Part 2: Fault-Tolerance
Distributed Systems 2011

Roger Wattenhofer
Again, why are we studying distributed systems?

• First, and most importantly: The world is distributed!
  – Companies with offices around the world
  – Computer networks, in particular the Internet

• Performance
  – Parallel high performance computing
  – Multi-core machines

• Fault-Tolerance
  – Availability
  – Reliability
Overview Part 2

• **Lecture (Monday 9-11 & Friday 9-10)**
  – It’s all about fault-tolerance
  – First theory, in particular consensus, models, algorithms, and lower bounds
  – Then large-scale practice, fault-tolerant systems
  – Finally small-scale practice, programming, multi-core

• **Exercises (Monday 11-12 & Friday 10-12)**
  – There will be paper exercises
  – Exercises don’t have to be handed in...
    ...but you are strongly encouraged to solve them!
  – There will be no grading, but there will be “Testat Exercises”

• **Personnel**
  – Roger Wattenhofer, Barbara Keller, Samuel Welten, etc.
  – www.disco.ethz.ch
Book for Part 2

- Great book
- Goes beyond class
- Fully covers Chapter 3
- Does not cover everything we do (but also some parts of Chapters 1 & 2)

- Some pictures on slides are from Maurice Herlihy

(Thanks, Maurice!)
Books for Chapters 6 & 7

- Great book
- Goes beyond class
- Does not cover everything we do (but also some of the other parts)
- Some pictures on slides are from Maurice Herlihy.
  (Thanks, Maurice!)
Moore’s Law: A Slide You’ll See in Almost Every CS Lecture...

Intel CPU Trends
(sources: Intel, Wikipedia, K. Olukotun)

- Transistor count still rising
- Clock speed flattening sharply
- Advent of multi-core processors!
Theory: Consensus
Part 2, Chapter 1

Roger Wattenhofer
Overview

- Introduction
- Consensus #1: Shared Memory
- Consensus #2: Wait-free Shared Memory
- Consensus #3: Read-Modify-Write Shared Memory
- Consensus #4: Synchronous Systems
- Consensus #5: Byzantine Failures
- Consensus #6: A Simple Algorithm for Byzantine Agreement
- Consensus #7: The Queen Algorithm
- Consensus #8: The King Algorithm
- Consensus #9: Byzantine Agreement Using Authentication
- Consensus #10: A Randomized Algorithm
- Shared Coin
From Single-Core to Multicore Computers

Desktop Computer: Single core

Server architecture: The Shared Memory Multiprocessor (SMP)

All cores on the same chip
Concurrent Computation

multiple threads (processes)

shared memory

object

object
Fault Tolerance & Asynchrony

- What about fault-tolerance?
  - Even if processes do not die, there are “near-death experiences”
- Sudden unpredictable delays:
  - Cache misses (short)
  - Page faults (long)
  - Scheduling quantum used up (really long)
Road Map

• In this first part, we are going to focus on principles
  – Start with idealized models
  – Look at a simplistic problem
  – Emphasize correctness over pragmatism
  – “Correctness may be theoretical, but incorrectness has practical impact”

I’m no theory weenie! Why all the theorems and proofs?

• Distributed systems are hard
  – Failures
  – Concurrency

• Easier to go from theory to practice than vice-versa
The Two Generals

- Red army wins if both sides attack simultaneously
- Red army can communicate by sending messages...
Problem: Unreliable Communication

- ... such as “lets attack tomorrow at 6am” ...
- ... but messages do not always make it!
- Task: Design a “red army protocol” that works despite message failures!
Sie machen jetzt am Freitag, 08:15 die Vorlesung Verteilte Systeme, wie vereinbart. OK? (Ich bin jedenfalls am Freitag auch gar nicht da.) Ich übernehme das dann wieder nach den Weihnachtsferien.
Date: Mi 11.12.2002 12:34
From: Roger Wattenhofer <wattenhofer@inf.ethz.ch>
To: Friedemann Mattern <mattern@inf.ethz.ch>
Subject: Re: Vorlesung

OK. Aber ich gehe nur, wenn sie diese Email nochmals bestätigen... :-}
Das dachte ich mir fast. Ich bin Praktiker und mache es schlauer: Ich gehe nicht, unabhangig davon, ob Sie diese email bestaetigen (beziehungsweise rechtzeitig erhalten). (:-)
Date: Mi 11.12.2002 13:01
From: Roger Wattenhofer <wattenhofer@inf.ethz.ch>
To: Friedemann Mattern <mattern@inf.ethz.ch>
Subject: Re: Naechste Runde: Re: Vorlesung ...

Ich glaube, jetzt sind wir so weit, dass ich diese Emails in der Vorlesung auflegen werde...
Kein Problem. (Hauptsache es kommt raus, dass der Prakiker am Ende der schlauer ist... Und der Theoretiker entweder heute noch auf das allerletzte Ack wartet oder wissend das das ja gar nicht gehen kann alles gleich von vornherein bleiben laesst... (:-))
Theorem

There is no non-trivial protocol that ensures that the red armies attack simultaneously

Proof:

1. Consider the protocol that sends the fewest messages
2. It still works if the last message is lost
3. So just don’t send it (messengers’ union happy!)
4. But now we have a shorter protocol!
5. Contradicting #1

Fundamental limitation: We need an unbounded number of messages, otherwise it is possible that no attack takes place!
Consensus Definition: Each Thread has a Private Input
Consensus Definition: The Threads Communicate
Consensus Definition: They Agree on Some Thread’s Input
Consensus is Important

• With consensus, you can implement anything you can imagine...

• Examples:
  – With consensus you can decide on a leader,
  – implement mutual exclusion,
  – or solve the two generals problem
  – and much more...

• We will see that in some models, consensus is possible, in some other models, it is not

• The goal is to learn whether for a given model consensus is possible or not ...
  ... and prove it!
Consensus #1: Shared Memory

- $n > 1$ processors
- Shared memory is memory that may be accessed simultaneously by multiple threads/processes.
- Processors can atomically read or write (not both) a shared memory cell

Protocol:

- There is a designated memory cell $c$.
- Initially $c$ is in a special state “?”
- Processor 1 writes its value $v_1$ into $c$, then decides on $v_1$.
- A processor $j \neq 1$ reads $c$ until $j$ reads something else than “?” and then decides on that.

- Problems with this approach?
Unexpected Delay
Heterogeneous Architectures

Pentium

Pentium

yawn

286
Fault-Tolerance
Computability

• Definition of computability
  – Computable usually means Turing-computable, i.e., the given problem can be solved using a Turing machine
  – Strong mathematical model!

• Shared-memory computability
  – Model of asynchronous concurrent computation
  – Computable means it is wait-free computable on a multiprocessor
  – Wait-free...?
Consensus #2: Wait-free Shared Memory

• $n > 1$ processors
• Processors can atomically \textit{read or write} (not both) a shared memory cell
• Processors might crash (stop... or become very slow...)

\textbf{Wait-free implementation:}

• Every process (method call) completes in a finite number of steps
• Implies that locks cannot be used $\Rightarrow$ The thread holding the lock may crash and no other thread can make progress
• We assume that we have wait-free atomic registers (that is, reads and writes to same register do not overlap)
A Wait-free Algorithm

- There is a cell $c$, initially $c=\text{"?"}$
- Every processor $i$ does the following:

```plaintext
r = Read(c);
if (r == "?") then
    Write(c, v_i); decide v_i;
else
    decide r;
```

- Is this algorithm correct...?
An Execution

Atomic read/write register

Time

Cell c

32

17
Execution Tree

Initial state

32/32

32/?

write

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Theorem

There is no wait-free consensus algorithm using read/write atomic registers
Proof

• Make it simple
  – There are only two threads A and B and the input is binary
• Assume that there is a protocol
• In this protocol, either A or B “moves” in each step
• Moving means
  – Register read
  – Register write
Execution Tree (of abstract but “correct” algorithm)

Initial state

Critical (univalent with the next step)

Final states (decision values)
Bivalent vs. Univalent

- Wait-free computation is a tree
- Bivalent system states
  - Outcome is not fixed
- Univalent states
  - Outcome is fixed
  - Maybe not “known” yet
  - 1-valent and 0-valent states

- Claim
  - Some initial system state is bivalent
  - This means that the outcome is not always fixed from the start
Proof of Claim: A 0-Valent Initial State

- All executions lead to the decision 0

- Solo executions also lead to the decision 0

Similarly, the decision is always 1 if both threads start with 1!
Proof of Claim: Indistinguishable Situations

• These two situations are indistinguishable $\rightarrow$ The outcome must be the same

0
0

The decision is 0!

0
1

The decision is 0!

Similarly, the decision is 1 if the red thread crashed!
Proof of Claim: A Bivalent Initial State

This state is bivalent!
Critical States

- Starting from a bivalent initial state
- The protocol must reach a critical state
  - Otherwise we could stay bivalent forever
  - And the protocol is not wait-free
- The goal is now to show that the system can always remain bivalent

A state is critical if the next state is univalent
• The system can remain bivalent forever if there is always an action that prevents the system from reaching a critical state:
Model Dependency

• So far, everything was memory-independent!

• True for
  – Registers
  – Message-passing
  – Carrier pigeons
  – Any kind of asynchronous computation

• Threads
  – Perform reads and/or writes
  – To the same or different registers
  – Possible interactions?
## Possible Interactions

<table>
<thead>
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<th>x.read()</th>
<th>y.read()</th>
<th>x.write()</th>
<th>y.write()</th>
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Reading Registers

A runs solo, decides

0 1

B reads x

A runs solo, decides

States look the same to A

\[ x = c \]
## Possible Interactions

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Writing Distinct Registers

A writes $y$

States look the same to A

B writes $x$

A writes $y$

B writes $x$

States look the same to A
Possible Interactions

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Writing Same Registers

A writes x

0

1

B writes x

A runs solo, decides

A runs solo, decides

States look the same to A

C
That’s All, Folks!

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What Does Consensus have to do with Distributed Systems?

• We want to build a concurrent FIFO Queue with multiple dequeuers
A Consensus Protocol

• Assume we have such a FIFO queue and a 2-element array
A Consensus Protocol

- Thread $i$ writes its value into the array at position $i$
A Consensus Protocol

- Then, the thread takes the next element from the queue
A Consensus Protocol

I got the coveted red ball, so I will decide my value.

I got the dreaded black ball, so I will decide the other’s value from the array.
A Consensus Protocol

**Why does this work?**

- If one thread gets the red ball, then the other gets the black ball
- Winner can take its own value
- Loser can find winner’s value in array
  - Because threads write array before dequeuing from queue

**Implication**

- We can solve 2-thread consensus using only
  - A two-dequeuer queue
  - Atomic registers
Implications

• Assume there exists
  – A queue implementation from atomic registers
• Given
  – A consensus protocol from queue and registers
• Substitution yields
  – A wait-free consensus protocol from atomic registers

Corollary

• It is impossible to implement a two-dequeuer wait-free FIFO queue with read/write shared memory.
• This was a proof by reduction; important beyond NP-completeness...
Consensus #3: Read-Modify-Write Shared Memory

- $n > 1$ processors
- Wait-free implementation
- Processors can atomically read \textit{and} write a shared memory cell in one atomic step: the value written can depend on the value read
- We call this a read-modify-write (RMW) register
- Can we solve consensus using a RMW register...?
Consensus Protocol Using a RMW Register

- There is a cell $c$, initially $c=\text{"\text{"}}$
- Every processor $i$ does the following

```plaintext
if (c == "\text{"}) then
  write(c, v_i); decide v_i
else
  decide c;
```

atomic step
Discussion

- Protocol works correctly
  - One processor accesses c first; this processor will determine decision
- Protocol is wait-free
- RMW is quite a strong primitive
  - Can we achieve the same with a weaker primitive?
Read-Modify-Write More Formally

• Method takes 2 arguments:
  – Cell $c$
  – Function $f$

• Method call:
  – Replaces value $x$ of cell $c$ with $f(x)$
  – Returns value $x$ of cell $c$
public class RMW {
    private int value;

    public synchronized int rmw(function f) {
        int prior = this.value;
        this.value = f(this.value);
        return prior;
    }
}

Read-Modify-Write

- Return prior value
- Apply function
Read-Modify-Write: Read

```java
public class RMW {
    private int value;

    public synchronized int read() {
        int prior = this.value;
        this.value = this.value;
        return prior;
    }
}
```
public class RMW {
    private int value;

    public synchronized int TAS() {
        int prior = this.value;
        this.value = 1;
        return prior;
    }
}

Constant function
public class RMW {
    private int value;

    public synchronized int FAI() {
        int prior = this.value;
        this.value = this.value + 1;
        return prior;
    }
}

Increment function
public class RMW {
  private int value;

  public synchronized int FAA(int x) {
    int prior = this.value;
    this.value = this.value + x;
    return prior;
  }
}

Addition function
public class RMW {
    private int value;

    public synchronized int swap(int x) {
        int prior = this.value;
        this.value = x;
        return prior;
    }
}

Old value
public class RMW {
    private int value;

    public synchronized int CAS(int old, int new) {
        int prior = this.value;
        if (this.value == old) {
            this.value = new;
        }
        return prior;
    }
}

“Complex” function
Definition of Consensus Number

• An object has **consensus number** \( n \)
  – If it can be used
    – Together with atomic read/write registers
    – To implement \( n \)-thread consensus, but not \( (n+1) \)-thread consensus

• Example: Atomic read/write registers have consensus number 1
  – Works with 1 process
  – We have shown impossibility with 2
Consensus Number Theorem

- Consensus numbers are a useful way of measuring synchronization power
- An alternative formulation:
  - If $X$ has consensus number $c$
  - And $Y$ has consensus number $d < c$
  - Then there is no way to construct a wait-free implementation of $X$ by $Y$
- This theorem will be very useful
  - Unforeseen practical implications!

Theorem

If you can implement $X$ from $Y$ and $X$ has consensus number $c$, then $Y$ has consensus number at least $c$. 
Theorem

- A RMW is *non-trivial* if there exists a value \( v \) such that \( v \neq f(v) \)
  - Test&Set, Fetch&Inc, Fetch&Add, Swap, Compare&Swap, general RMW...
  - But not read

Any non-trivial RMW object has consensus number at least 2

- Implies no wait-free implementation of RMW registers from read/write registers
- Hardware RMW instructions not just a convenience
Proof

- A two-thread consensus protocol using any non-trivial RMW object:

```java
public class RMWConsensusFor2 implements Consensus{
    private RMW r; // Initialized to v

    public Object decide() {
        int i = Thread.myIndex();
        if(r.rmw(f) == v) {
            return this.announce[i];
        } else {
            return this.announce[1-i];
        }
    }
}
```
Interfering RMW

• Let $F$ be a set of functions such that for all $f_i$ and $f_j$, either
  – They commute: $f_i(f_j(x)) = f_j(f_i(x))$
  – They overwrite: $f_i(f_j(x)) = f_i(x)$

• Claim: Any such set of RMW objects has consensus number exactly 2

Examples:

• Overwrite
  – Test&Set, Swap
• Commute
  – Fetch&Inc
Proof

- There are three threads, A, B, and C
- Consider a critical state c:
Proof: Maybe the Functions Commute

A applies $f_A$

B applies $f_B$

C runs solo

0-valent

1-valent
Proof: Maybe the Functions Commute

These states look the same to C

A applies $f_A$

B applies $f_B$

C runs solo

0-valent

1-valent
Proof: Maybe the Functions Overwrite

C runs solo

A applies $f_A$

B applies $f_B$

0-valent

1-valent
Proof: Maybe the Functions Overwrite

These states look the same to C

A applies \( f_A \)

B applies \( f_B \)

C runs solo

A applies \( f_A \)

C runs solo

0-valent

1-valent
Impact

- Many early machines used these “weak” RMW instructions
  - Test&Set (IBM 360)
  - Fetch&Add (NYU Ultracomputer)
  - Swap

- We now understand their limitations
public class RMWConsensus implements Consensus {
    private RMW r;

    public Object decide() {
        int i = Thread.myIndex();
        int j = r.CAS(-1,i);

        if(j == -1) {
            return this.announce[i];
        } else {
            return this.announce[j];
        }
    }
}
The Consensus Hierarchy

1. Read/Write Registers
2. Test&Set
   - Fetch&Inc
   - Fetch&Add
   - Swap
...∞
   - CAS
   - LL/SC
Consensus #4: Synchronous Systems

- One can sometimes tell if a processor had crashed
  - Timeouts
  - Broken TCP connections
- Can one solve consensus at least in synchronous systems?
- Model
  - All communication occurs in synchronous rounds
  - Complete communication graph
Crash Failures

- Broadcast: Send a Message to All Processes in One Round
  - At the end of the round everybody receives the message $a$
  - Every process can broadcast a value in each round

- Crash Failures: A broadcast can fail if a process crashes
  - Some of the messages may be lost, i.e., they are never received

![Diagram showing a network of processes with messages being broadcast. Process $p_1$ is faulty and messages are lost in one round.](image)
After a Failure, the Process Disappears from the Network

Round 1  Round 2  Round 3  Round 4  Round 5

\[ p_1 \quad p_1 \quad p_1 \quad p_1 \quad p_1 \]

\[ p_2 \quad p_2 \quad p_2 \quad p_2 \quad p_2 \]

\[ p_3 \quad p_3 \quad p_3 \quad p_3 \quad p_3 \]

\[ p_4 \quad p_4 \quad p_4 \quad p_4 \quad p_4 \]

\[ p_5 \quad p_5 \quad p_5 \quad p_5 \quad p_5 \]

Failure
Consensus Repetition

- Everybody has an initial value
- Everybody must decide on the same value

Validity condition:
If everybody starts with the same value, they must decide on that value
A Simple Consensus Algorithm

Each process:

1. Broadcast own value

2. Decide on the minimum of all received values

Note that only one round is needed!
Execution Without Failures

- Broadcast values and decide on minimum \( \rightarrow \) Consensus!
- Validity condition is satisfied: If everybody starts with the same initial value, everybody sticks to that value (minimum)
Execution With Failures

- The failed processor doesn’t broadcast its value to all processors
- Decide on minimum → No consensus!
**f-resilient Consensus Algorithm**

- If an algorithm solves consensus for f failed processes, we say it is *f*-resilient consensus algorithm
- Example: The input and output of a 3-resilient consensus algorithm:

  - **Start**
    - Processes: 0, 1, 2, 3, 4
    - Values: 1, 1, 1, 1, 1

  - **Finish**
    - Processes: 0, 1, 2, 3, 4
    - Values: 1, 1, 1, 1, 1

- **Refined validity condition:**
  All processes decide on a value that is available initially
An $f$-resilient Consensus Algorithm

Each process:

**Round 1:**
Broadcast own value

**Round 2 to round $f+1$:**
Broadcast all newly received values

**End of round $f+1$:**
Decide on the minimum value received
An $f$-resilient Consensus Algorithm

- Example: $f=2$ failures, $f+1 = 3$ rounds needed
An $f$-resilient Consensus Algorithm

- Round 1: Broadcast all values to everybody

![Diagram showing a network with nodes labeled 0, 1, 2, 3, 4 and arrows indicating communication. Node 0 is marked as having failed.]
An $f$-resilient Consensus Algorithm

- Round 2: Broadcast all new values to everybody
An $f$-resilient Consensus Algorithm

- Round 3: Broadcast all new values to everybody
An $f$-resilient Consensus Algorithm

- Decide on minimum $\rightarrow$ Consensus!

![Diagram showing a consensus algorithm with nodes and edges representing different states and transitions. The diagram includes two failure states labeled Failure 1 and Failure 2.]
Analysis

- If there are $f$ failures and $f+1$ rounds, then there is a round with no failed process.
- Example: 5 failures, 6 rounds:

```
1  2  3  4  5  6
```

No failure
Analysis

- At the end of the round with no failure
  - Every (non faulty) process knows about all the values of all the other participating processes
  - This knowledge doesn’t change until the end of the algorithm
- Therefore, everybody will decide on the same value
- However, as we don’t know the exact position of this round, we have to let the algorithm execute for $f+1$ rounds

- Validity: When all processes start with the same input value, then consensus is that value
Theorem

Any $f$-resilient consensus algorithm requires at least $f+1$ rounds

Proof sketch:

- Assume for contradiction that $f$ or less rounds are enough
- Worst-case scenario: There is a process that fails in each round

Note that this is not a formal proof!
Worst-case Scenario

Before process $p_i$ fails, it sends its value $a$ only to one process $p_k$.

Before process $p_k$ fails, it sends its value $a$ to only one process $p_m$. 
Worst-case Scenario

- At the end of round $f$ only one process $p_n$ knows about value $a$
Worst-case Scenario

<table>
<thead>
<tr>
<th>Round</th>
<th>1</th>
<th>2</th>
<th>3</th>
<th>(f)</th>
<th>decide</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
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</tr>
</tbody>
</table>

- Process \(p_n\) may decide on \(a\) and all other processes may decide on another value \(b\).
- Therefore \(f\) rounds are not enough \(\Rightarrow\) At least \(f+1\) rounds are needed.
Arbitrary Behavior

- The assumption that processes crash and stop forever is sometimes too optimistic.
- Maybe the processes fail and recover:
- Probably not...
- Are you there?
- Maybe the processes are damaged:
- ???
- Are you there?
- Time

```c
a!
```

```c
b!
```
Consensus #5: Byzantine Failures

- Different processes may receive different values
- A Byzantine process can behave like a crash-failed process
After a Failure, the Process Remains in the Network
Consensus with Byzantine Failures

• Again: If an algorithm solves consensus for $f$ failed processes, we say it is an $f$-resilient consensus algorithm

• Validity condition: If all non-faulty processes start with the same value, then all non-faulty processes decide on that value
  – Note that in general this validity condition does not guarantee that the final value is an input value of a non-Byzantine process
  – However, if the input is binary, then the validity condition ensures that processes decide on a value that at least one non-Byzantine process had initially

• Obviously, any $f$-resilient consensus algorithm requires at least $f+1$ rounds (follows from the crash failure lower bound)

• How large can $f$ be...? Can we reach consensus as long as the majority of processes is correct (non-Byzantine)?
Theorem

There is no $f$-resilient algorithm for $n$ processes, where $f \geq n/3$

Proof outline:

- First, we prove the 3 processes case
- The general case can be proved by reducing it to the 3 processes case
The 3 Processes Case

Lemma

There is no 1-resilient algorithm for 3 processes

Proof:

- Intuition:
- Process A may also receive information from C about B’s messages to C
- Process A may receive conflicting information about B from C and about C from B (the same for C!)
- It is impossible for A and C to decide which information to base their decision on!
Proof

- Assume that both A and C have input 0. If they decided 1, they could violate the validity condition → A and C must decide 0 independent of what B says.
- Similarly, A and C must decide 1 if their inputs are 1.
- We see that the processes must base their decision on the majority vote.

- If A’s input is 0 and B tells A that its input is 0 → A decides 0.
- If C’s input is 1 and B tells C that its input is 1 → C decides 1.
The General Case

- Assume for contradiction that there is an $f$-resilient algorithm $A$ for $n$ processes, where $f \geq n/3$
- We use this algorithm to solve the consensus algorithm for 3 processes where one process is Byzantine!
- If $n$ is not evenly divisible by 3, we increase it by 1 or 2 to ensure that $n$ is a multiple of 3
- We let each of the three processes simulate $n/3$ processes
The General Case

• One of the 3 processes is Byzantine $\rightarrow$ Its $n/3$ simulated processes may all behave like Byzantine processes

• Since algorithm A tolerates $n/3$ Byzantine failures, it can still reach consensus $\rightarrow$ We solved the consensus problem for three processes!
Consensus #6: A Simple Algorithm for Byzantine Agreement

- Can the processes reach consensus if $n > 3f$?
- A simpler question: Can the processes reach consensus if $n=4$ and $f=1$?
- The answer is yes. It takes two rounds:

Round 1: Exchange all values

Round 2: Exchange the received info

(matrix: one column for each original value, one row for each neighbor)
A Simple Algorithm for Byzantine Agreement

- After the second round each node has received 12 values, 3 for each of the 4 input values (columns). If at least 2 of 3 values of a column are equal, this value is accepted. If all 3 values are different, the value is discarded.
- The node then decides on the minimum accepted value.

Consensus!
A Simple Algorithm for Byzantine Agreement

- Does this algorithm still work in general for any $f$ and $n > 3f$?
- The answer is no. Try $f=2$ and $n=7$:

Round 1: Exchange all values

Round 2: Exchange the received info

- The problem is that q can say different things about what p sent to q!
- What is the solution to this problem?
A Simple Algorithm for Byzantine Agreement

• The solution is simple: Again exchange all information!
• This way, the processes learn that a majority thinks that q gave inconsistent information about p \(\rightarrow\) q can be excluded, and also p if it also gave inconsistent information (about q).
• If \(f=2\) and \(n > 6\), consensus can be reached in 3 rounds!
• In fact, the algorithm

Exchange all information for \(f+1\) rounds
Ignore all processes that provided inconsistent information
Let all processes decide based on the same input

solves the problem for any \(f\) and any \(n > 3f\)
A Simple Algorithm for Byzantine Agreement: Summary

- The proposed algorithm has several advantages:
  + It works for any $f$ and $n > 3f$, which is optimal
  + It only takes $f+1$ rounds. This is even optimal for crash failures!
  + It works for any input and not just binary input

- However, it has a considerable disadvantage:
  - The size of the messages increases exponentially! This is a severe problem
    It is worth studying whether it is possible to solve the problem with small(er) messages
Consensus #7: The Queen Algorithm

- The Queen algorithm is a simple Byzantine agreement algorithm that uses small messages.
- The Queen algorithm solves consensus with $n$ processes and $f$ failures where $f < n/4$ in $f+1$ phases.

Idea:

- There is a different (a priori known) queen in each phase.
- Since there are $f+1$ phases, in one phase the queen is not Byzantine.
- Make sure that in this round all processes choose the same value and that in future rounds the processes do not change their values anymore.

A phase consists of 2 rounds.
The Queen Algorithm

In each phase \( i \in \{1 \ldots f+1\} \):

**Round 1:**
- Broadcast own value
- Set own value to the value that was received most often
- If own value appears \( > \frac{n}{2} + f \) times, support this value
- Else, do not support any value

**Round 2:**
- The queen broadcasts its value
- If not supporting any value, set own value to the queen’s value

At the end of phase \( f+1 \), decide on own value
Also send own value to oneself
If several values have the same (highest) frequency, choose any value, e.g., the smallest
The Queen Algorithm: Example

- Example: $n = 6, f=1$
- Phase 1, round 1 (All broadcast):

No process supports a value

Majority value
The Queen Algorithm: Example

- Phase 1, round 2 (Queen broadcasts): All processes choose the queen’s value.
The Queen Algorithm: Example

- Phase 2, round 1 (All broadcast)

No process supports a value
The Queen Algorithm: Example

- Phase 2, round 2 (Queen broadcasts):

```
| 0 | 0 | 0 | 0 |
```

All processes choose the queen’s value

Consensus!
The Queen Algorithm: Analysis

• After the phase where the queen is correct, all correct processes have the same value
  – If all processes change their values to the queen’s value, obviously all values are the same
  – If some process does not change its value to the queen’s value, it received a value \( > \frac{n}{2} + f \) times \( \rightarrow \) All other correct processes (including the queen) received this value \( > \frac{n}{2} \) times and thus all correct processes share this value

• In all future phases, no process changes its value
  – In the first round of such a phase, processes receive their own value from at least \( n-f > \frac{n}{2} \) processes and thus do not change it
  – The processes do not accept the queen’s proposal if it differs from their own value in the second round because the processes received their own value at least \( n-f > \frac{n}{2} + f \) times. Thus, all correct processes support the same value

That’s why we need \( f < \frac{n}{4} \)!
The Queen Algorithm: Summary

• The Queen algorithm has several advantages:
  + The messages are small: processes only exchange their current values
  + It works for any input and not just binary input

• However, it also has some disadvantages:
  - The algorithm requires $f+1$ phases consisting of 2 rounds each
    This is twice as much as an optimal algorithm
  - It only works with $f < n/4$ Byzantine processes!
    Is it possible to get an algorithm that works with $f < n/3$ Byzantine processes and uses small messages?
Consensus #8: The King Algorithm

• The King algorithm is an algorithm that tolerates $f < n/3$ Byzantine failures and uses small messages
• The King algorithm also takes $f+1$ phases

Idea:

• The basic idea is the same as in the Queen algorithm
• There is a different (a priori known) king in each phase
• Since there are $f+1$ phases, in one phase the king is not Byzantine
• The difference to the Queen algorithm is that the correct processes only propose a value if many processes have this value, and a value is only accepted if many processes propose this value
The King Algorithm

In each phase $i \in 1...f+1$:

**Round 1:**
Broadcast own value

**Round 2:**
If some value $x$ appears $\geq n-f$ times
   Broadcast “Propose $x$”
If some proposal received $> f$ times
   Set own value to this proposal

**Round 3:**
The king broadcasts its value
If own value received $< n-f$ proposals
   Set own value to the king’s value

At the end of phase $f+1$, decide on own value
Also send own value to oneself
The King Algorithm: Example

- Example: $n = 4$, $f=1$
- Phase 1:

0,0,1,1

1

0,1,1,1

1

0

0,0,1,1

0

1

1

1

1

1

"Propose 1"

2 propose 1

1*

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The King Algorithm: Example

- Example: $n = 4, f=1$
- Phase 2:

0,0,1,1

0,1,1,1

2 propose 1

2 propose 1

3 propose 1

0* = “Propose 0”

1* = “Propose 1”

Consensus!

I take the king’s value!

I keep my own value!
The King Algorithm: Analysis

- Observation: If some correct process proposes $x$, then no other correct process proposes $y \neq x$
  - Both processes would have to receive $\geq n-f$ times the same value, i.e., both processes received their value from $\geq n-2f$ distinct correct processes
  - In total, there must be $\geq 2(n-2f) + f > n$ processes, a contradiction!

- The validity condition is satisfied
  - If all correct processes start with the same value, all correct processes receive this value $\geq n-f$ times and propose it
  - All correct processes receive $\geq n-f$ times proposals, i.e., no correct process will ever change its value to the king’s value

We used that $f < n/3!$
The King Algorithm: Analysis

• After the phase where the king is correct, all correct processes have the same value
  – If all processes change their values to the king’s value, obviously all values are the same
  – If some process does not change its value to the king’s value, it received a proposal $\geq n-f$ times $\Rightarrow \geq n-2f$ correct processes broadcast this proposal and all correct processes receive it $\geq n-2f > f$ times $\Rightarrow$ All correct processes set their value to the proposed value. Note that only one value can be proposed $> f$ times, which follows from the observation on the previous slide

• In all future phases, no process changes its value
  – This follows immediately from the fact that all correct processes have the same value after the phase where the king is correct and the validity condition
The King Algorithm: Summary

- The King algorithm has several advantages:
  + It works for any $f$ and $n > 3f$, which is optimal
  + The messages are small: processes only exchange their current values
  + It works for any input and not just binary input

- However, it also has a disadvantage:
  - The algorithm requires $f+1$ phases consisting of 3 rounds each
    This is three times as much as an optimal algorithm
  Is it possible to get an algorithm that uses small messages and requires fewer rounds of communication?
Consensus #9: Byzantine Agreement Using Authentication

• A simple way to reach consensus is to use authenticated messages

• Unforgeability condition: If a process never sends a message m, then no correct process ever accepts m

• Why is this condition helpful?
  – A Byzantine process cannot convince a correct process that some other correct processes voted for a certain value if they did not!

• Idea:

• There is a designated process P. The goal is to decide on P’s value
• For the sake of simplicity, we assume a binary input. The default value is 0, i.e., if P cannot convince the processes that P’s input is 1, everybody chooses 0
Byzantine Agreement Using Authentication

If I am P and own input is 1
  value := 1
  broadcast “P has 1”
else
  value := 0

In each round $r \in 1...f+1$:

If value = 0 and accepted $r$ messages “P has 1” in total including a message from P itself
  value := 1
  broadcast “P has 1” plus the $r$ accepted messages that caused the local value to be set to 1

After $f+1$ rounds:

Decide value

In total $r+1$ authenticated “P has 1” messages
Byzantine Agreement Using Authentication: Analysis

- Assume that P is correct
  - P’s input is 1: All correct processes accept P’s message in round 1 and set value to 1. No process ever changes its value back to 0
  - P’s input is 0: P never sends a message “P has 1”, thus no correct process ever sets its value to 1
- Assume that P is Byzantine
  - P tries to convince some correct processes that its input is 1
  - Assume that a correct process p sets its value to 1 in a round $r < f+1$: Process p has accepted $r$ messages including the message from P. Therefore, all other correct processes accept the same $r$ messages plus p’s message and set their values to 1 as well in round $r+1$
  - Assume that a correct process p sets its value to 1 in round $f+1$: In this case, p accepted $f+1$ messages. At least one of those is sent by a correct process, which must have set its value to 1 in an earlier round. We are again in the previous case, i.e., all correct processes decide 1!
Byzantine Agreement Using Authentication: Summary

- Using authenticated messages has several advantages:
  + It works for any number of Byzantine processes!
  + It only takes $f+1$ rounds, which is optimal
  + Small messages: processes send at most $f+1$ “short” messages to all other processes in a single round

- However, it also has some disadvantages:
  - If P is Byzantine, the processes may agree on a value that is not in the original input
  - It only works for binary input
  - The algorithm requires authenticated messages...
Byzantine Agreement Using Authentication: Improvements

• Can we modify the algorithm so that it satisfies the validity condition?
  – Yes! Run the algorithm in parallel for $2f+1$ “masters” $P$. Either 0 or 1 occurs at least $f+1$ times, i.e., at least one correct process had this value. Decide on this value!
  – Alas, this modified protocol only works if $f < n/2$

• Can we modify the algorithm so that it also works with an arbitrary input?
  – Yes! In fact, the algorithm does not have to be changed much
  – We won’t discuss this modification in class

• Can we get rid of the authentication?
  – Yes! Use consistent-broadcast. This technique is not discussed either
  – This modified protocol works if $f < n/3$, which is optimal
  – However, each round is split into two
    → The total number of rounds is $2f+2$
Consensus #10: A Randomized Algorithm

- So far we mainly tried to reach consensus in *synchronous* systems. The reason is that no deterministic algorithm can guarantee consensus even if only one process may crash.

- Can one solve consensus in *asynchronous* systems if we allow our algorithms to use randomization?

- The answer is yes!

- The basic idea of the algorithm is to push the initial value. If other processes do not follow, try to push one of the suggested values randomly.

- For the sake of simplicity, we assume that the input is binary and at most $f<n/9$ processes are Byzantine.
Randomized Algorithm

\[
x := \text{own input}; \ r = 0
\]
Broadcast \ proposal(x, r)

\textbf{In each round } r = 1, 2, \ldots:\

Wait for \( n-f \) proposals
If at least \( n-2f \) proposals have some value \( y \)
\[
x := y; \text{ decide on } y
\]
else if at least \( n-4f \) proposals have some value \( y \)
\[
x := y;
\]
else
\[
\text{choose } x \text{ randomly with } P[x=0] = P[x=1] = \frac{1}{2}
\]
Broadcast \ proposal(x, r)
If decided on a value \( \rightarrow \) stop
Randomized Algorithm: Analysis

- **Validity condition** (If all have the same input, all choose this value)
  - If all correct processes have the same initial value $x$, they will receive $n-2f$ proposals containing $x$ in the first round and they will decide on $x$

- **Agreement** (if the processes decide, they agree on the same value)
  - Assume that some correct process decides on $x$. This process must have received $x$ from $n-3f$ correct processes. Every other correct process must have received $x$ at least $n-4f$ times, i.e., all correct processes set their local value to $x$, and propose and decide on $x$ in the next round

The processes broadcast at the end of a phase to ensure that the processes that have already decided broadcast their value again!
Randomized Algorithm: Analysis

• Termination (all correct processes eventually decide)
  – If some processes do not set their local value randomly, they set their local value to the same value. Proof: Assume that some processes set their value to 0 and some others to 1, i.e., there are $\geq n-5f$ correct processes proposing 0 and $\geq n-5f$ correct processes proposing 1. In total there are $\geq 2(n-5f) + f > n$ processes. Contradiction!

  That’s why we need $f < n/9$!

  – Thus, in the worst case all $n-f$ correct processes need to choose the same bit randomly, which happens with probability $(\frac{1}{2})^{n-f}$
  – Hence, all correct processes eventually decide. The expected running time is smaller than $2^n$

• The running time is awfully slow. Is there a clever way to speed up the algorithm?
• What about simply setting $x:=1$?! (Why doesn’t it work?)
Can we do this faster?! Yes, with a Shared Coin

- A better idea is to replace

choose x randomly with $P[x=0] = P[x=1] = \frac{1}{2}$

with a subroutine in which all the processes compute
a so-called shared (a.k.a. common, “global”) coin

- A shared coin is a random binary variable that is 0
with constant probability, and 1 with constant probability

- For the sake of simplicity, we assume that
there are at most $f < \frac{n}{3}$ crash failures
(no Byzantine failures!!)

All correct processes know the outcome of
the shared coin toss after each execution
of the subroutine
Shared Coin Algorithm

**Code for process \(i\):**

Set local coin \(c_i := 0\) with probability \(1/n\), else \(c_i := 1\)

Broadcast \(c_i\)

Wait for exactly \(n-f\) coins and collect all coins in the local coin set \(s_i\)

Broadcast \(s_i\)

Wait for exactly \(n-f\) coin sets

If at least one coin is 0 among all coins in the coin sets

\[\text{return 0}\]

else

\[\text{return 1}\]

Assume the worst case:

Choose \(f\) so that \(3f+1 = n!\)
Shared Coin: Analysis

- Termination (of the subroutine)
  - All correct processes broadcast their coins. It follows that all correct processes receive at least $n-f$ coins
  - All correct processes broadcast their coin sets. It follows that all correct processes receive at least $n-f$ coin sets and the subroutine terminates

- We will now show that at least 1/3 of all coins are seen by everybody

- More precisely: We will show that at least $f+1$ coins are in at least $f+1$ coin sets
  - Recall that $f < n/3$
  - Since these coins are in at least $f+1$ coin sets and all processes receive $n-f$ coin sets, all correct processes see these coins!
Shared Coin: Analysis

- Proof that at least $f+1$ coins are in at least $f+1$ coin sets
  - Draw the coin sets and the contained coins as a matrix
  - Example: $n=7$, $f=2$

|x means coin $c_i$ is in set $s_j|
|---|---|---|---|---|
|    | $s_1$ | $s_3$ | $s_5$ | $s_6$ | $s_7$
| $c_1$ | X     | X     | X     | X     | X     |
| $c_2$     |       | X     | X     |       |       |
| $c_3$     | X     | X     | X     | X     | X     |
| $c_4$     |       | X     | X     |       | X     |
| $c_5$     | X     |       |       |       | X     |
| $c_6$     | X     |       |       | X     | X     |
| $c_7$     | X     | X     |       | X     | X     |
**Shared Coin: Analysis**

- At least \( f+1 \) rows (coins) have at least \( f+1 \) \( x \)'s (are in at least \( f+1 \) coin sets)
  - First, there are exactly \( (n-f)^2 \) \( x \)'s in this matrix
  - Assume that the statement is wrong: Then at most \( f \) rows may be full and contain \( n-f \) \( x \)'s. And all other rows (at most \( n-f \)) have at most \( f \) \( x \)'s
  - Thus, in total we have at most \( f(n-f)+(n-f)f = 2f(n-f) \) \( x \)'s
  - But \( 2f(n-f) < (n-f)^2 \) because \( 2f < n-f \)

Here we use \( 3f < n \)

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<th>( S_1 )</th>
<th>( S_3 )</th>
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Shared Coin: Theorem

**Theorem**

All processes decide 0 with constant probability, and all processes decide 1 with constant probability

**Proof:**

- With probability \((1-1/n)^n \approx 1/e \approx 0.37\) all processes choose 1. Thus, all correct processes return 1
- There are at least \(n/3\) coins seen by all correct processes. The probability that at least one of these coins is set to 0 is at least \(1-(1-1/n)^{n/3} \approx 1-(1/e)^{1/3} \approx 0.28\)
Back to Randomized Consensus

• If this shared coin subroutine is used, there is a constant probability that the processes agree on a value
• Some nodes may not want to perform the subroutine because they received the same value $x$ at least $n-4f$ times. However, there is also a constant probability that the result of the shared coin toss is $x$!
• Of course, all nodes must take part in the execution of the subroutine
• This randomized algorithm terminates in a constant number of rounds (in expectation)!
Randomized Algorithm: Summary

- The randomized algorithm has several advantages:
  + It only takes a constant number of rounds in expectation
  + It can handle crash failures even if communication is asynchronous

- However, it also has some disadvantages:
  - It works only if there are \( f < n/9 \) crash failures. It doesn’t work if there are Byzantine processes
  - It only works for binary input

- Can it be improved?
  - There is a constant expected time algorithm that tolerates \( f < n/2 \) crash failures
  - There is a constant expected time algorithm that tolerates \( f < n/3 \) Byzantine failures
Summary

• We have solved consensus in a variety of models
• In particular we have seen
  – algorithms
  – wrong algorithms
  – lower bounds
  – impossibility results
  – reductions
  – etc.

• In the next part, we will discuss fault-tolerance in practice
Credits

- The impossibility result (#2) is from Fischer, Lynch, Patterson, 1985.
- The hierarchy (#3) is from Herlihy, 1991.
- The synchronous studies (#4) are from Dolev and Strong, 1983, and others.
- The Byzantine agreement problem (#5) and the simple algorithm (#6) are from Lamport, Shostak, Pease, 1980ff., and others.
- The Queen algorithm (#7) and the King algorithm (#8) are from Berman, Garay, and Perry, 1989.
- The algorithm using authentication (#9) is due to Dolev and Strong, 1982.
- The first randomized algorithm (#10) is from Ben-Or, 1983.
- The concept of a shared coin was introduced by Bracha, 1984.
That’s all, folks!

Questions & Comments?

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