

### 10.11.2016

abhi shelat

# Scheduling 



CS4800 F16
abhi shelat

## start end

| sy 3333 | 2 | 3.25 |
| :---: | :---: | :---: |
| en1612 | 1 | 4 |
| ma1231 | 3 | 4 |
| cs4102 | 3.5 | 4.75 |
| cs 4800 | 4 | 5.25 |
| cs6051 | 4.5 | 6 |
| sy 3100 | 5 | 6.5 |
| $\operatorname{cs} 1000$ | 7 | 8 |

$$
\begin{aligned}
& \text { problem statement } \\
& \left(a_{1}, \ldots, a_{n}\right) \\
& \left(s_{1}, s_{2}, \ldots, s_{n}\right) \\
& \left(f_{1}, f_{2}, \ldots, f_{n}\right) \text { (sorted) } s_{i}<f_{i}
\end{aligned}
$$

find largest subset of activities $\mathrm{C}=\{\mathrm{ai}\}$ such that (compatible)

$$
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& \left(a_{1}, \ldots, a_{n}\right) \\
& \left(s_{1}, s_{2}, \ldots, s_{n}\right) \\
& \left(f_{1}, f_{2}, \ldots, f_{n}\right) \text { (sOrted) } \quad s_{i}<f_{i}
\end{aligned}
$$

find largest subset of activities $C=\{a i\}$ such that (compatible)

$$
\begin{aligned}
& a_{i}, a_{j} \in C, i<j \\
& f_{i} \leq s_{j}
\end{aligned}
$$

$$
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& \text { problem statement } \\
& \left(a_{1}, \ldots, a_{n}\right) \\
& \left(s_{1}, s_{2}, \ldots, s_{n}\right) \\
& \left(f_{1}, f_{2}, \ldots, f_{n}\right) \text { (sorted) } s_{i}<f_{i}
\end{aligned}
$$



## dynamic programming

 $\stackrel{s_{2} f_{1} f_{2}}{\leftrightarrows}$



goal: $\operatorname{SOLTN}_{0,2 n}$

## greedy solution:



## claim: the first action to finish in e[i,j] is always part of some $\operatorname{soltr}_{i, j}$

proof:

## greedy solution:


algorithm: find first event to finish. add to solution. remove conflicting events. continue.

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## running time

algorithm: find first event to finish. add to solution. remove conflicting events. continue.

$$
\left(f_{1}, f_{2}, \ldots, f_{n}\right) \text { (sorted) } \quad s_{i}<f_{i}
$$

## caching

$$
\underset{\text { CS4800 }}{L 10}
$$

## Cache

$$
\begin{aligned}
& \text { CPU } \\
& \text { load r2, addr a } \\
& \text { store r4, addr b }
\end{aligned}
$$

## main memory

## problem statement

input:
output:

cache is

## problem statement

input: K, the size of the cache $d_{1}, d_{2}, \ldots, d_{m}$ memory accesses
output: schedule for that cache that minimizes \# of cache misses while satisfying requests
cache is fully associative, line size is 1

## contrast with reality

## Belady evict rule

## example



## example



## example



## example



## example



Surprising theorem

## schedule

Schedule for access pattern $\mathrm{d}_{1}, \mathrm{~d}_{2}, \ldots, \mathrm{~d}_{\mathrm{n}}$ :

Reduced schedule:

Exchange lemma

## Exchange Lemma:

Let $S$ be a reduced schedule that agrees with $S_{f f}$ on the first $j$ items. There exists a reduced schedule S' that agrees with Sff on the first j+1 items and has the same or fewer \#misses as S .

## $S^{*}$

## Proof of Lemma

Let $S$ be a reduced sched that agrees with $S_{f f}$ on the first $j$ items. There exists a reduced sched $\mathbf{S}^{\prime}$ that agrees with $\mathrm{Sff}_{\text {fi }}$ on the first j+1 items and has the same or fewer \#misses as S .

## Proof of lemma

State of the cache after $J$ operations under the two schedules.

easy case 1
easy case 2

Proof of lemma


## Timeline


$\square$
$\square$

Proof of lemma


Let access t

Proof of lemma

## S

 d f
what if $t=e$ ?

Proof of lemma

## S


what if $t=f$ ?

Proof of lemma

what if $t$ is neither e nor $f$ ?

## What have we shown



Let $S$ be a reduced sched that agrees with $S_{f f}$ on the first $j$ items. There exists a reduced sched $\mathbf{S}^{\prime}$ that agrees with Sff on $^{\text {on }}$ the first $j+1$ items and has the same or fewer \#misses as S.

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Huffman

$$
\frac{10}{C S} \int_{000}
$$





MOSCOW - President Vladimir V. Putin’s typically theatrical order to withdraw the bulk of Russian forces from Syria, a process that the Defense Ministry said it began on Tuesday, seemingly caught Washington, Damascus and everybody in between off guard - just the way the Russian leader likes it.

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$$
\begin{array}{cll}
c \in C & f_{c} & T \\
\mathrm{e}: & 235 & \\
\mathrm{i}: & 200 \\
\mathrm{o}: & 170 \\
\mathrm{u}: & 87 \\
\mathrm{p}: & 78 \\
\mathrm{~g}: & 47 \\
\mathrm{~b}: & 40 \\
\mathrm{f}: & 24
\end{array}
$$

881

| $c \in C \quad f_{c}$ | $T$ | $\ell_{c}$ |
| :--- | :--- | :--- |
| $\mathrm{e}: 235$ | 000 | 3 |
| $\mathrm{i}: 200$ | 001 | 3 |
| $\mathrm{o}:$ | 170 | 010 |
| $\mathrm{u}: 87$ | 011 | 3 |
| $\mathrm{p}: 78$ | 100 | 3 |
| $\mathrm{~g}:$ | 47 | 101 |
| $\mathrm{~b}: 40$ | 110 | 3 |
| $\mathrm{f}: 24$ | 111 | 3 | 881

## def: cost of an encoding

$$
B\left(T,\left\{f_{c}\right\}\right)=\sum_{c \in C} f_{c} \cdot \ell_{c}
$$

| $c \in C$ | $f_{c}$ | $T$ |
| :---: | :---: | :---: |
| $\mathrm{e}: 235$ | 000 | $\ell_{c}$ |
| $\mathrm{i}: 200$ | 001 | 3 |
| $\mathrm{o}: 170$ | 010 | 3 |
| $\mathrm{u}: 87$ | 011 | 3 |
| $\mathrm{p}: 78$ | 100 | 3 |
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|  | 881 |  |

## character frequency

## morse code

## International Morse Code

-1 dash = 3 dots.
The space between parts of the same letter $=1$ dot
The space between letters $=3$ dots.
The space between words $=7$ dots.


## 

## International Morse Code

-1 dash = 3 dots.
The space between parts of the same letter $=1$ dot
The space between letters $=3$ dots.
The space between words $=7$ dots.

def: prefix-free code
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$\forall x, y \in C, x \neq y \Longrightarrow \operatorname{CODE}(x)$ not a prefix of $\operatorname{CODE}(y)$

# def: prefix code 

$\forall x, y \in C, x \neq y \Longrightarrow \operatorname{CODE}(x)$ not a prefix of $\operatorname{CODE}(y)$

| $\mathrm{e}:$ | 235 | 0 |
| :--- | :--- | :--- |
| $\mathrm{i}:$ | 200 | 10 |
| $\mathrm{o}:$ | 170 | 110 |
| $\mathrm{u}:$ | 87 | 1110 |
| $\mathrm{p}:$ | 78 | 11110 |
| $\mathrm{~g}:$ | 47 | 111110 |
| $\mathrm{~b}:$ | 40 | 1111110 |
| $\mathrm{f}:$ | 24 | 11111110 |

## decoding a prefix code

| $\mathrm{e}: 235$ | 0 |  |
| :--- | :--- | :--- | :--- |
| $\mathrm{i}: 200$ | 10 |  |
| $\mathrm{o}: 170$ | 110 |  |
| $\mathrm{u}: 87$ | 1110 |  |
| $\mathrm{p}: 78$ | 11110 |  |
| $\mathrm{~g}: 47$ | 111110 |  |
| $\mathrm{~b}: 40$ | 1111110 |  |
| $\mathrm{f}: 24$ | 11111110 |  |

## code to binary tree



# prefix code 


binary tree

## use tree to encode



| $c \in C$ | $f_{c}$ | $T$ | $\ell_{c}$ |
| :--- | :--- | :--- | :--- |
| $\mathrm{e}:$ | 235 | 00 | 2 |
| $\mathrm{i}:$ | 200 | 01 | 2 |
| $\mathrm{o}:$ | 170 | 10 | 2 |
| $\mathrm{u}:$ | 87 | 110 | 3 |
| $\mathrm{p}: 78$ | 111 | 3 |  |

## goal

given the
(all frequencies are $>0$ )
given the character frequencies

$$
\left\{f_{c}\right\}_{c \in C}
$$

produce a prefix code $T$ with smallest cost

$$
\min _{T} B\left(T,\left\{f_{c}\right\}\right)
$$


divide \& conquer?

## counter-example

$$
\begin{array}{ll}
\mathrm{e}: & 32 \\
\mathrm{i}: & 25 \\
\mathrm{o}: & 20 \\
\mathrm{u}: & 18 \\
\mathrm{p}: & 5
\end{array}
$$












objective

## exchange argument

lemma:

## exchange argument

 optimal prefix code $T^{\prime \prime}$ for $C$ in which $x, y$ are siblings. That is, the codes for $x, y$ have the same length and only differ in the last bit.


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lemma ${ }^{\mathrm{Leet}} x, y \in C$ be characters with smallest frequencies $f_{x}, f_{y}$. There exists an optmal prefix code $T^{\prime \prime}$ for $C$ in which $x, y$ are siblings. That is, the codes for $x, y$ have the same length and only differ in the last bit.

first step
lemma ${ }^{\text {Leet } x, y \in C \text { be characters with smallest frequencies } f_{x}, f_{y} \text {. There exists an }}$ optimal prefix code $T^{\prime \prime}$ for $C$ in which $x, y$ are siblings. That is, the codes for $x, y$ have the same length and only differ in the last bit.



$$
\begin{gathered}
B(T)=\sum_{c} f_{c} \ell_{c}+f_{x} \ell_{x}+f_{a} \ell_{a} \quad B\left(T^{\prime}\right)=\sum_{c} f_{c} \ell_{c}^{\prime}+f_{x} x_{x}^{\prime}+f_{a} \ell_{a}^{\prime} \\
B(T)-B\left(T^{\prime}\right) \geq 0
\end{gathered}
$$

exchange argument


$$
B\left(T^{\prime}\right)-B\left(T^{\prime \prime}\right) \geq 0
$$




$$
B(T)-B\left(T^{\prime}\right) \geq 0 \quad B\left(T^{\prime}\right)-B\left(T^{\prime \prime}\right) \geq 0
$$

$T_{\text {is also optimal }}^{1 \prime}$

## exchange argument

lemma ${ }^{\text {Let } x, y \in C}$ be characters with smallest frequencies $f_{x}, f_{y}$. There exists an optimal prefix code $T^{\prime \prime}$ for $C$ in which $x, y$ are siblings. That is, the codes for $x, y$ have the same length and only differ in the last bit.

optimal sub-structure


## optimal sub-structure



## optimal sub-structure



Lemma:

## optimal sub-structure


problem of size n


Lemma:
The optimal solution for $T$ consists of computing an optimal solution for $T^{\prime}$ and replacing the left $z$ with a node having children $x, y$.


$B\left(T^{\prime}\right)$

$B(T)$

$B(T)$

$$
B\left(T^{\prime}\right)=B(T)-f_{x}-f_{y}
$$ <br> \section*{Suppose $T$ is not optimal} <br> \section*{Suppose $T$ is not optimal}

## Suppose $T$ is not optimal



$$
B(U)<B(T)
$$

## Suppose $T$ is not optimal



## Suppose $T$ is not optimal



$$
\begin{aligned}
B(U) & <B(T) \\
B\left(U^{\prime}\right) & =B(U)-f_{x}-f_{y} \\
& <\mathrm{B}(\mathrm{t})-\mathrm{fx}-\mathrm{fy}
\end{aligned}
$$

But this implies that $B\left(T^{\prime}\right)$ was not $o$


## summary of argument

