

A finite automaton is a quintuplet $M=\left(Q, q_{0}, A, \Sigma, \delta\right)$
－$Q$ ：finite set of states
－$q_{0}$ ：initial state
－$A \subset Q$ ：set of final states
－$\Sigma$ ：finite alphabet
－$\delta$ is a function from $Q \times \Sigma$ in $Q$ called the transition function．
The suffix function associated with a pattern $P[1 . . \mathrm{m}]$ ：

$$
\begin{align*}
\sigma: \Sigma^{*} & \longrightarrow\{0,1, \ldots, m\}  \tag{1}\\
t & \longrightarrow \sigma(x)=\max \{k \mid P[1 . . k] \text { suffix of } t\}
\end{align*}
$$

The number $\sigma(t)$ is the size of the largest prefix of the pattern being searched for，which is the suffix of the text $t$
Example ：For $P=a b$ ，one have $\sigma(\epsilon)=0, \sigma(c c a c a)=1, \sigma(c c a b)=2$ ．
If $x$ is suffix of $y, \sigma(x) \leq \sigma(y)$ ．
$b$ is suffix of $a b, \sigma(b) \leq \sigma(a b)$
$a$ is suffix of $a a, \sigma(a) \leq \sigma(a a)$
Automaton associated with a pattern．This is the automaton for which we are in state $q$ if and only if the largest prefix we have just read is $P[1 . . q]$ ．
－$Q=\{0,1, \ldots, m\}$
－$q_{0}=\{0\}$
－$A=\{m\}$
－$\delta(\boldsymbol{q}, a)=\sigma\left(P_{q} a\right)$ maximum suffix of the concatenation of $P_{q}$ withraac 25／112

## Computing the transition function

The idea is based on the meaning of the different states of the automaton state $i$ corresponds to the state where the first $i$ letters of the searched pattern have just been read．To build the automaton，we go through all the states of the automaton（from 0 to $n$ ，where $n$ is the length of the word we＇re looking for）and for each state $i$ ，we go through each letter a of the alphabet．We then calculate the longest prefix of the pattern that is a suffix of $P[1 . . i]$ ．a．The length of this suffix gives the arrival state of the transition starting from $i$ via letter $a$ ．

```
def Transition_Function_computation (P, Sigma)
m = len(P);
    or q in range(m)
        k=min(m,q+1)
        while (P[1..k] is not a suffixe of P_q.a)
        delta(q,a) = k;
    return(delta);
```

For this function to be correct，the following convention must be used ：$\varepsilon$ is the suffix for all strings．
Complexity analysis ：
－lines 6－7：$O\left(\mathrm{~m}^{2}\right)$
－line 4：$O(|\Sigma|)$
－line 3：$O(m)$
－Global complexity ：$O\left(m^{3}|\Sigma|\right)$
－We can do faster．

Example：Search for pattern ababaca


Once the automaton has been constructed，the text traversal algorithm is as follows
def FiniteAutomatonSearch（T，delta，m）

```
n = 1en(T);
q = = 0 ; ; i; i<=n; i++),
    q= delta (q,T[i])
```

    if \(q=m\) then
    print ('The pattern appears with the offset', i-m);
    Complexity：$O(n)$
Run the automaton on the string ababacaba
$\qquad$

6．Cote DAZZUR

| Algorithmics <br> for Biology |
| :--- |
| Jean－Paul <br> Comet |
| Complexity |
| Pat．Matching |
| Rabin－Karp |
| Antomata <br> kMP <br> EM <br> Graphs |
| Dyn．Prog． |
| Sequences |
|  |

Example ：building the automaton for pattern AAB

| q | a | k | $P_{k}$ | $P_{q}$. a | suffix | $\delta$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathrm{q}=0$ | A | $\begin{aligned} & \min (m, q+1)=\min (3,1)=1 \\ & 1 \\ & 0 \end{aligned}$ | $\begin{aligned} & \text { A } \\ & \text { A } \\ & \varepsilon \end{aligned}$ | $\begin{aligned} & \mathrm{A} \\ & \mathrm{~B} \\ & \mathrm{~B} \end{aligned}$ | $\begin{aligned} & \text { yes } \\ & \text { no } \\ & \text { yes } \\ & \hline \end{aligned}$ | 1 0 |
| $\mathrm{q}=1$ | A | $\begin{aligned} & \min (m, q+1)=\min (3,2)=2 \\ & 2 \\ & 1 \\ & 0 \end{aligned}$ | $\begin{aligned} & \text { AA } \\ & \text { AA } \\ & \text { A } \\ & \varepsilon \end{aligned}$ | $\begin{aligned} & \hline A A \\ & A B \\ & A B \\ & A B \end{aligned}$ | $\begin{aligned} & \text { yes } \\ & \text { no } \\ & \text { no } \\ & \text { yes } \\ & \hline \end{aligned}$ | 2 0 |
| $\mathrm{q}=2$ | A B | $\begin{aligned} & \min (m, q+1)=\min (3,3)=3 \\ & 2 \\ & 3 \end{aligned}$ | $\begin{aligned} & \text { AAB } \\ & \text { AA } \\ & \text { AAB } \end{aligned}$ | AAA AAA <br> AAB | $\begin{aligned} & \hline \text { no } \\ & \text { yes } \\ & \text { yes } \\ & \hline \end{aligned}$ | 2 3 |
| $\mathrm{q}=3$ | A B | $\begin{aligned} & \min (m, q+1)=\min (3,4)=3 \\ & 2 \\ & 1 \\ & 3 \\ & 2 \\ & 1 \\ & 0 \end{aligned}$ | AAB <br> AA <br> A <br> AAB <br> AA <br> A <br> $\varepsilon$ | $\begin{aligned} & \text { AABA } \\ & \text { AABA } \\ & \text { AABA } \\ & \text { AABB } \\ & \text { AABB } \\ & \text { AABB } \\ & \text { AABB } \end{aligned}$ | no <br> no <br> yes <br> no <br> no <br> no <br> yes | 1 0 |



This algorithm achieves complexity in $\Theta(n+m)$ by avoiding the transition unction $\delta$. It computes an auxiliar function $\pi[1 . . \mathrm{m}]$ precomputed from the pattern in $O(m)$. The array $\pi$ allows the transition function $\delta$ to be computed on the fly if necessary.
Pattern prefix function : Correspondence between the motif and its own shifts.


Question : how to calculate $s^{\prime}$ so that the offset is not invalid?
Answer: Find a suffix $P_{k}$ of $P_{q}$ that is a prefix of $P$
The prefix function for the $P$ pattern
$\Pi:\{1,2 \ldots m\} \longrightarrow\{0,1 \ldots m-1\}$ $\Pi[q]$ is in fact the size of the longest prefix of $P$ which is a proper suffix of $P_{q}$.

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- We construct the array $\Pi$ starting from index 0 . The initialisation is simple: $\Pi[1]=0$
- Now let's assume that we have calculated $\Pi[i]$ from $i=1$ to $q-1$. To calculate $\Pi[q]$ we have the following situation :

- Since $k$ is the longest prefix that is a suffix of $P_{q-1}$, the longest prefix that is also a suffix of $P_{q}$ cannot be longer than $P_{k+1}$. Furthermore, we have

$$
P[k+1]=P[q] \Longleftrightarrow \Pi[q]=k+1
$$

- If $P[k+1] \neq P[q]$, look for the largest prefix-suffix of $P_{q}$. If we don't look at the last letter, the largest prefix-suffix of $P_{q}$ is also a suffix of $P_{k}$. Now we know the largest prefix-suffix of $P_{k}$, which is $\Pi[k]$, already constructed Once we have $P_{\Pi[k]}$, we need to check if it can be extended to the next letter.


## Algorithm for calculating the prefix function

## Algorithmics for <br> Complexity <br> omplexity Pat. Matching

Compute prefix Function (P)
$\mathrm{m}=\operatorname{long}(\mathrm{P})$
$\mathrm{m}=10 \mathrm{ng}$
$\mathrm{pi}[1]=0$
$\mathrm{k}=0$
$\mathrm{p}=0$
$\mathrm{k}=\mathrm{o}$
for
for ( $\mathrm{q}=2 ; \mathrm{q}<=\mathrm{m}$; $\mathrm{q}+\mathrm{+}$ ) \{
( 1 le $(k>0)$ and $P[k+1] \quad!=P[q]$
$\mathrm{k}=\mathrm{pi}[\mathrm{k}]$;
\} $\mathrm{k}=\mathrm{pi}[\mathrm{k}]$;
if $P[k+1]==P[q]$ then $k++$
$\left.{ }_{f} \mathrm{pi}^{[\mathrm{L}} \mathrm{q}\right]=\mathrm{k}$
return(pi);

## :: COTTE



## Example 1

$\begin{array}{llllllllll}1 & 2 & 3 & 4 & 5 & 6 & 7 & 8 & 9 & 10\end{array}$
$\begin{array}{ccccccccccccccc}\text { a } & \mathrm{b} & \mathrm{a} & \mathrm{b} & \mathrm{a} & \mathrm{b} & \mathrm{a} & \mathrm{b} & \mathrm{c} & \mathrm{a} & & & & & \\ \text { Let's build } \Pi: & \Pi: & 1 & 2 & 3 & 4 & 5 & 6 & 7 & 8 & 9 & 10\end{array}$

- $q=2, k=0 \quad$ no while $(k=0)$
if $P[1]=P[2] \quad(\mathrm{a}=\mathrm{b}) ? \quad$ no, $k=0 \Longrightarrow \Pi[2]=0$
- $q=3, k=0$ no while $(k=0)$
if $P[1]=P[3] \quad(a=a) ? \quad$ yes, $k=1 \Longrightarrow \Pi[3]=1$
- $q=4, k=1 \quad$ no while $(P[k+1]=P[q])$
if $P[2]=P[4] \quad(\mathrm{b}=\mathrm{b}) ? \quad$ yes, $k=2 \Longrightarrow \Pi[4]=2$
- $q=5, k=2 \quad$ no while $(P[k+1]=P[q])$
if $P[3]=P[5] \quad(a=a) ? \quad$ yes, $k=3 \xlongequal{\Longrightarrow} \Pi[5]=3$
- $q=6, k=3$ no while $(P[k+1]=P[q])$
if $P[4]=P[6] \quad(\mathrm{b}=\mathrm{b}) ? \quad$ yes, $k=4 \Longrightarrow \Pi[6]=4$
- $q=7, k=4 \quad$ no while $(P[k+1]=P[q])$
if $P[5]=P[7] \quad(\mathrm{a}=\mathrm{a}) ? \quad$ yes, $k=5 \Longrightarrow \square[7]=5$
- $q=8, k=5 \quad$ no while $(P[k+1]=P[q])$
if $P[6]=P[8] \quad(\mathrm{b}=\mathrm{b}) ? \quad$ yes, $k=6 \xlongequal{\Longrightarrow} \Pi[8]=6$
- $q=9, k=6 \quad$ enter into the while
while $P[7] \neq P[9](a \neq c) k=\Pi[6]=4$
while $P[5] \neq P[9](a \neq c) k=\Pi[4]=2$ while $P[3] \neq P[9](a \neq c) k=\Pi[2]=0$ if $P[1]=P[9] \quad(\mathrm{a}=\mathrm{c}) ? \quad$ no, $k=0 \Longrightarrow \Pi[9]=0$
- $q=10, k=0 \quad$ no while $(k=0 \& P[k+1]=P[q])$
if $P[1]=P[10] \quad(a=a) ? \quad$ yes, $k=1 \Rightarrow \Pi[10]=1 \equiv$ 引 $\Longrightarrow$ Эac $32 / 112$


## Validity of the prefix function



Consider the following pattern
123
$\begin{array}{llll}\mathrm{S} & \mathrm{N} & \mathrm{N} & \mathrm{S}\end{array}$
Let's build the function $\Pi$ :
$\Pi:$
$\square$ $\begin{array}{llll}0 & 0 & 0 & 1\end{array}$

- $q=2, k=0 \quad$ no while $(k=0)$
if $P[1]=P[2] \quad(S \neq N) ? \quad$ no $\Longrightarrow \Pi[2]=0$

Let's consider $\pi^{*}[q]=\left\{q, \pi[q], \pi^{2}[q], \ldots \pi^{t}[q]\right\}$ where $t$ is the first natural number such that $\pi^{t}[q]=0$.

## Lemma

Let $P$ be a pattern of length $m$ and having the prefix function $\pi$. Then, for $q=1,2, \ldots m$, one has $\pi^{*}[q]=\left\{k \mid P_{k}\right.$ suffix of $\left.P_{q}\right\}$

## Proof :

(1) First inclusion : $i \in \pi^{*}[q] \Rightarrow P_{i}$ suffixe de $P_{q}$ If $i \in \pi^{*}[q], \exists u \mid \pi^{u}[q]=i$

- for $u=0, i=q$ and thus $P_{i}=P_{q}$ and $P_{i}$ is suffix of $P_{q}$
- let us suppose $P_{\pi^{u}[q]}$ suffix of $P_{q}$ for each $u<u_{0}$
$P_{\pi^{u_{0}}[q]}=P_{\pi\left[\pi^{u_{0}-1}[q]\right]}$ and one have $P_{\pi^{u_{0}-1}[q]}$ suffix of $P_{q}$ and $P_{\pi^{u_{0}[q]}}$ suffix of $P_{\pi^{u_{0}-1}[q]}$.
Since the suffix relationship is transitive, we have $P_{\pi^{u_{0}}[q]}$ suffix of $P_{q}$
- Conclusion : $i \in \pi^{*}[q] \Rightarrow P_{i}$ suffix of $P_{q}$.
$\square$


## Validity of the prefix function

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Comet

## Lemma

Let $P$ be a pattern of length $m$ and prefix function $\pi$. For $q=1,2, \ldots, m$
if $\pi[q]>0 \quad$ then $\quad \pi[q]-1 \in \pi^{*}[q-1]$.

## Proof

If $k=\pi[q]>0$ then $P_{k}$ suffix of $P_{q}$
Thus $P_{k-1}$ suffix of $P_{q-1}$ (by deleting the last character of $P_{k}$ and $P_{q}$ )
According to the previous lemma : $k-1 \in \pi^{*}[q-1]$. $\square$

For $q=2,3, \ldots, m$, we define the subset $E_{q-1} \subseteq \pi^{*}[q-1]$ by :

$$
E_{q-1}=\left\{k \mid k \in \pi^{*}[q-1] \text { by } P[k+1]=P[q]\right\}
$$

Intuitively, $E_{q-1}$ is made up of values $k \in \pi^{*}[q-1]$ such that it is possible to extend $P_{k}$ to $P_{k+1}$ and obtain a suffix of $P_{q}$.

## corrolary

Let $P$ be a pattern of length $m$ and prefix function pi. For $q=2,3, \ldots, m$,

$$
\pi[q]=0 \text { if } E_{q-1}=\{ \}
$$

$$
\pi[q]=1+\max \left\{k \in E_{q-1}\right\} \text { if } E_{q-1} \neq\{ \}
$$

## Proof

If $r=\pi[q]>0$ then $P_{r}$ suffix of $P_{q}$.
And $r \geq 1 \Rightarrow P[r]=P[q]$
According to the previous lemma, if $r \geq 1$, we have

$$
r=1+\max \{\underbrace{\left.k \in \pi^{*}[q-1] \mid P[k+1]=P_{q}\right]}_{E_{q-1}}\}
$$

## Algorithm validity :

(1) $\pi[1]=0$ correct because $\pi[q]<q$ for all $q$
(2) At the start of each loop iteration, we have $k=\pi[q-1]$

- for the first loop : imposed by $\pi[1]=0$ and $k=0$
- for the others: imposed by $\pi[q]=k$
(3) while loop : we run through all the values of $\pi^{*}[q-1]$ until we find one for which $P[k+1]=P[q]$.
At this point, we know that $k$ is the largest value of $E_{q-1}$; and from the corollary, we can give to $\pi[q]$ the value $k+1$
If no such $k$ is found, $k=0$
$\square$
If $r=0$, there is no $k \in \pi^{*}[q-1]$ for which we can extend $P_{k}$ to $P_{k+1}$ to obtain suffix of $P_{q}$, since we would then have $\pi[q]>0$
Thus $E_{q-1}=\{ \}$


## Global procedure

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```
1 KMP1(T,P)
    n = long[T];
    PI = Calcul_fonct_prefixe(P);
    q = 0;
    Pour i=1 à n faire
        tant que q>0 & P[q+1]!=T[i]
            q=PI[q];
            si P[q+1]=T[i]
            q=q+1
            si q}=\textrm{q}=\textrm{m}\mathrm{ alors
            q=m alors
            q = PI[q];
                    KMP2(T,P)
                        n = long[T];
            m = long[P];
            PI = Compute prefix_Function(P)
            i = q ; = 0
            while (i<n)
            while (i<n):
                if T[i] == P[q]
            i++;
                if q==0
                        i++;
            else:
            if q==m
            print(
                    q= Print('hit at '', i-m);
```

The first version is based on the same idea as the prefix function.
The second version manages two indices in a single loop : one to indicate progress
in the text and another to indicate progress in the pattern.

Complexity analysis : requires amortized analysis..

