# COMP 322: Fundamentals of Parallel Programming 

# Lecture 4: Parallel Speedup and Amdahl's Law 

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## One Possible Solution to Worksheet 3 (Multiprocessor Scheduling)



- As before, WORK = 26 and CPL = 11 for this graph
- $T_{2}=15$, for the 2-processor schedule on the right
- We can also see that $\max (C P L, W O R K / 2)<=T_{2}<C P L+$ WORK/2
- There are 4 idle slots in this schedule - can we do better than $T_{2}=15$ ?

| Start time | Proc 1 | Proc 2 |
| :---: | :---: | :---: |
| 0 | A |  |
| 1 | B |  |
| 2 | C | N |
| 3 | D | N |
| 4 | D | N |
| 5 | D | N |
| 6 | D | 0 |
| 7 | I | Q |
| 8 | J | R |
| 9 | L | R |
| 10 | K | R |
| 11 | M | E |
| 12 | F | P |
| 13 | G |  |
| 14 | H |  |
| 15 |  |  |

## Parallel Speedup

- Define $\operatorname{Speedup}(P)=T_{1} / T_{P}$
-Factor by which P processors speeds up execution time relative to 1 processor, for fixed input size
-For ideal executions without overhead, 1 <= Speedup(P) <= P
-You see this with abstract metrics, but bounds may not hold when measuring real execution times with real overheads
-Linear speedup
- When Speedup $(P)=k^{*} P$, for some constant $k, 0<k<1$
- ddeal Parallelism = WORK / CPL $=\mathrm{T}_{1} / \mathrm{T}_{\infty}$
= Parallel Speedup on an unbounded (infinite) number of processors


## Computation Graph for Recursive Tree approach to computing Array Sum in parallel



Assume greedy schedule, input array size $S$ is a power of 2 , each add takes 1 time unit

- $\operatorname{WORK}(\mathrm{G})=\mathrm{S}-1$, and $\mathrm{CPL}(\mathrm{G})=\log 2(\mathrm{~S})$
- Define $T(S, P)$ = parallel execution time for Array Sum with size $S$ on $P$ processors
- Use upper bound $\mathrm{T}(\mathrm{S}, \mathrm{P})<=\operatorname{WORK}(\mathrm{G}) / \mathrm{P}+\mathrm{CPL}(\mathrm{G})$ as a worst-case estimate
$T(S, P)=\operatorname{WORK}(G) / P+\operatorname{CPL}(G)=(S-1) / P+\log 2(S) \Rightarrow S p e e d u p(S, P)=T(S, 1) / T(S, P)=(S-1) /((S-1) / P+\log 2(S))$


## How many processors should we use?

Define Efficiency $(P)=\operatorname{Speedup}(P) / P=T_{1} /\left(P * T_{P}\right)$
-Processor efficiency --- figure of merit that indicates how well a parallel program uses available processors
-For ideal executions without overhead, 1/P <= Efficiency $(P)<=1$
-Efficiency $(P)=1(100 \%)$ is the best we can hope for

## How many processors should we use?

What should be the minimum efficiency to determine how many processors we should use?

## How many processors should we use?

- Common goal: choose number $P$ for a given input size, $S$, so that efficiency is at least $0.5(50 \%)$
- Half-performance metric
$-S_{1 / 2}=$ input size that achieves Efficiency $(P)=0.5$ for a given $P$
-Figure of merit that indicates how large an input size is needed to obtain efficient parallelism -A larger value of $\mathrm{S}_{1 / 2}$ indicates that the problem is harder to parallelize efficiently


## Array Sum: Speedup as a function of array size S and number of processors P

- Speedup $(S, P)=T(S, 1) / T(S, P)=(S-1) /\left((S-1) / P+\log _{2}(S)\right)$
- Asymptotically, Speedup(S,P) $\rightarrow(\mathrm{S}-1) / \log _{2} S$, as $\mathrm{P} \rightarrow$ infinity



## Amdahl's Law

If $\mathrm{q} \leq 1$ is the fraction of WORK in a parallel program that must be executed sequentially for a given input size $S$, then the best speedup that can be obtained for that program is $\operatorname{Speedup}(S, P) \leq 1 / q$.

## Amdahl's Law

- Observation follows directly from critical path length lower bound on parallel execution time
$-\mathrm{CPL}>=\mathrm{q}^{*} \mathrm{~T}(\mathrm{~S}, 1)$
$-T(S, P)>=q^{*} T(S, 1)$
- Speedup $(S, P)=T(S, 1) / T(S, P)<=1 / q$
- Upper bound on speedup simplistically assumes that work can be divided into sequential and parallel portions
-Sequential portion of WORK = q
- also denoted as $\mathrm{f}_{\mathrm{s}}$ (fraction of sequential work)
-Parallel portion of WORK $=1-q$
- also denoted as $f_{p}$ (fraction of parallel work)


## Illustration of Amdahl's Law: Best Case Speedup as function of Parallel Portion



## Announcements \& Reminders

- No lab tomorrow
- Lab \#1 needs to get checked off or committed and pushed by 11:59pm
- Quiz \#1 available today, due Friday, Feb. 5th at 11:59pm
- HW \#1 due on Wednesday, Feb 10th at 11:59pm
- IMPORTANT: Watch video \& read handout for topic 2.1 for lecture on Wednesday

