Verifying the Consistency of Remote Untrusted Services with Commutative Operations

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Abstract

A group of mutually trusting clients outsources a computation service to a remote server, which they do not fully trust and that may be subject to attacks. The clients do not communicate with each other and would like to verify the correctness of the remote computation and the consistency of the server's responses. This paper first presents the *Commutative-Operation verification Protocol* (*COP*) that ensures linearizability when the server is correct and preserves fork-linearizability in any other case. All clients that observe each other's operations are consistent, in the sense that their own operations and those operations of other clients that they see are linearizable. Second, this work extends COP through authenticated data structures to *Authenticated COP*, which allows consistency verification of outsourced services whose state is kept only remotely, by the server. This yields the first fork-linearizable consistency verification protocol for generic outsourced services that (1) *relieves* clients from *storing the state*, (2) supports *wait-free* client operations, and (3) handles *sequences* of arbitrary *commutative operations*.

Keywords: Cloud computing, fork-linearizability, data integrity, verifiable computation, commutative operations, Byzantine emulation.

1 Introduction

With the advent of *cloud computing*, most computations run in remote data centers and no longer on local devices. As a result, users are bound to trust the service provider for the confidentiality and the correctness of their computations. This work addresses the *integrity* of outsourced data and computations and the *consistency* of the provider's responses. Consider a group of mutually trusting clients who want to collaborate on a resource that is provided by a remote partially trusted server. This could be a wiki containing data of a common project, an archival document repository, or a groupware tool running in the cloud. A subtle change in the remote computation, whether caused inadvertently by a bug or deliberately by a malicious adversary, may result in wrong responses to the clients. The clients trust the provider only partially, hence, they would like to assess the integrity of the computation, to verify that responses are correct, and to check that they all get consistent responses.

In an asynchronous network model without communication among clients such as considered here, the server may perform a *forking attack* and omit the effects of operations by some clients in her responses to other clients. Not knowing which operations other clients execute, the forked clients cannot detect such violations. The best achievable consistency guarantee in this setting is captured by *fork-linearizability*, introduced by Mazières and Shasha [24] for storage systems. Fork-linearizability ensures

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that whenever the server in her responses to a client C_1 has ignored an operation executed by a client C_2 , then C_1 can never again observe an operation by C_2 afterwards and vice versa. This property ensures clearly defined service semantics in the face of an attack and allows clients to detect server misbehavior easily.

Several conceptual [6, 22, 4, 5] and practical advances [32, 11, 21, 28] have recently been made that improve consistency checking and verification with fork-linearizability and related notions. The resulting protocols ensure that when the server is correct, the service is linearizable and (ideally) the algorithm is *wait-free*, that is, every client's operations complete independently of other clients. It has been recognized, however, that read/write conflicts cause such protocols to block; this applies to fork-linearizable semantics [24, 6] and to other forking consistency notions [4, 5].

In this paper, we go beyond storage services and verify the consistency of remote *computation* on a Byzantine server. The *Commutative-Operation verification Protocol* or *COP* imposes fork-linearizable semantics for arbitrary functionalities, exploits commuting operations, and allows clients to operate concurrently without blocking unless operations conflict. Furthermore, the extension to *Authenticated COP* also relieves clients from storing the computation state and from executing all operations. Fork-linearizability makes it easy to expose Byzantine behavior of the server. For instance, the clients may exchange a message outside the model over a low-bandwidth channel and thereby verify the correctness of a service in an end-to-end way.

Efficient handling of wait-free operations is a key feature for collaboration with remote coordination, as geographically separated clients may operate at different speed. Consequently, previous work has devoted a lot of attention to identifying and avoiding blocking [24, 6, 19]. For example, read operations in a storage service commute and do not lead to a conflict. On the other hand, when a client writes a data item concurrently with another client who reads it, the reader has to wait until the write operation completes; otherwise, fork-linearizability is not guaranteed [6]. If all operations are to proceed without blocking, though, it is necessary to weaken the consistency guarantees to weak fork-linearizability [5], for instance. COP is wait-free and never blocks because it aborts non-commuting operations that cannot proceed.

The *Blind Stone Tablet (BST)* protocol [32], the closest predecessor of this work, supports an encrypted remote database hosted by an untrusted server that is accessed by multiple clients. Its consistency checking algorithm allows some commuting client operations to proceed concurrently, but only to a limited extent, as we explain below. Every client has to maintain the complete service state and to execute all operations, in contrast to this work. Furthermore, the BST protocol guarantees fork-linearizability only for database state updates, but does not ensure it for all responses output by a client.

SPORC [11] considers a groupware collaboration service whose operations may not commute, but can be made to commute by applying operational transformations. Through this mechanism, different execution orders still converge to the same state. All SPORC operations are wait-free but respect only fork-* linearizability, which is weaker than fork-linearizability.

1.1 Contributions

This paper considers a generic service executed by an untrusted server and provides new protocols for consistency verification through fork-linearizable semantics. More concretely, it introduces the Commutative-Operation verification Protocol (COP) and its extension to Authenticated COP (called ACOP) with the following properties:

1. COP is the first wait-free, abortable consistency verification protocol that emulates an arbitrary functionality on a Byzantine server with fork-linearizability and exploits commuting operation sequences.

Protocol	Wait-free	Function	Consistency	Execution
SUNDR [24, 18]		storage	fork-lin.	server
FAUST & Venus [5, 28]	\checkmark	storage	weak fork-lin.	server
BST [32]	(√)	single comm. op.	(fork-lin.)	clients
SPORC [11]	\checkmark	generic ot. op.	(weak fork-lin.)	clients
COP (Sec. 3)	\checkmark	generic comm. op.	fork-lin.	clients
ACOP (Sec. 4)	\checkmark	generic comm. op.	fork-lin.	server

Table 1: Summary of related protocols. In this table under *function*, the BST protocol supports only a *single* commuting operation and does not achieve wait-freedom (as indicated by the parentheses in the first column); SPORC is wait-free for generic functions that have *operational transforms*; COP and ACOP are wait-free for generic *commuting* operation sequences. *Weak fork-linearizability* (or *fork-* consistency*) allows the last operation of a client to be inconsistent compared to *fork-linearizability*; however, BST and SPORC do not guarantee their consistency notion for client responses, only for state changes that may occur much later (as indicated by the parentheses). The *execution* column indicates whether the *clients* compute operations and maintain state or whether this is done by the *server*.

- 2. ACOP is the first wait-free fork-linearizable consistency verification protocol for services, where the state is maintained by the server and the clients do not execute every operation.
- 3. COP comes with a formal analysis that proves fork-linearizable semantics for generic service execution; previous work did not establish this notion.

COP and ACOP follow the general pattern of most previous fork-linearizable emulation protocols. For determining when to proceed with concurrent operations, we consider *sequences* of operations that jointly commute and the state of the service, in contrast to earlier protocols, which considered only isolated operations.

For computations supported by suitable authenticated data structures, ACOP enables *authenticated remote computation*, where operations are executed by the server and the clients no longer need to maintain the state of the computation. In contrast to previous work, this enables ACOP to handle services with large state.

1.2 Related work

Storage protocols. Fork-linearizability has been introduced (under the name of *fork consistency*) together with the SUNDR storage system [24, 18]. Conceptually SUNDR operates on storage objects with simple read/write semantics. Subsequent work of Cachin et al. [6] improves the efficiency of untrusted storage protocols. A lock-free storage protocol with abortable operations, which lets all operations complete in the absence of step contention, has been proposed by Majuntke et al. [22].

FAUST [5] and Venus [28] go beyond the fork-linearizable consistency guarantee and model occasional message exchanges among the clients. This allows FAUST and Venus to obtain stronger semantics, in the sense that they eventually reach consistency (i.e., linearizability) or detect server misbehavior. In the model considered here, fork-linearizability is the best possible guarantee [24]. The relation of these protocols and others to COP is summarized in Table 1.

Blind Stone Tablet (BST). The BST protocol [32] considers transactions on a database, coordinated by the remote server. A client first *simulates* a transaction on its own copy, potentially generating *local output*, then coordinates with the server for ordering the transaction. From the server's response it determines if a transaction commutes with other, pending transactions invoked by different clients

that were reported by the server. If they conflict, the client undoes the transaction and basically aborts; otherwise, he commits the transaction and relays it via the server to other clients. When a client receives such a relayed transaction, the client *applies* the transaction to its database copy.

BST has several limitations: First, because a client applies his own transactions only when all pending transactions by other clients have been applied to his own state, updates induced by his transactions are delayed in dependence on other clients. Thus, he cannot always execute his next transaction from the modified state and produce the correct output. This implies the client is blocked and the protocol is not "wait-free" as claimed [32]. Second, the notion of "trace consistency" in the analysis of BST considers only transactions that have been applied to the local state, not the responses as required to satisfy forklinearizability. However, a transaction may be applied long after its response was output, hence, client operations might not be fork-linearizable. In contrast, the analysis of COP shows it is fork-linearizable for all *responses* output by clients. Finally, every client in BST maintains a copy of the database and replays all operations locally, which is not necessary in ACOP.

COP extends BST and allows one client to execute multiple operations independently of the other clients, as long as his *sequence* of operations jointly commutes with the *sequence* of pending operations by other clients, considering the current service *state*. BST considers only the commutativity of individual operations. Note that two operations o_1 and o_2 may independently commute with an operation o_3 from a particular starting state, but their concatenation, $o_1 \circ o_2$, may not commute with o_3 . Operation sequences and state-based commutativity have recently been exploited for building scalable services on multicore systems [8].

Non-blocking protocols. SPORC [11] is a group collaboration system where operations do not need to be executed in the same order at every client by virtue of employing *operational transforms*. The latter concept allows for shifting operations to a different position in an execution by transforming them according to properties of the skipped operations. Differently ordered and transformed variants of a common sequence converge to the same end state. SPORC is claimed to provide fork-* linearizabil-ity [19], which is almost the same as weak fork-linearizability [5]; both notions are strict relaxations of fork-linearizability that permit concurrent operations to proceed without blocking, such that protocols become wait-free. The increased concurrency is traded for weaker consistency, as up to one diverging operation may exist between two clients. Moreover, there is no formal analysis for SPORC. As in BST, SPORC addresses only the updates of client states and does *not* consider *local outputs*; however, for showing linearizability, one has to consider the response of operations.

FAUST [5], mentioned before, never blocks clients and enjoys eventual consistency, but guarantees only weak fork-linearizability. Abortable operations have been introduced in this context by Majuntke et al. [22] for data storage.

In contrast to SPORC and FAUST, COP ensures the stronger fork-linearizability condition, where every operation is consistent as soon as it completes. In terms of expressiveness, SPORC is neither weaker nor stronger than COP: On one hand, SPORC seems more general as it never blocks clients even for operations that do not appear to commute; on the other hand, SPORC is limited to functions with transformable operations and does not address conflicting operations (which exist in some functions [6]); COP, however, works for arbitrary functions.

In BST and SPORC, all clients execute all operations. ACOP eliminates this drawback and shifts the state and the computation to the server by exploiting the notion of authenticated data structures, as suggested by Cachin [3] in a more restricted setting. In storage protocols (SUNDR and FAUST), clients do not "execute" each other's operations due to the limited functionality.

Last but not least, the protocol of Cachin [3] provides also fork-linearizable execution for generic services like COP. However, the protocol is inherently blocking.

1.3 Organization of the paper

The paper continues by introducing the notation and basic concepts in Section 2. The subsequent section presents COP and discusses its properties. The extension to ACOP for remote authenticated computation is described in Section 4.

2 Definitions

System model. We consider an asynchronous distributed system with n clients, C_1, \ldots, C_n and a server S, modeled as processes. Each client is connected to the server through an asynchronous, reliable communication channel that respects FIFO order. A protocol specifies the operations of the processes. All clients are *correct* and follow the protocol, whereas S operates in one of two modes: either she is *correct* and follows the protocol or she is *Byzantine* and may deviate arbitrarily from the specification.

Functionality. We consider a deterministic *functionality* F (also called a type) defined over a set of *states* S and a set of *operations* O. F takes as arguments a state $s \in S$ and an operation $o \in O$ and returns a tuple (s', r), where $s' \in S$ is a state that reflects any changes that o caused to s and $r \in \mathcal{R}$ is a response to o

$$(s', r) \leftarrow F(s, o).$$

This is also called the *sequential specification* of F.

We extend this notation for executing a sequence of operations $\langle o_1, \ldots, o_k \rangle$, starting from an initial state s_0 , and write

$$(s',r) = F(s_0, \langle o_1, \dots, o_k \rangle)$$

for $(s_i, r_i) = F(s_{i-1}, o_i)$ with i = 1, ..., k and $(s', r) = (s_k, r_k)$. Note that an operation in \mathcal{O} may represent a batch of multiple application-level operations.

Commutative Operations. Commutative operations of F play a role in protocols that may execute multiple operations concurrently. Two operations $o_1, o_2 \in \mathcal{O}$ are said to *commute in a state s* if and only if these operations, when applied in different orders starting from s, yield the same respective states and responses. Formally, if

$$(s', r_1) \leftarrow F(s, o_1), \quad (s'', r_2) \leftarrow F(s', o_2); \text{ and} \\ (t', q_2) \leftarrow F(s, o_2), \quad (t'', q_1) \leftarrow F(t', o_1)$$

then

$$r_1 = q_1, r_2 = q_2, s'' = t''.$$

Furthermore, we say two operations $o_1, o_2 \in \mathcal{O}$ commute when they commute in any state of \mathcal{S} .

Also sequences of operations can commute. Suppose two sequences ρ_1 and ρ_2 consisting of operations in \mathcal{O} are mixed together into one sequence π such that the partial order among the operations from ρ_1 and from ρ_2 is retained in π , respectively. If executing π starting from a state *s* gives the same respective responses and the same final state as for every other such mixed sequence, in particular for $\rho_1 \circ \rho_2$ and for $\rho_2 \circ \rho_1$, where \circ denotes concatenation, we say that ρ_1 and ρ_2 commute in state *s*. Analogously, we say that ρ_1 and ρ_2 commute if they commute in any state.

Operations that do not commute are said to *conflict*. Commuting operations are well-known from the study of concurrency control [30, 31]. They can be defined alternatively by considering only the responses of future operations and ignoring the state, but when allowing arbitrary functionalities F, this

notion is equivalent to ours, as F might contain an operation that returns the complete state. We define a Boolean predicate $commute_F(s, \rho_1, \rho_2)$ that is true if and only if ρ_1 and ρ_2 commute in s according to F. W.l.o.g. we assume all operations of F and commute_F are efficiently computable.

Abortable services. When operations of F conflict, a protocol may either decide to block or to abort. Aborting and giving the client a chance to retry the operation at his own rate often has advantages compared to blocking, which might delay an application in unexpected ways.

As in previous work that permitted aborts [1, 22], we allow operations to abort and augment F to an *abortable* functionality F' accordingly. F' is defined over the same set of states S and operations Oas F, but returns a tuple defined over S and $\mathcal{R} \cup \{\bot\}$. F' may return the same output as F, but F' may also return \bot and leave the state unchanged, denoting that a client is not able to execute F. Hence, F'is a non-deterministic relation and satisfies

$$F'(s,o) = \{(s, \perp), F(s,o)\}.$$

Since F' is not deterministic, a sequence of operations no longer uniquely determines the resulting state and response value.

Abortable functionalities may be seen as obstruction-free objects [1, 15] and vice versa; such objects guarantee that every client operation completes assuming the client eventually runs in isolation.

Operations and histories. The clients interact with F through *operations* provided by F. As operations take time, they are represented by two events occurring at the client, an *invocation* and a *response*. A *history* of an execution σ consists of the sequence of invocations and responses of F occurring in σ . An operation is *complete* in a history if it has a matching response.

An operation *o precedes* another operation *o'* in a sequence of events σ , denoted $o <_{\sigma} o'$, whenever *o* completes before *o'* is invoked in σ . A sequence of events π preserves the real-time order of a history σ if for every two operations *o* and *o'* in π , if $o <_{\sigma} o'$ then $o <_{\pi} o'$. Two operations are *concurrent* if neither one of them precedes the other. A sequence of events is *sequential* if it does not contain concurrent operations. For a sequence of events σ , the subsequence of σ consisting only of events occurring at client C_i is denoted by $\sigma|_{C_i}$ (we use the symbol | as a projection operator). For some operation *o*, the prefix of σ that ends with the last event of *o* is denoted by $\sigma|_{o}$.

An operation o is said to be *contained in* a sequence of events σ , denoted $o \in \sigma$, whenever at least one event of o is in σ . We often simplify the terminology by exploiting that every *sequential* sequence of events corresponds naturally to a sequence of operations, and that analogously every sequence of operations corresponds to a sequential sequence of events.

An execution is *well-formed* if the events at each client are alternating invocations and matching responses, starting with an invocation. An execution is *fair*, informally, if it does not halt prematurely when there are still steps to be taken or messages to be delivered (see the standard literature for a formal definition [20]). We are interested in a protocol where the clients never block, though some operations may be aborted and thus will not complete regularly. We call a protocol *wait-free* if in every history where the server is correct, every operation by any client completes [14].

Consistency properties. We use the standard notion of *linearizability* [16], which requires that the operations of all clients appear to execute atomically in one sequence and its extension to *fork-linearizability* [24, 6], which relaxes the condition of one sequence to permit multiple "forks" of an execution. Under fork-linearizability, every client observes a linearizable history and when an operation is observed by multiple clients, the history of events occurring before the operation is the same.

Definition 1 (View). A sequence of events π is called a *view* of a history σ at a client C_i w.r.t. a functionality F if:

- 1. π is a sequential permutation of some subsequence of complete operations in σ ;
- 2. all complete operations executed by C_i appear in π ; and
- 3. π satisfies the sequential specification of *F*.

Definition 2 (Linearizability [16]). A history σ is linearizable w.r.t. a functionality F if there exists a sequence of events π such that:

- 1. π is a view of σ at all clients w.r.t. F; and
- 2. π preserves the real-time order of σ .

Definition 3 (Fork-linearizability [24]). A history σ is fork-linearizable w.r.t. a functionality F if for each client C_i there exists a sequence of events π_i such that:

- 1. π_i is a view of σ at C_i w.r.t. F;
- 2. π_i preserves real-time order of σ ; and
- 3. for every client C_i and every operation $o \in \pi_i \cap \pi_j$ it holds that $\pi_i | o = \pi_j | o$.

Finally, we recall the concept of a *fork-linearizable Byzantine emulation* [6]. It summarizes the requirements put on our protocol, which runs between the clients and an untrusted server. This notion means that when the server is correct, the service should guarantee the standard notion of linearizability; otherwise, it should ensure fork-linearizability.

Definition 4 (Fork-linearizable Byzantine emulation [6]). We say that a protocol P for a set of clients *emulates* a functionality F on a Byzantine server S with fork-linearizability if and only if in every fair and well-formed execution of P, the sequence of events observed by the clients is fork-linearizable with respect to F, and moreover, if S is correct, then the execution is linearizable w.r.t. F.

Cryptographic primitives. As the focus of this work is on concurrency and correctness and not on cryptography, we model *hash functions* and *digital signature schemes* as ideal, deterministic functionalities implemented by a distributed oracle.

A hash function maps a bit string of arbitrary length to a short, unique representation. The functionality provides only a single operation hash; its invocation takes a bit string x as parameter and returns an integer h with the response. The implementation maintains a list L of all x that have been queried so far. When the invocation contains $x \in L$, then hash responds with the index of x in L; otherwise, hash appends x to L and returns its index. This ideal implementation models only collision resistance but no other properties of real hash functions.

The functionality of the *digital signature scheme* provides two operations, $sign_i$ and $verify_i$. The invocation of $sign_i$ specifies the index i of a client and takes a bit string m as input and returns a signature $\sigma \in \{0, 1\}^*$ with the response. Only C_i may invoke $sign_i$. The operation $verify_i$ takes a putative signature σ and a bit string m as parameters and returns a Boolean value with the response. Its implementation satisfies that $verify_i(\sigma, m)$ returns TRUE for any $i \in \{1, \ldots, n\}$ and $m \in \{0, 1\}^*$ if and only if C_i has executed $sign_i(m)$ and obtained σ before; otherwise, $verify_i(\sigma, m)$ returns FALSE. Every client as well as S may invoke verify. The signature scheme may be implemented analogously to the hash function.

3 The commutative-operation verification protocol

The pseudocode of COP for the clients and the server is presented in Algorithms 1–3. We assume that the execution of each client is well-formed and fair.

Notation. The function length(a) for a list a denotes the number of elements in a and \parallel denotes concatenation of strings. Several variables are *dynamic arrays* or *maps*, which associate keys to values. A value is stored in a map H by assigning it to a key, denoted $H[k] \leftarrow v$; if no value has been assigned to a key, the map returns \bot . Recall that F' is the abortable extension of functionality F.

Overview. COP adopts the structure of previous protocols that guarantee fork-linearizable semantics [24, 32, 3]. It aims at obtaining a globally consistent order for the operations of all clients, as determined by the server.

When a client C_i invokes an operation o, he sends an INVOKE message to the server S. He expects to receive a REPLY message from S telling him about the position of o in the global sequence of operations. The message contains the operations that are *pending* for o, that is, operations that C_i may not yet know and that are ordered before o by a correct S. (A Byzantine S may introduce consistency violations here.) We distinguish between *pending-other* operations invoked by other clients and *pending-self* operations, which are operations executed by C_i up to o.

Client C_i then verifies that the data from the server is consistent. If this or any other verification step fails, the formal protocol simply halts; in practice, the clients would then recover the service state, abandon the faulty S, and switch to another provider. In order to ensure fork-linearizability for the response values, the client first simulates the pending-self operations and tests if *o commutes* with the pending-other operations. If the test succeeds, he declares *o* to be *successful*, executes *o*, and computes the response *r* according to *F*; otherwise, *O* is *aborted* and the response is $r = \bot$. According to this, the *status* of *o* is a value in $\mathcal{Z} = \{SUCCESS, ABORT\}$. Through these steps the client *commits o*. Then he sends a corresponding COMMIT message to *S* and outputs *r*.

The (correct) server records the committed operation and relays it to all clients via a BROADCAST message. When the client receives such a broadcast operation, he verifies that it is consistent with everything the server told him so far. If this verification succeeds, we say that the client *confirms* the operation. If the operation's status was SUCCESS, then the client executes it and *applies* it to his local state.

Data structures. Every client locally maintains a set of variables during the protocol. The state $s \in S$ is the result of applying all successful operations, received in BROADCAST messages, to the initial state s_0 . Variable c stores the sequence number of the last operation that the client has confirmed. H is a map containing a *hash chain* computed over the global operation sequence as announced by S. The contents of H are indexed by the sequence number of the operations. Entry H[l] is computed as hash(H[l-1]||o||l||i), with H[0] = NULL, and represents an operation o with sequence number l executed by C_i . (The notation || stands for concatenating values as bit strings.) A variable u is set to o whenever the client has invoked an operation o but not yet completed it; otherwise u is \bot . Variable Z maps the sequence number of every operation that the client has executed himself to the status of the operation. The client only needs the entries in Z with index greater than c.

The (correct) server also keeps several variables locally. She stores the invoked operations in a map I and the completed operations in a map O, both indexed by sequence number. Variable t determines the global sequence number for the invoked operations. Finally, variable b is the sequence number of the last broadcast operation and ensures that S disseminates operations to clients in the global order.

Algorithm 1 Commutative-operation verification protocol (client C_i)

State $u \in \mathcal{O} \cup \{\bot\}$: the operation being executed currently or \bot if no operation runs, initially \bot $c \in \mathbb{N}_0$: sequence number of the last operation that has been confirmed, initially 0 $H: \mathbb{N}_0 \to \{0, 1\}^*$: hash chain (see text), initially containing only H[0] = NULL $Z: \mathbb{N}_0 \to \mathcal{Z}$: status map (see text), initially empty $s \in \mathcal{S}$: current state, after applying operations, initially s_0 upon invocation o do $u \leftarrow o$ $\tau \leftarrow sign_i(\text{INVOKE} \| o \| i)$ send message [INVOKE, o, c, τ] to S **upon** receiving message [REPLY, ω] from S **do** $\gamma \leftarrow \langle \rangle$ // list of pending-other operations $\mu \leftarrow \langle \rangle$ // list of successful pending-self operations $k \leftarrow 1$ while $k \leq length(\omega)$ do $(o, j, \tau) \leftarrow \omega[k]$ $l \leftarrow c + k$ // promised sequence number of o if not $verify_i(\tau, INVOKE ||o||j)$ then halt if $H[l] = \bot$ then $H[l] \leftarrow hash(H[l-1]||o||l||j)$ // extend hash chain else if $H[l] \neq hash(H[l-1]||o||l||j)$ then // server replies are inconsistent halt if $j = i \wedge Z[l] = \text{SUCCESS} \wedge k < \text{length}(\omega)$ then $\mu \leftarrow \mu \circ \langle o \rangle$ else if $j \neq i$ then $\gamma \leftarrow \gamma \circ \langle o \rangle$ $k \gets k+1$ if $k = 1 \lor o \neq u \lor j \neq i$ then // variables o, j, and $l = c + length(\omega)$ keep their values halt // last pending operation must equal the current operation $(a, r) \leftarrow F(s, \mu)$ // compute temporary state with successful pending-self operations if $commute_F(a, \langle u \rangle, \gamma)$ then // u = o is the current operation $(a,r) \leftarrow F(a,u)$ // compute response to u $Z[l] \leftarrow \text{SUCCESS}$ else $r \leftarrow \bot$ $Z[l] \leftarrow \text{Abort}$ $\phi \leftarrow sign_i (\text{COMMIT} \|u\| \|H[l]\| Z[l])$ send message [COMMIT, $u, l, H[l], Z[l], \phi$] to S $u \leftarrow \bot$ return r

Algorithm 2 Commutative-operation verification protocol (client C_i , continued)

upon receiving message [BROADCAST, o, q, h, z, ϕ, j] from S **do if** not (q = c + 1 and $verify_j(\phi, COMMIT ||o||q||h||z))$ then **halt if** $H[q] = \bot$ then $H[q] \leftarrow hash(H[q - 1]||o||q||j)$ **if** $h \neq H[q]$ then **halt if** z = SUCCESS then $(s, r) \leftarrow F(s, o)$ $c \leftarrow c + 1$ **if** z = F(s, o) **if** h = f(s, o) $(s, r) \leftarrow F(s, o)$ $(s, r) \leftarrow F(s, o)$ $(s, r) \leftarrow$

Algorithm 3 Commutative-operation verification protocol (server *S*)

State $t \in \mathbb{N}_0$: sequence number of the last invoked operation, initially 0 $b \in \mathbb{N}_0$: sequence number of the last broadcast operation, initially 0 $I: \mathbb{N} \to \mathcal{O} \times \mathbb{N}_0 \times \{0, 1\}^*$: invoked operations (see text), initially empty $O: \mathbb{N} \to \mathcal{O} \times \{0,1\}^* \times \mathcal{Z} \times \{0,1\}^* \times \mathbb{N}$: committed operations (see text), initially empty **upon** receiving message [INVOKE, o, c, τ] from C_i do $t \leftarrow t + 1$ $I[t] \leftarrow (o, i, \tau)$ $\omega \leftarrow \langle I[b+1], \dots, I[t] \rangle$ // include non-committed operations and o send message [REPLY, ω] to C_i **upon** receiving message [COMMIT, o, q, h, z, ϕ] from C_i **do** $O[q] \leftarrow (o, h, z, \phi, i)$ while $O[b+1] \neq \bot$ do // broadcast operations ordered by their sequence number $b \leftarrow b + 1$ $(o', h', z', \phi', j) \leftarrow O[b]$ send message [BROADCAST, o', b, h', z', ϕ', j] to all clients

Protocol. When client C_i invokes an operation o, he stores it in u and sends an INVOKE message to S containing o, c, and τ , a digital signature computed over o and i. In turn, a correct S sends a REPLY message with the list ω of pending operations; they have a sequence number greater than c. Upon receiving a REPLY message, the client checks that ω is consistent with any previously sent operations and uses ω to assemble the successful pending-self operations μ and the pending-other operations γ . He then determines whether o can be executed or has to be aborted.

In particular, during the loop in Algorithm 1, for every operation o in ω , C_i determines its sequence number l and verifies from the digital signature that o was indeed invoked by C_j . He computes the entry of o in the hash chain from o, l, j, and H[l-1]. If $H[l] = \bot$, then C_i stores the hash value there. Otherwise, H[l] has already been set and C_i verifies that the hash values are equal; this means that o is consistent with the pending operation(s) that S has sent previously with indices up to l.

If operation o is his own and its saved status in Z[l] was SUCCESS, then he appends it to μ . The client remembers the status of his own operations in Z, since commute_F depends on the state and that could have changed if he applied operations after committing o.

Finally, when C_i reaches the end of ω (i.e., when C_i considers o = u), he checks that ω is not empty and that it contains u at the last position. He then creates a temporary state a by applying μ to the current state s, and tests whether u commutes with the pending-other operations γ in a. If they do, he records the status of u as SUCCESS in Z[l] and computes the response r by executing u on state a. If u does not commute with γ , he sets status of u to ABORT and $r \leftarrow \bot$. Then C_i signs u together with its sequence number, status, and hash chain entry H[l] and includes all values in the COMMIT message sent to S.

Upon receiving a COMMIT message for an operation o with sequence number q, the (correct) server records its content as O[q] in the map of committed operations. Then she is supposed to send a BROAD-CAST message containing O[q] to the clients. She waits with this until she has received COMMIT messages for all operations with sequence number less than q and broadcast them. This ensures that completed operations are disseminated in the global order to all clients. Waiting here leads to blocking in BST, as mentioned in the Introduction. In COP, this does not forbid clients from progressing with their own operations as we explain below.

In a BROADCAST message received by client C_i , the committed operation is represented by a tuple (o, q, h, z, ϕ, j) . The client conducts several verification steps; if successful, we say o is *confirmed*. Subsequently he *applies* o to his state s. In more detail, the client first verifies that the sequence number q is the next operation according to c; hence, o follows the global order and the server did not omit any operations. Second, he uses the digital signature ϕ on the message to verify that C_j indeed committed o. Lastly, C_i computes his own hash-chain entry H[q] for o and confirms that it is equal to the hash-chain value h from the message. This ensures that C_i and C_j have received consistent operations from S up to o. Once the verification succeeds, the client applies o to his state s only if its status z was SUCCESS, that is, when C_j has not aborted o.

Commuting operation sequences. Consider the following example F of a counter restricted to nonnegative values: Its state consists of an integer s; an add(x) operation adds x to s and returns TRUE; a dec(x) operation subtracts x from s and returns TRUE if $x \le s$, but does nothing and returns FALSE if x > s. Suppose the current state s at C_i is 7 and C_i executes dec(4) and subsequently dec(6). During both operations of C_i , the server announces that add(2) by another client is pending. Note that C_i executes dec(4) successfully but aborts dec(6) because dec(6) does not commute with add(2) from 3, the temporary state (a in Algorithm 1) computed by C_i after the pending-self operation. However, the latter two operations, add(2) and dec(6), do commute in the current state 7. This shows why the client executes the pending-self operations before testing the current operation for a conflict.

Suppose now the current state s is again 7 and C_i executes dec(4). The server reports the pending sequence $\langle dec(2), dec(3) \rangle$. Thus, C_i aborts dec(4). Even though dec(4) commutes with dec(2) and with dec(3) individually in state 7, it does not commute with their sequence. This illustrates why COP checks for a conflict with the sequence of pending operations.

Memory requirements. For saving storage space, the client may garbage-collect entries of H and Z with sequence numbers smaller than c. The server can also save space by removing the entries in I and O for the operations that she has broadcast. However, if new clients are allowed to enter the protocol, the server should keep all operations in O and broadcast them to new clients upon their arrival.

With the above optimizations the client has to keep only pending operations in H and pending-self operations in Z. The same holds for the server: the maximum number of entries stored in I and O is proportional to the number of pending operations at any client.

Communication. Every operation executed by a client requires him to perform one roundtrip to the server: send an INVOKE message and receive a REPLY. For every executed operation the server simply sends a BROADCAST message. Clients do not communicate with each other in the protocol. However,

as soon as they do, they benefit from fork-linearizability and can easily discover a forking attack by comparing their hash chains.

Messages INVOKE, COMMIT, and BROADCAST are independent of the number of clients and contain only a description of one operation, while the REPLY message contains the list of pending operations ω . If even one client is slow, then the length of ω for all other clients grows proportionally to the number of further operations they are executing. To reduce the size of REPLY messages, the client can remember all pending operations received from S, and S can send every pending operation only once.

Aborts and wait-freedom. Every client executing COP can proceed with an operation o for F as long as it does not conflict with pending operations of other clients. Observe that the state used by the client for executing o reflects all of his own operations executed so far, even if he has not yet confirmed or applied them to his state because operations of other clients have not yet completed. After successfully executing o, the client outputs the response immediately after receiving the REPLY message from S. A conflict arises when o does not commute with the pending operations of other clients. In this case, the client aborts o and outputs \bot , according to F'.

Hence, for F where all operations and operation sequences commute, COP is wait-free. For arbitrary F, however, no fork-linearizable Byzantine emulation can be wait-free [6]. COP avoids blocking via the augmented functionality F'. Clients complete every operation in the sense of F', which includes aborts; therefore, COP is wait-free for F'. In other words, regardless of whether an operation aborts or not, the client may proceed executing further operations.

To mitigate the risk of conflicts, the clients may employ a synchronization mechanism such as a contention manager, scheduler, or a simple random waiting strategy. Such synchronization is common for services with strong consistency demands. If one considers also clients that may crash (outside our formal model), then the client group has to be adjusted dynamically or a single crashed client might hold up progress of other clients forever. Previous work on the topic has explored how a group manager or a peer-to-peer protocol may control a group membership protocol [18, 28]; these methods apply also to COP.

Analysis. COP emulates the abortable functionality F' on a Byzantine server with fork-linearizability. Furthermore, all histories of COP where the clients execute operations sequentially are fork-linearizable w.r.t. F (no operations abort), and if, additionally, the server is correct, then all such histories are also linearizable w.r.t. F. Here we give only a brief summary of this result; the details appear in Appendix A.

There are two points to consider. First, with a correct S, we show that the output of every client satisfies F' also in the presence of many pending-self operations. The check for commutativity, applied after simulating the client's pending-self operations, ensures that the client's response is the same as if the pending-other operations would have been executed before the operation itself.

The second main innovation lies in the construction of a view for every client that includes all operations that he has executed or applied, together with those of his operations that some other clients have confirmed. Since these operations may have changed the state at other clients, they must be considered. More precisely, some C_k may have confirmed an operation o executed by C_i that C_i has not yet confirmed or applied. In order to be fork-linearizable, the view of C_i must include o as well, including all operations that were "promised" to C_i by S in the sense that they were announced by S as pending for o. It follows from the properties of the hash chain that the view of C_k up to o is the same as C_i 's view including the promised operations. The view of C_i further includes all operations that C_i has executed after o. Taken together this demonstrates that every execution of COP is fork-linearizable w.r.t. F'.

4 Authenticated computation

As introduced above, the COP server merely coordinates client-side operations but does not compute any responses nor relieve the clients from storing, in principle, the complete state of the service. Although BST and related systems [32, 13, 11] use this model, outsourcing operations and state has large benefits.

In this section, we introduce *Authenticated COP* or *ACOP*, which shifts state maintenance and service execution to the server and lets clients only perform verification. ACOP extends COP with an authenticated data structure [25] for the service functionality. It enables *authenticated remote computation* for many realistic services with complex interfaces[10, 26, 7, 17], such as indexed databases, search trees, document processing services, and generic storage schemes; typically their operations permit queries and updates. Recent advances in cryptographic tools for verifying remote computation suggest that it may even become feasible to construct authenticators for generic computations while preserving the privacy of the inputs [12, 2].

4.1 Authenticated COP

We consider a server that stores shared state and executes operations of the functionality F invoked by clients. When F supports an *authenticated data structure* [25], the clients may verify the integrity of a response to an operation from a cryptographic proof in the form of an authenticator for the response. ACOP results from integrating the authenticated data structure into COP and ensures the forklinearizability of the service, retaining all other benefits of COP.

More formally, suppose S maintains the state of F in variable x, called the *server's state*; when S receives an operation o from a client, she should update the state by executing $(x', r) \leftarrow F(x, o)$ and send the response r to the client. For adding authentication, the server's state is extended to include authentication data, and an authenticator α is computed with the response as

$$(x', \alpha, r) \leftarrow authexec_F(x, o)$$

The server sends r together with α to the client. The client maintains a *digest* d between operations, which authenticates the (potentially large) state of F maintained by S. For checking the correctness of the response, the client computes

$$(d', r') \leftarrow \operatorname{verify}_F(d, \alpha, o, r),$$

whereby $r' = \bot$ indicates that the verification failed, and otherwise, r' = r is the correct response. The *authexec*_F and *verify*_F operations encapsulate the authenticated data structure; more information can be found in the rich literature on the subject [29, 23]. For practical authentication techniques such as hash trees and authenticated dictionaries, α is usually much smaller than the full state.

We now describe how to extend COP from the client-centric approach in Algorithms 1–3 to the model where the server maintains the state.

4.2 Server

We start with the changes for S. As part of her state, S additionally maintains a state map $X : \mathbb{N}_0 \to \{0,1\}^*$ indexed by operations, where $X[0] = s_0$ is the initial state. Entry X[b] is assigned when the server broadcasts an operation with sequence number b such that X[b] contains the result of executing the operations with sequence numbers from $1, \ldots, b$.

When the server receives the INVOKE message from C_i with an operation o, she increments the index t and considers the pending operations ω with index between b and t. Then S executes the

pending-self operations ν of C_i , which include o, to obtain the response and authenticator for o as

$$(x', \alpha, r) \leftarrow authexec_F(X[b], \nu);$$

she sends ω and r to C_i together with α . Note that x' is discarded and that S uses X[b] to compute the result using the operation sequence ν , which includes o, as C_i has only applied the operations with sequence numbers $1, \ldots, b$ at the time when he invokes o.

In COP the client checks for commutativity between an invoked operation and the pending operations by himself. With the above modification, S also needs to abort operations as the client would determine from *commute*_F when computing r and α , and S must include additional information that allows the client to execute *commute*_F. In practice, the server may store only the latest state X[b] and the changes induced by the operations with lower sequence numbers. Moreover, once S learns from INVOKE messages that all clients have received and applied all operations with sequence number q, then she may discard the state changes for q as well.

4.3 Client

The clients no longer maintain state s and instead store a digest map $G : \mathbb{N}_0 \to \{0, 1\}^*$ indexed by operations, where G[q] authenticates the state resulting from executing the operations with index up to q, starting from s_0 . The client uses G to verify the server's responses to his operations in a REPLY message. In particular, for operation o, client C_i runs Algorithm 1, executes its pending-self operations (μ) upon input G[c] to obtain a temporary state a and a corresponding digest g, performs the commutativity check, and, if successful, computes

$$(d', r') \leftarrow \operatorname{verify}_F(g, \alpha, o, r).$$

The client halts if the original algorithm halts or if $r' = \bot$; otherwise, the response is $r \leftarrow r'$. The client augments the COMMIT message with α and r' and signs the entire message. Note that d' is again used only temporarily for verifying the pending-self operations and is discarded when the method returns.

Upon receiving a BROADCAST message when the last confirmed operation has index c, the client verifies the signature from client C_j that invoked the operation and the hash value as before. Then C_i intends to verify that the response and digest are consistent (between him and C_j) and to compute the next digest G[c+1]. Note that C_i cannot use α , however, to update the digest, as α authenticates o in the state where C_j committed it, but this state may differ from the state at index c, which is current for C_i . We therefore require that S sends an additional authenticator α' for o in state X[c]. The client verifies that α' and r correspond to o by executing

$$(G[c+1], r') \leftarrow \operatorname{verify}_F(G[c], \alpha', o, r),$$

and verifying that $r' \neq \bot$. The client may garbage-collect entries in G in a similar way as for the hash chain in COP.

5 Conclusion

This paper has introduced COP and ACOP, two variants of the Commutative-Operation verification Protocol, which allow a group of clients to execute a generic service coordinated by a remote untrusted server. COP ensures fork-linearizability and allows clients to easily verify the consistency and integrity of the service responses. In contrast to previous work, COP is wait-free and supports commuting operation sequences (but may sometimes abort conflicting operations); ACOP extends COP by shifting state and operation execution from the clients to the server. Given the popularity of outsourced computation and cloud computing, the problem of checking the results of remote computations cryptographically has received a lot of attention recently [9, 27, 12, 2]. However, these protocols typically address only a two-party model and, with some exceptions [2], do not support state changes. An important direction for future work lies in integrating these verifiable computation protocols into COP and related protocols for guaranteeing cryptographic integrity in the sense of fork-linearizability for multiple clients.

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A Analysis

Theorem 1. The commutative-operation verification protocol in Algorithms 1-3 emulates functionality F' on a Byzantine server with fork-linearizability.

We prove this theorem through the sequence of the following lemmas. We start by introducing additional notation.

When a client issues a COMMIT signature for some operation *o*, we say that he *commits o*. The client's sequence number included in the signature thus becomes the *sequence number of o*; note that with a faulty *S*, two different operations may be committed with the same sequence number by separate clients.

Lemma 2. If the server is correct, then every history σ is linearizable w.r.t. F'. Moreover, if the clients execute all operations sequentially, then σ is linearizable w.r.t. F.

Proof. Recall that σ consists of invocation and response events. We construct a sequential permutation π of σ in terms of the operations associated to the events in σ . Note that a client sends an INVOKE message with his operation to the server, the server assigns a sequence number to the operation and sends it back. The client then computes the response and sends a signed COMMIT message to S, containing the operation and its sequence number. Since each executed operation appears in σ in terms of its invocation and response events, π contains all operations of all clients.

We order π by the sequence number of the operations. If the server is correct she processes INVOKE messages in the order they are received and assigns sequence numbers accordingly. This implies that if an operation o' is invoked after an operation o completes, then the sequence number of o' is higher than o's. Hence, π preserves the real-time order of σ .

We now use induction on the operations in π to show that π satisfies the sequential specification of F'. Note that F' requires a bit of care, as it is not deterministic. For a sequence ω of operations of F' in an actual execution, we write $successful(\omega)$ for the subsequence whose status was SUCCESS; restricted to such operations, F' is deterministic. In particular, consider some operation $o \in \pi$, executed by client C_i . We want to show that C_i computes (s', r) such that $(s', r) \in F'(s_0, successful(\pi|^o))$, whereby it outputs r after committing o and stores s' in its variable s after applying o.

Consider the base case where o is the first operation in π . Note that S has not reported any pending operations to C_i because o is the first operation. Thus, C_i determines that the status of o is SUCCESS, computes $(s', r) \leftarrow F(s_0, o)$ and outputs r. Hence, F' is satisfied. When C_i later receives o in the BROADCAST message from S with sequence number 1, the state is also updated correctly.

Now consider the case when o is not the first operation in π and assume that the induction assumption holds for an operation that appears in π before o. If the status of o is ABORT, then the client does not invoke F, returns \bot , and leaves the state unchanged upon applying o. The claim follows.

Otherwise, we need to show that the response $r \neq \bot$ and the state s' after applying o satisfy $(s', r) = F(s_0, successful(\pi|^o))$. Since S is correct, she assigns unique sequence numbers to the operations. We split the operations with a sequence number smaller than that of o in three groups: a sequence ρ of operations that C_i has confirmed before he committed o, this sequence is in the order in which C_i confirmed these operations; a sequence δ of operations of other clients that were reported by S as pending to C_i when executing o, ordered as in the REPLY message; and a sequence ν of operations that C_i has committed *itself* before o but not yet confirmed or applied, ordered by their sequence number.

Observe that C_i computes r starting from its own copy of the state \bar{s} that results after applying all operations in $successful(\rho)$. From the induction assumption, it follows that $(\bar{s}, \cdot) = F(s_0, successful(\rho))$ because ρ is a prefix of π . From variable ω in the REPLY message, C_i computes the pending-other operations γ and the successful pending-self operations μ . Note that $\gamma = \delta$ and $\mu = successful(\nu)$

as the server is correct. The client computes a temporary state $(a, \cdot) = F(\bar{s}, \mu)$. Because o does not abort, C_i has determined that o commutes with γ in a and computed $(\cdot, r) = F(a, o)$. By the definition of commuting operation sequences, we have that $(s', r) = F(a, successful(\gamma) \circ o)$ and $(s', r) = F(\bar{s}, successful(\omega))$ since the order of operations in μ and γ is preserved in ω . Hence, $(s', r) = F(s_0, successful(\pi))$.

The sequence π preserves the real-time order of σ and satisfies the three conditions of a view of σ at every client C_i w.r.t. F', hence, σ is linearizable w.r.t. F'.

The second part of the lemma claims that if clients execute operations sequentially, then no client outputs \perp . Since the sequence of events at every client is well-formed, a client does not invoke an operation before he has completed the previous one. Moreover, if clients execute operations sequentially then no client invokes an operation while there is a client who has not completed his operation. Hence, the server never includes any pending operations in ω of the REPLY message. The check for conflicts is never positive, and all operations have status SUCCESS. Hence, no client returns \perp and σ satisfies the sequential specification of F.

The promised view of an operation. Suppose a client C_i executes and thereby commits an operation o. We define the *promised view to* C_i of o as the sequence of all operations that C_i has confirmed before committing o, concatenated with the sequence ω of pending operations received in the REPLY message during the execution of o, including o itself (according to the protocol C_i verifies that the last operation in ω is o).

Lemma 3. If C_j has confirmed some operation o that was committed by a client C_i , then the sequence of operations that C_j has confirmed up to (and including) o is equal to the promised view to C_i of o. In particular,

- 1. if C_i and C_j have confirmed an operation o, then they have both confirmed the same sequence of operations up to o; and
- 2. the promised view to C_i of o contains all operations executed by C_i up to o.

Proof. Note that every client computes a hash chain H in which every defined entry contains a hash value that represents a sequence of operations. More precisely, if C_i commits o with sequence number l, then he has set $H[l] \leftarrow hash(H[l-1]||o||l||i)$; this step recursively defines the sequence represented by H[l] as the sequence represented by H[l-1] followed by o. According to the collision-resistance of the hash function, no two different operation sequences are represented by the same hash value. Note that no client ever overwrites an entry of H; moreover, if a client arrives at a point in the protocol where he might assign some value h to entry H[l] but $H[l] \neq \bot$, then he verifies that H[l] = h and aborts if this fails.

Consider the moment when C_i receives the REPLY message during the execution of o. The view of o promised to C_i contains the sequence of operations that C_i has confirmed, followed by the list ω in the REPLY message, including o.

For every pending operation $p \in \omega$, client C_i checks if he has already an entry in H at index l, which is the promised sequence number of p to C_i according to ω . If there is no such entry, he computes the hash value H[l] as above. Otherwise, C_i must have received an operation for sequence number l earlier, and so he verifies that o is the same pending operation as received before. Moreover, C_i verifies that ois also returned to him as pending and adds it to H. Hence, the new hash value h stored in H at the sequence number of o represents the promised view to C_i of o.

Subsequently, C_i signs o and h together and sends it to the server. Client C_j receives it in a BROAD-CAST message from S, to be confirmed and applied with sequence number q. Because C_j verifies the signature of C_i on o, q, and h, the hash value h received by C_j represents the promised view to C_i of o. Before C_j applies o as his q-th operation, according to the protocol he must have already confirmed q-1 operations one by one. Client C_j also verifies that he has either already computed the same H[q] = h or he computes H[q] from his value H[q-1] and checks H[q] = h. As H[q] represents the sequence of operations that C_j has confirmed up to o, from the collision resistance of the hash function, this establishes the main statement of the lemma.

The first additional claim follows simply by noticing that the statement of the lemma holds for i = j. For showing the second additional claim, we note that if C_i confirms an operation of himself, then he has previously executed it (successful or not). There may be additional operations that C_i has executed but not yet confirmed, but C_i has verified according to the above argument that these were all contained in ω from the REPLY message. Thus they are also in the promised view of o.

The view of a client. We construct a sequence π_i from σ as follows. Let o be the operation committed by C_i which has the highest sequence number among those operations of C_i that have been confirmed by some client C_k (including C_i). Define α_i to be the sequence of operations confirmed by C_k up to and including o. Furthermore, let β_i be the sequence of operations committed by C_i with a sequence number higher than that of o. Then π_i is the concatenation of α_i and β_i . Observe that by definition, no client has confirmed operations from β_i .

Lemma 4. The sequence π_i is a view of σ at C_i w.r.t. F'.

Proof. Note that π_i is defined through a sequence of operations that are contained in σ . Hence π_i is sequential by construction.

We now argue that all operations executed by C_i are included in π_i . Recall that $\pi_i = \alpha_i \circ \beta_i$ and consider o, the last operation in α_i . As o has been confirmed by C_k , Lemma 3 shows that α_i is equal to the promised view to C_i of o and, furthermore, that it contains all operations that C_i has executed up to o. By construction of π_i all other operations executed by C_i are contained in β_i , and the property follows.

The last property of a view requires that π_i satisfies the sequential specification of F'. Note that F' is not deterministic and some responses might be \bot . But when we ensure that two operation sequences of F' have responses equal to \bot in exactly the same positions, then we can conclude that two equal operation sequences give the same resulting state and responses from the fact that F is deterministic.

We first address the operations in α_i . Consider again o, the last operation in α_i , which has been confirmed by C_k . For the point in time when C_i executes o, define ρ to be the sequence of operations that C_i has confirmed prior to this and define \bar{s} as the resulting state from applying the successful operations in ρ , as stored in variable s; furthermore, let ω be the pending operations contained in the REPLY message from S. Observe that ω can be partitioned in the pending-other operations γ , the successful pending-self operations of C_i as stored in μ , the aborted pending-self operations of C_i , and o. Client C_i computes the response r for o in state a that results from $F(s, \mu)$. Before executing o, C_i verifies that o commutes with γ in a. Note that when C_i committed some operation $p \in \mu$ he has also verified that p commuted with the pending-other operations in $\omega|^p$. Hence, the response resulting from executing the operations of $\mu \circ o$ in state \bar{s} is the same as the one of executing $\mu \circ successful(\gamma) \circ o$ in state \bar{s} , where we have used the notation $successful(\cdot)$ from Lemma 2. Since ω preserves the order of operations in μ and γ , the response is also the same after the execution of $\rho \circ successful(\omega)$. Moreover, the state resulting from executing the operations in ρ followed by $\mu \circ successful(\gamma) \circ o$ is the same as that resulting from executing $\rho \circ successful(\omega)$. Since $\rho \circ \omega$ is the promised view to C_i of o, and since C_k has confirmed o, Lemma 3 now implies that $\rho \circ \omega$ is equal to α_i .

To conclude the argument, we only have to show that the abort status for all operations in the sequences is the same. Then they will produce the same responses and the same final state. Note

that when C_i executes some operation o he either computes a response according to F or aborts the operation, declaring its status to be SUCCESS or ABORT, respectively. For operations in ρ this is clear from the protocol as the status is included in the BROADCAST message. And whenever C_i later obtains o again as a pending-self operation in ω at some index l, he verifies that it is the same operation as previously at index l and applies or skips it as before according to the status remembered in Z[l]. Hence, the responses of C_i from executing the operations in α_i respect the specification of F'.

The remainder of π_i consists of β_i , whose operations C_i executes himself using F'. Hence, π_i satisfies the sequential specification of F'.

Lemma 5. If some client C_k confirms an operation o_1 before an operation o_2 , then o_2 does not precede o_1 in the execution history σ .

Proof. Let δ_k denote the sequence of operations that C_k has confirmed up to o_2 . According to the protocol logic, δ_k contains o_1 , and o_1 has a smaller sequence number than o_2 . Lemma 3 shows that δ_k is equal to the promised view to C_k of o_2 , hence, o_1 is in the promised view to C_k of o_2 . Recall that the promised view contains operations that have been committed or are pending for other clients. Hence, o_1 has been invoked before o_2 completed.

Lemma 6. The sequence π_i preserves the real-time order of σ .

Proof. Recall that $\pi_i = \alpha_i \circ \beta_i$ and consider first those operations of π_i that appear in α_i , that is, they have been confirmed by some client C_k . Lemma 5 shows that these operations preserve the real-time order of σ . Second, the operations in β_i are ordered according to their sequence number and they were committed by C_i . According to the protocol, C_i executes only one operation at a time and always assigns a sequence number that is higher than the previous one. Hence, β_i also preserves the real-time order of σ .

We are left to show that no operation in β_i precedes an operation from α_i in σ . Recall that α_i is the promised view to C_i of o (the last operation in α_i) and includes the operations that C_i has confirmed or received as pending from S after C_i invoked o. Since o precedes all operations from β_i , it follows that no operation in α_i precedes an operation from β_i .

Lemma 7. If $o \in \pi_i \cap \pi_j$ then $\pi_i | o = \pi_j | o$.

Proof. As $\pi_i = \alpha_i \circ \beta_i$ and $\pi_j = \alpha_j \circ \beta_j$, we need to consider four cases to analyze all operations that can appear in $\pi_i \cap \pi_j$ and the rest are symmetrical.

- o ∈ α_i and o ∈ α_j: This case happens when (a) C_i and C_j both confirmed o, or when (b) C_i has confirmed an operation of C_j or vice versa, or when (c) a client C_k has confirmed operations of C_i and C_j. For (a) and (b) Lemma 3 shows that α_i|^o = α_j|^o. In case (c) neither C_i nor C_j has confirmed o, but o is in their views because C_k has confirmed pending operations of C_i and C_j. Hence, π_k|^o = α_i|^o and π_k|^o = α_j|^o again from Lemma 3.
- 2. $o \in \beta_i$ and $o \in \alpha_j$: This case cannot happen, since no client has confirmed operations from β_i by definition.
- 3. $o \in \alpha_i$ and $o \in \beta_i$: Analogous to the case above.
- 4. $o \in \beta_i$ and $o \in \beta_j$: This case cannot happen since β_i and β_j contain only pending-self operations of C_i and C_j , correspondingly.