returns new bit-vector
- $2^{|D|} \cdot |\Sigma|$ different sets of parameters
 - $|D|$ – number of states in automaton
 - $|\Sigma|$ - alphabet's size

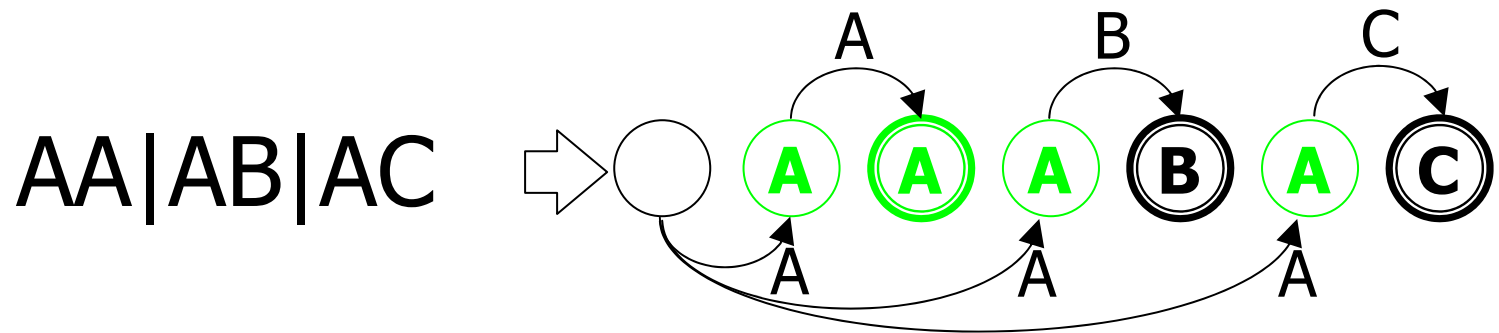


Exact search

- “After reading character ‘E’ only states with label ‘E’ can be active” so ...
- $\delta(D, a) = T[D] \& B[a]$
 - $T[\mathbf{D}]$ – states that can be reached **from states in D** by any character
 - $B[\mathbf{a}]$ – states that can be reached **by character a**

Exact search

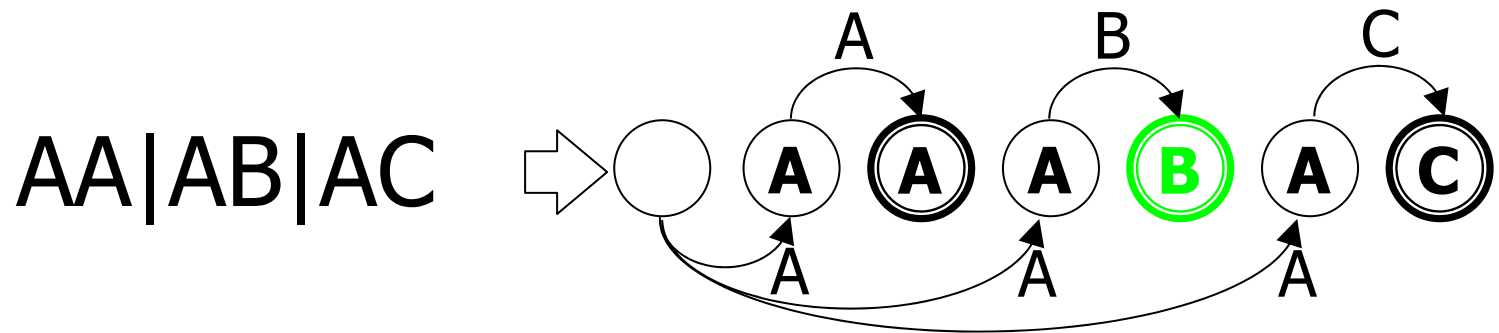
- $\delta(D, a) = T[D] \& B[a]$



a	B[a]	D	T[D]
'A'	0111010	1000000	
'B'		0100000	
'C'		...	
		0101010	
		...	

Exact search

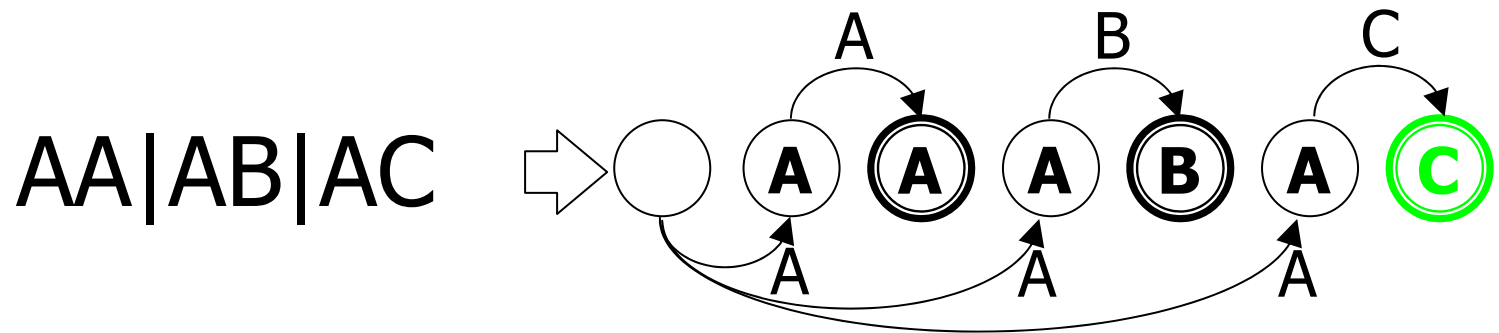
- $\delta(D, a) = T[D] \& B[a]$



a	B[a]	D	T[D]
'A'	0111010	1000000	
'B'	0000100	0100000	
'C'		...	
		0101010	
		...	

Exact search

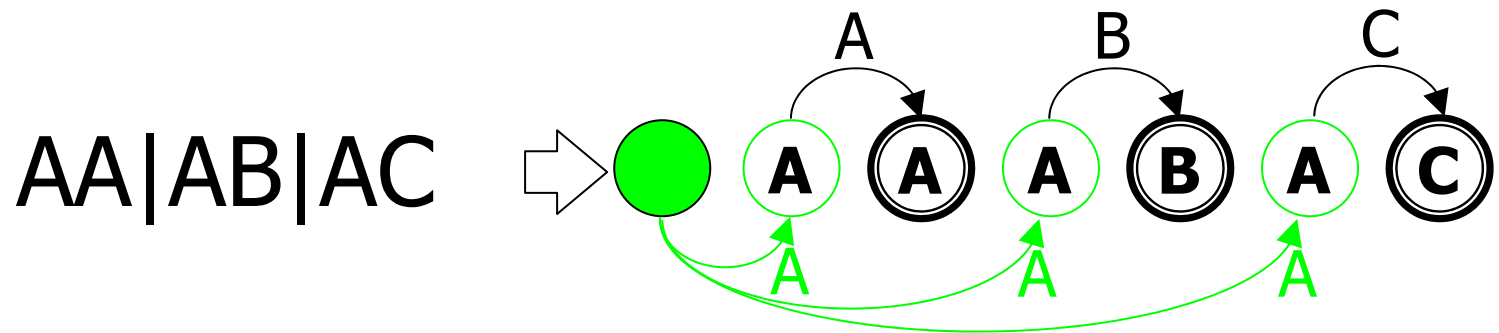
- $\delta(D, a) = T[D] \& B[a]$



a	B[a]	D	T[D]
'A'	0111010	1000000	
'B'	0000100	0100000	
'C'	0000001	...	
		0101010	
		...	

Exact search

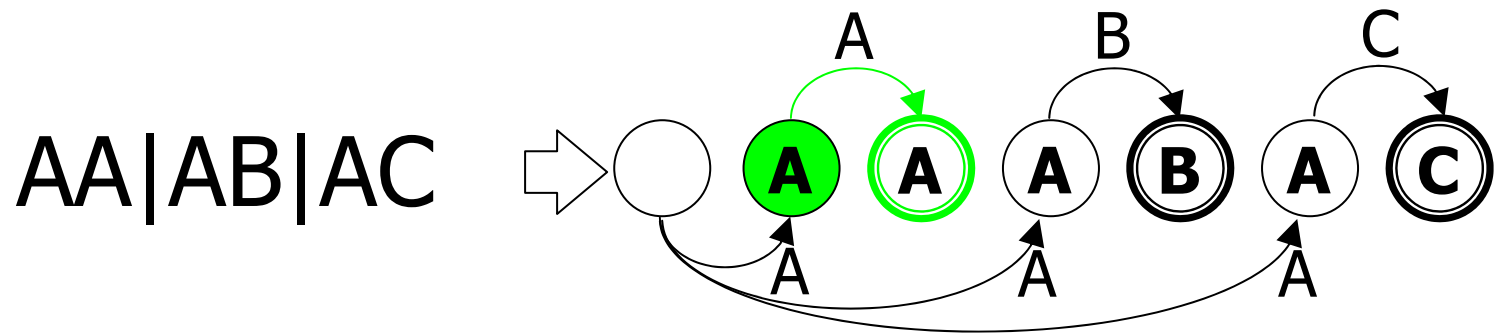
- $\delta(D, a) = T[D] \& B[a]$



a	B[a]	D	T[D]
'A'	0111010	1000000	0101010
'B'	0000100	0100000	
'C'	0000001	...	
		0101010	
		...	

Exact search

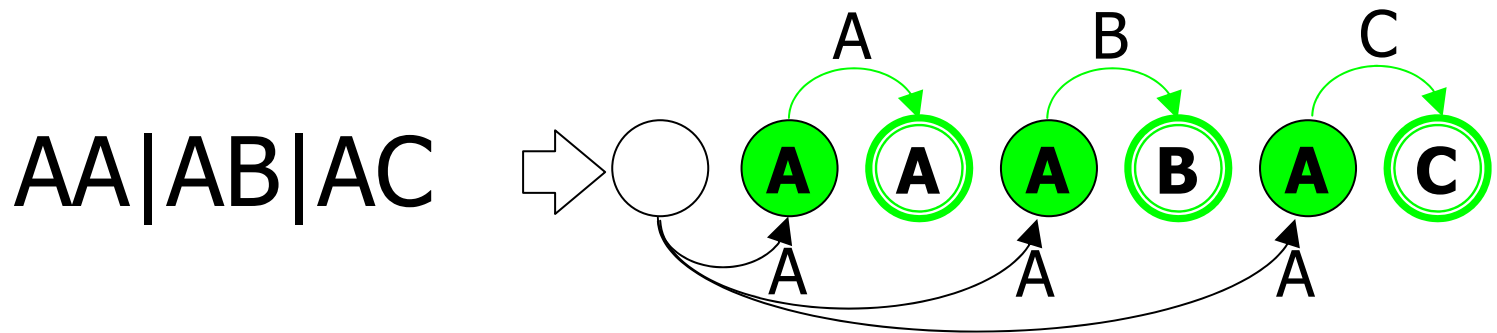
- $\delta(D, a) = T[D] \& B[a]$



a	B[a]	D	T[D]
'A'	0111010	1000000	0101010
'B'	0000100	0100000	0010000
'C'	0000001	...	...
		0101010	...
		...	...

Exact search

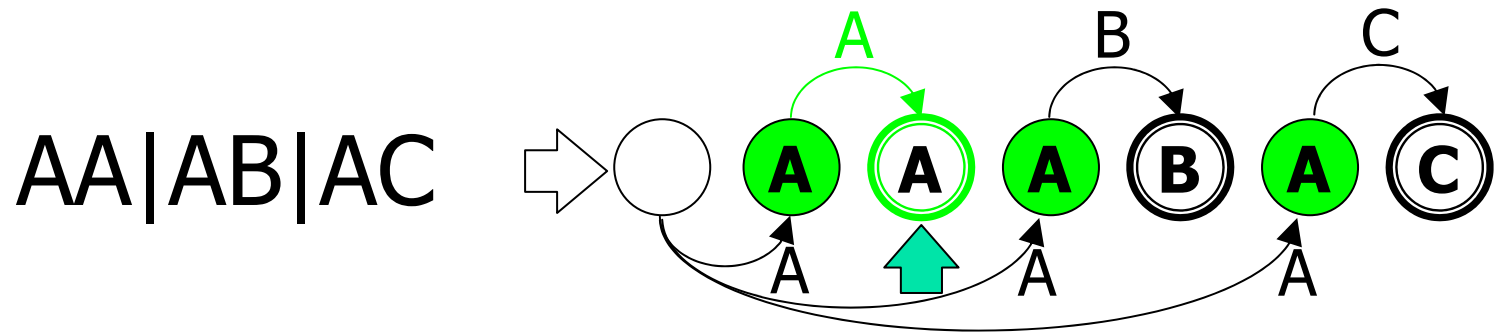
- $\delta(D, a) = T[D] \& B[a]$



a	B[a]	D	T[D]
'A'	0111010	1000000	0101010
'B'	0000100	0100000	0010000
'C'	0000001	...	
		0101010	0010101
		...	

Exact search

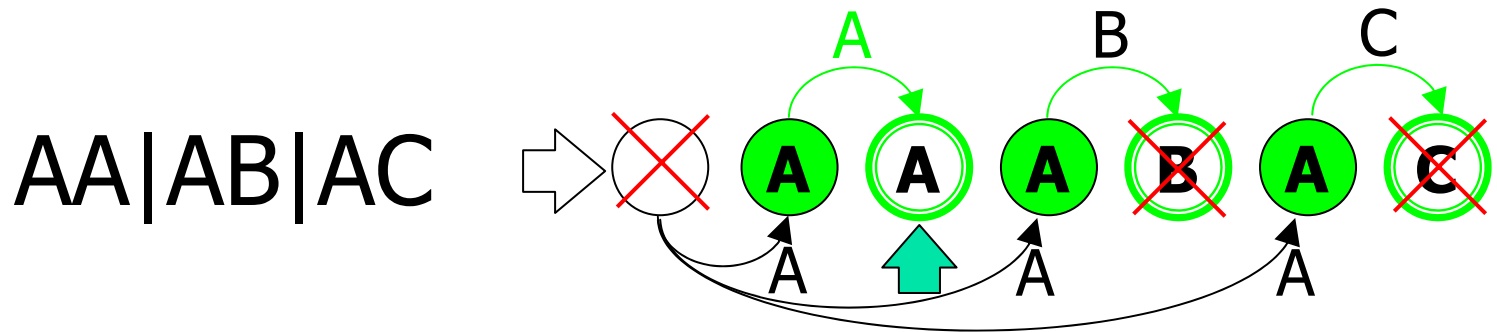
- $\delta(D, a) = T[D] \& B[a]$



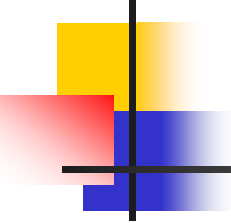
a	B[a]	D	T[D]	$\delta(0101010, 'A')$
'A'	0111010	1000000	0101010	
'B'	0000100	0100000	0010000	
'C'	0000001	...	...	
		0101010	0010101	
		...	...	

Exact search

- $\delta(D, a) = T[D] \& B[a]$



a	B[a]	D	T[D]	$\delta(0101010, 'A')$
'A'	0111010	1000000	0101010	0010101
'B'	0000100	0100000	0010000	$\& 0111010$
'C'	0000001	...	...	0010000
		0101010	0010101	
		...		



Exact search

$D \leftarrow 100..00$ // initial state active

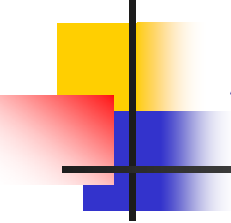
$F \leftarrow$ bit-vector of final states

For $\text{pos} \in 1 \dots n$ **Do** // scanning text

$D \leftarrow T[D] \ \& \ B[t_{\text{pos}}]$

If $D \ \& \ F \neq 000..00$ **Then** match

End of For



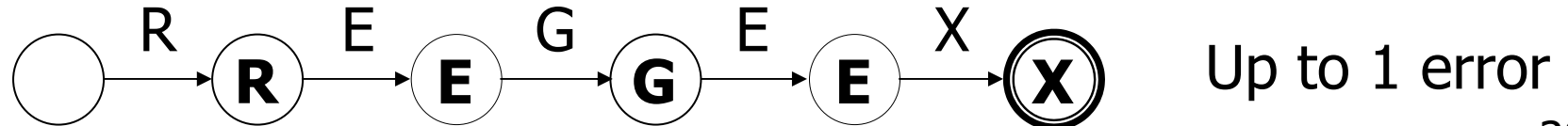
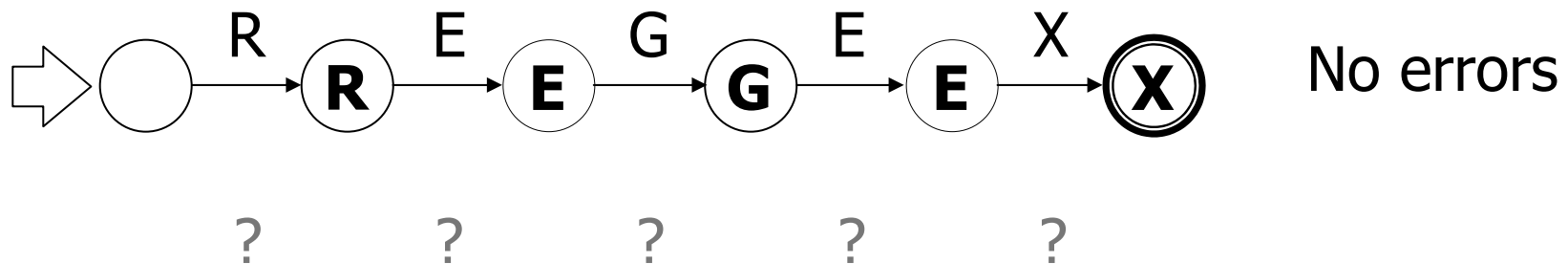
Approximate search

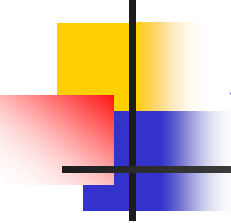
Errors

- Insertion
- Deletion
- Substitution

Approximate search

- When searching with k errors we make $k+1$ replicas of the automaton, one for each error-level
- Plus we need transitions for errors





Approximate search

- R_0, R_1 – current bit-vectors
- R_0', R_1' – bit-vectors after processing character a

$$R_0' = T[R_0] \& B[c]$$

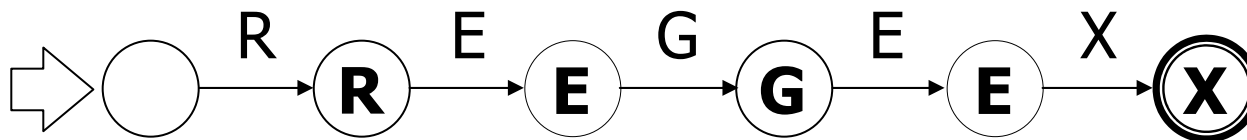
$$R_1' = ?$$

Approximate search

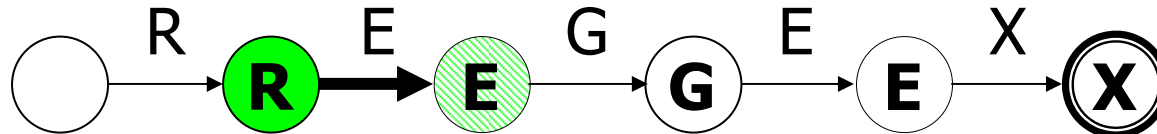
$$R_1' = \underbrace{T[R_1] \ \& \ B[c]}_{\text{no errors}} \mid \dots$$

- Same as in exact search

EGEX



No errors



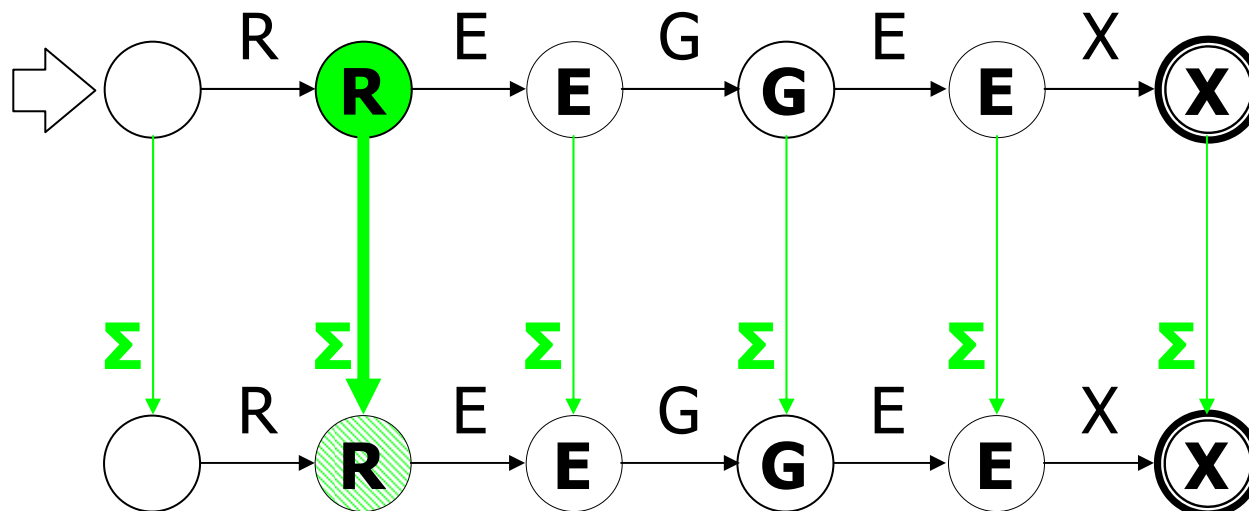
Up to 1 error

Approximate search

$$R_1' = \underbrace{T[R_1] \ \& \ B[c]}_{\text{no errors}} \mid \underbrace{R_0}_{\text{del}} \mid \dots$$

- Active states remain the same

RAEGEX



No errors

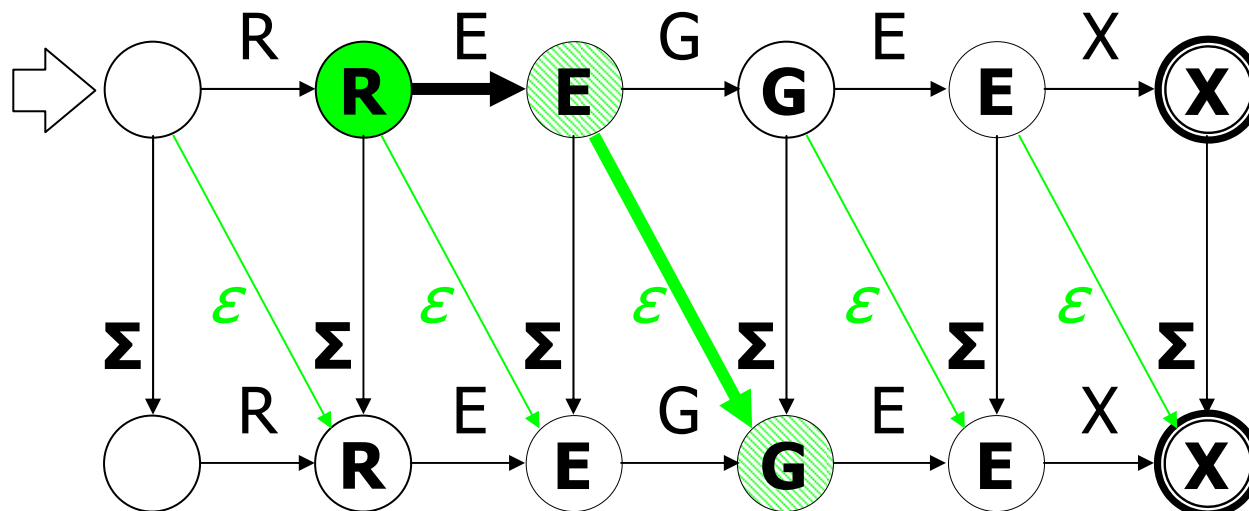
Up to 1 error

Approximate search

$$R_1' = \underbrace{T[R_1] \ \& \ B[c]}_{\text{no errors}} \mid \underbrace{R_0}_{\text{del}} \mid \underbrace{T[R_0']}_{\text{ins}} \mid \dots$$

- Insert new character **after** the current one
- Just one step in automaton

REEX



No errors

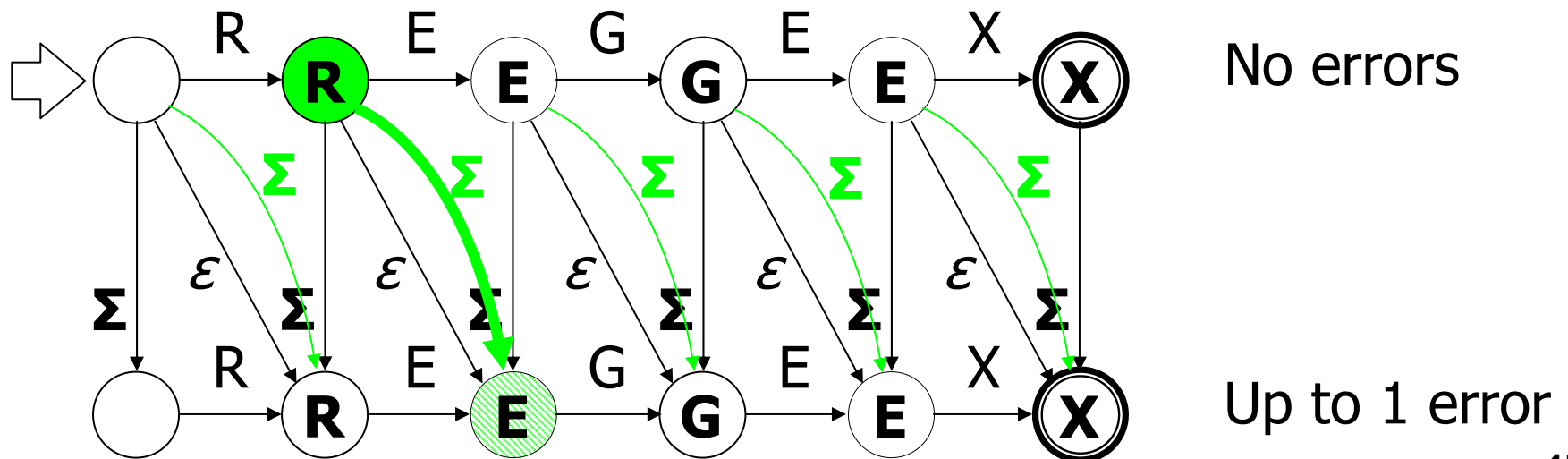
Up to 1 error

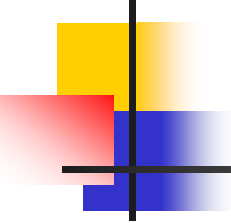
Approximate search

$$R_1' = \underbrace{T[R_1] \ \& \ B[c]}_{\text{no errors}} \mid \underbrace{R_0}_{\text{del}} \mid \underbrace{T[R_0']}_{\text{ins}} \mid \underbrace{T[R_0]}_{\text{subst}}$$

- Similar to exact matching except...
- ... we don't care about the character read

RAGEX





Error-free regions

- Approximate search

$$R_1' = T[R_1] \& B[c] \mid R_0 \quad \mid T[R_0'] \mid T[R_0]$$

- With no-error regions

$$R_1' = \underbrace{T[R_1] \& B[c]}_{\text{no errors}} \mid \underbrace{R_0 \& I}_{\text{del}} \mid \underbrace{T_e[R_0']}_{\text{ins}} \mid \underbrace{T_e[R_0]}_{\text{subst}}$$

Error-free regions

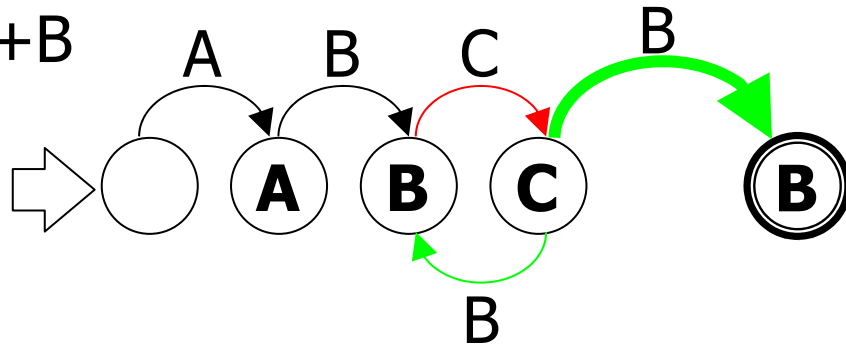
- Deletion from text

	$A(BC)+B$	$A<\underline{(BC)}+>B$	$A<BC>+B$
$A\underline{X}BCBCB$	match	match	match
$AB\underline{X}CBCB$	match	no match	no match
$ABCBC\underline{X}B$	match	match	match
$ABC\underline{X}BCB$	match	no match	match

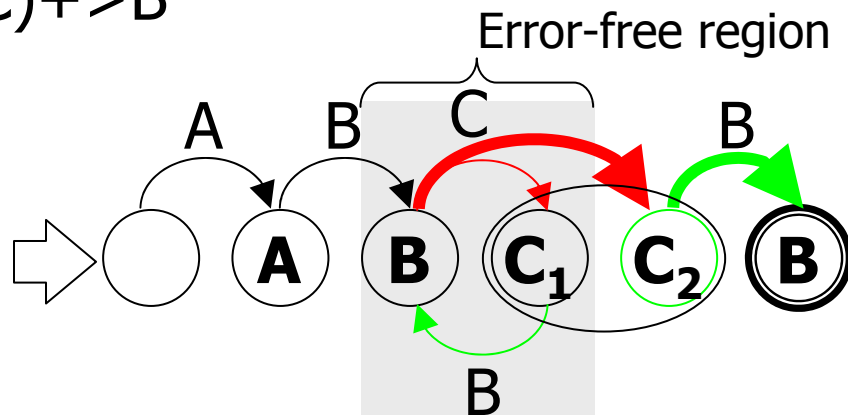
- Make two copies of 'C'
 - Those characters that error-free regions can end with must be duplicated

Error-free regions

$A(BC)^+B$



$A<(BC)^+>B$

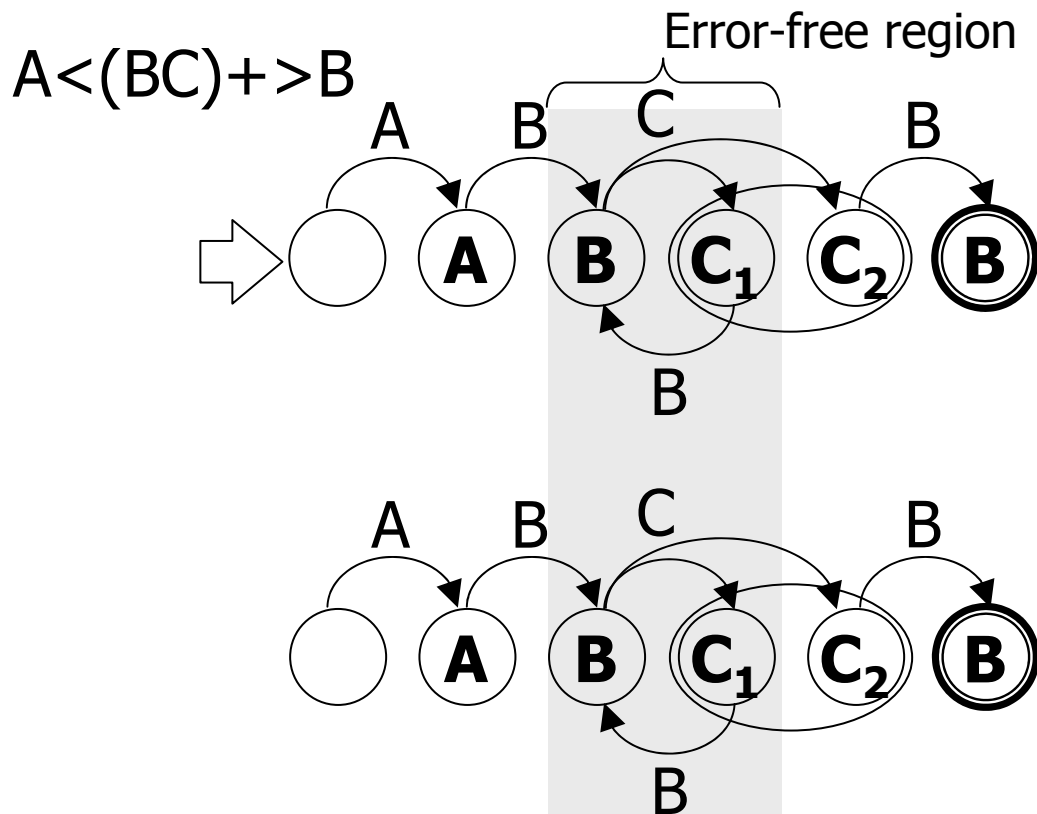


Error-free regions

$$R_1' = T[R_1] \ \& \ B[c] \mid R_0 \quad \mid T[R_0'] \mid T[R_0]$$

$$R_1' = \underline{T[R_1] \ \& \ B[c]} \mid \dots$$

no errors



Error-free regions

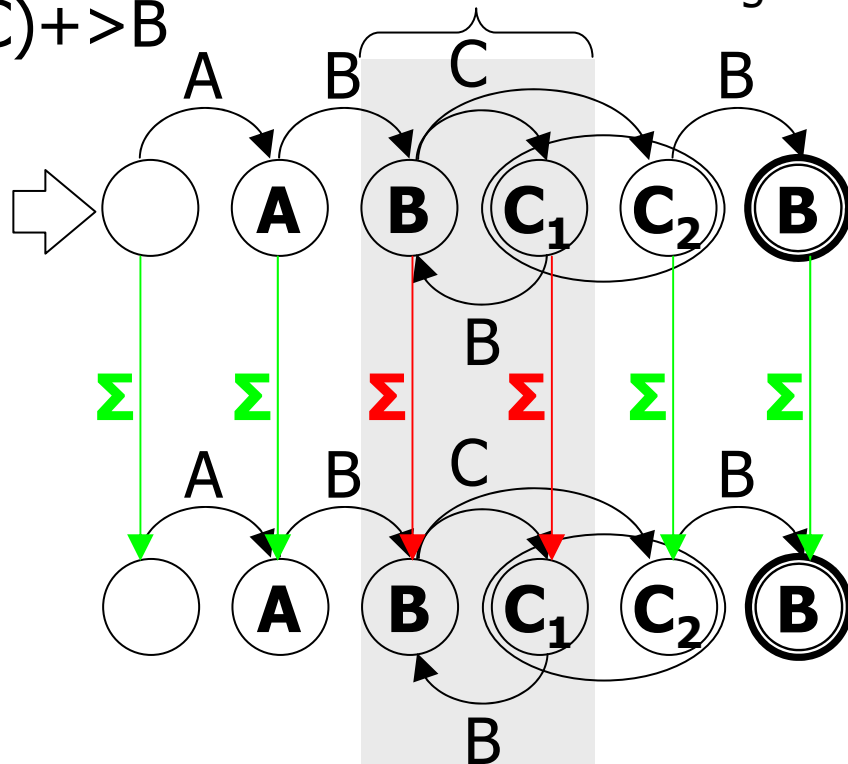
$$R_1' = T[R_1] \ \& \ B[c] \mid R_0 \quad \mid T[R_0'] \mid T[R_0]$$

$$R_1' = \underline{T[R_1] \ \& \ B[c]} \mid \underline{???}$$

no errors

del

$A < (BC)^+ > B$



Error-free regions

$$R_1' = T[R_1] \ \& \ B[c] \mid R_0 \quad \mid T[R_0'] \mid T[R_0]$$

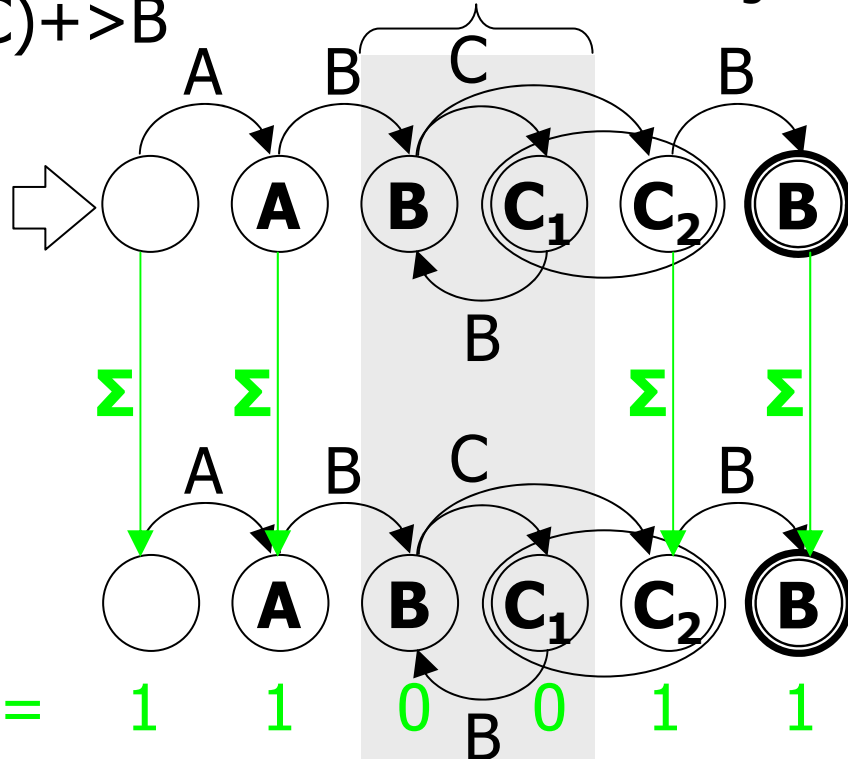
$$R_1' = \underbrace{T[R_1] \ \& \ B[c]}_{\text{no errors}} \mid \underbrace{R_0 \ \& \ I}_{\text{del}} \mid \dots$$

no errors

del

Error-free region

$A < (BC)^+ > B$



Error-free regions

$$R_1' = T[R_1] \ \& \ B[c] \mid R_0 \quad \mid T[R_0'] \mid T[R_0]$$

$$R_1' = \underbrace{T[R_1] \ \& \ B[c]}_{\text{no errors}} \mid \underbrace{R_0 \ \& \ I}_{\text{del}} \mid \underbrace{???}_{\text{ins}}$$

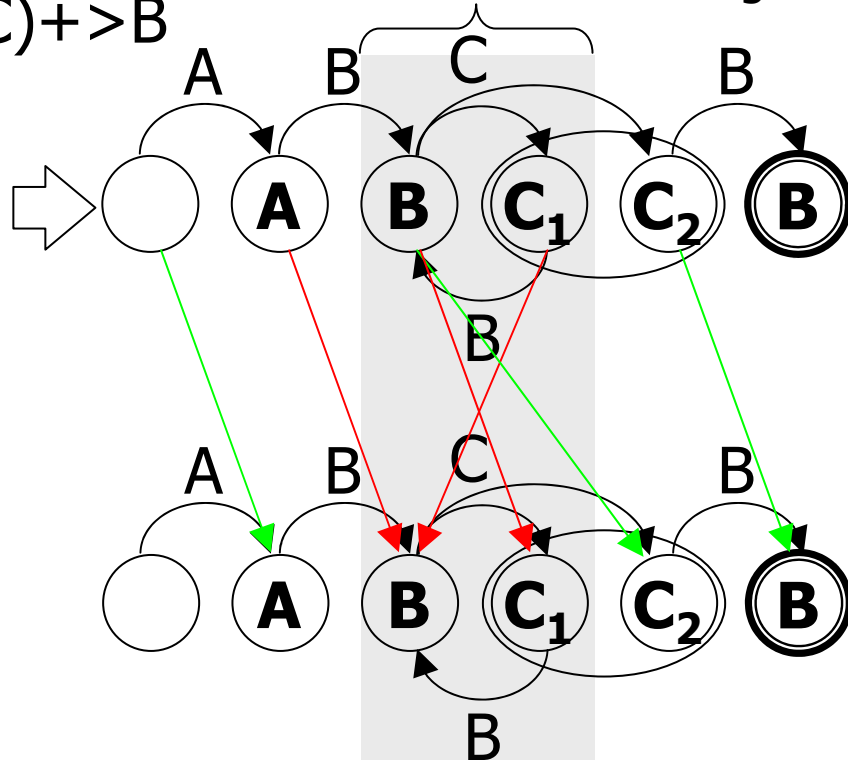
no errors

del

ins

$A < (BC)^+ > B$

Error-free region



ϵ - transitions

Error-free regions

$$R_1' = T[R_1] \ \& \ B[c] \mid R_0 \mid T[R_0'] \mid T[R_0]$$

$$R_1' = \underbrace{T[R_1] \ \& \ B[c]}_{\text{no errors}} \mid \underbrace{R_0 \ \& \ I}_{\text{del}} \mid \underbrace{T_e[R_0']}_{\text{ins}} \mid \dots$$

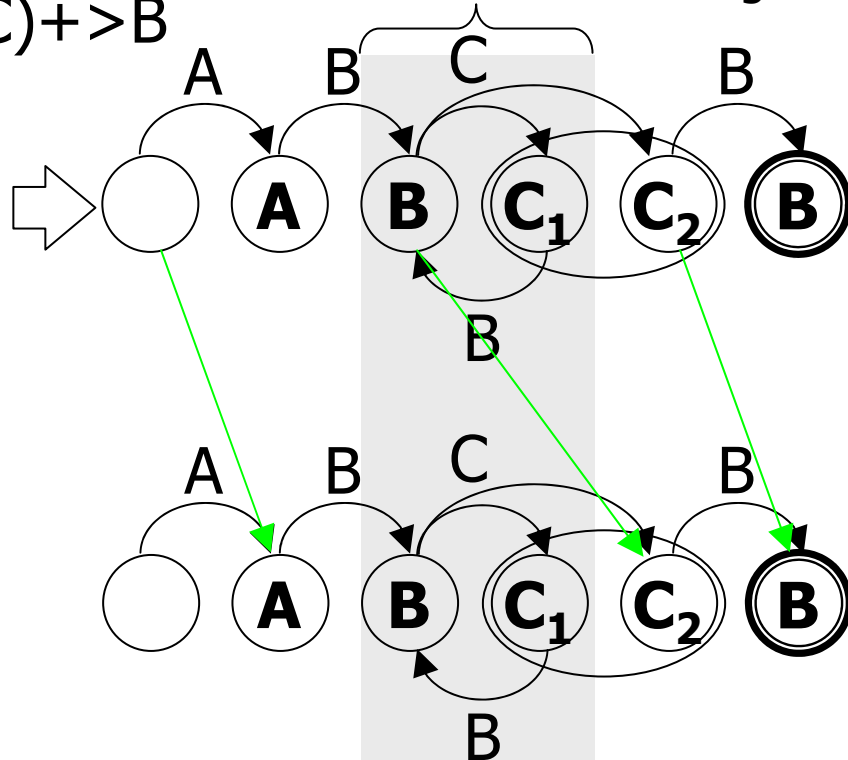
no errors

del

ins

Error-free region

$A < (BC)^+ > B$



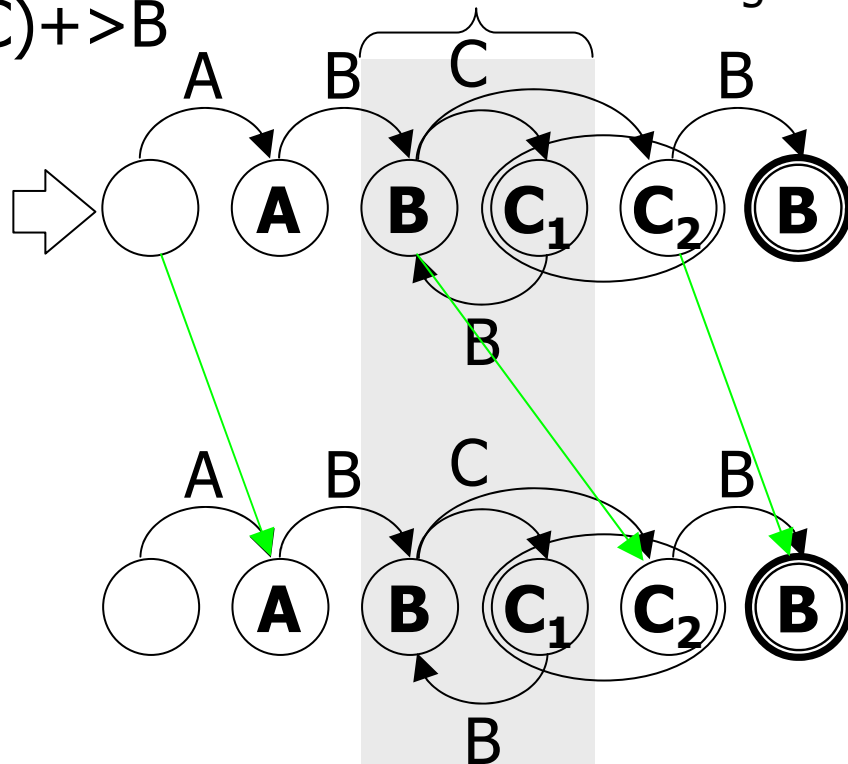
ϵ - transitions

Error-free regions

$$R_1' = \underbrace{T[R_1] \ \& \ B[c]}_{\text{no errors}} \mid \underbrace{R_0 \ \& \ I}_{\text{del}} \mid \underbrace{T[R_0']}_{\text{ins}} \mid \underbrace{T[R_0]}_{\text{subst}}$$

$$R_1' = \underbrace{T[R_1] \ \& \ B[c]}_{\text{no errors}} \mid \underbrace{R_0 \ \& \ I}_{\text{del}} \mid \underbrace{T_e[R_0']}_{\text{ins}} \mid \underbrace{T_e[R_0]}_{\text{subst}}$$

$A < (BC)^+ > B$



Σ - transitions