

# Dependent Session Types for Certified Concurrent Programming

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We present  $TLL_C$  which extends the Two-Level Linear dependent type theory (TLL) with session type based concurrency. Equipped with Martin-Löf style dependency, the session types of  $TLL_C$  allow protocols to specify the properties of communicated messages. When used in conjunction with the dependent type machinery already present in TLL, dependent session types facilitate the a form of relational verification by relating concurrent programs with their idealized sequential counterparts. Correctness properties proven for sequential programs can now be easily lifted to their corresponding concurrent programs. Session types now become a powerful tool for intrinsically verifying the correctness of data structures such as queues and concurrent algorithms such as map-reduce. To extend TLL with session types, we develop a novel formulation of intuitionistic session type which we believe to be widely applicable for integrating session types into other type systems beyond the context of  $TLL_C$ . We study the meta-theory of our language, proving its soundness as both a term calculus and a process calculus. All reported results are formalized in Coq. A prototype compiler which compiles  $TLL_C$  programs into concurrent C code is implemented and freely available.

Additional Key Words and Phrases: dependent types, linear types, session types, concurrency

## 1 INTRODUCTION

Session types [Honda 1993] are an effective typing discipline for coordinating concurrent computation. Through type checking, processes are forced to adhere to communication protocols and maintain synchronization. This allows session type systems to statically rule out runtime bugs for concurrent programs similarly to how standard type systems rule out bugs for sequential programs. While (simple) session type systems guarantee concurrent programs do not crash catastrophically, it remains difficult to write concurrent programs which are semantically correct.

Consider the Pfenning-style concurrent queue which is a common data structure encountered in the session type literature. A queue is described by the following type:

$$\text{queue}_A := \&\{\text{ins} : A \multimap \text{queue}_A, \text{del} : \oplus\{\text{none} : \mathbf{1}, \text{some} : A \otimes \text{queue}_A\}\}$$

The following diagram illustrates the channel topology of a client interacting with a queue server.



Each of the  $p_i$  nodes here represents a queue cell which holds a value and are linked together by bidirectional channels of type  $\text{queue}_A$ . As indicated by the type constructor  $\&$ , the first queue node  $p_1$  first receives either an  $\text{ins}$  or  $\text{del}$  label from the client. In the case of an  $\text{ins}$  label,  $p_1$  receives a value  $v$  of type  $A$  (indicated by  $\multimap$ ) from the client. The  $p_1$  node then sends an  $\text{ins}$  label to  $p_2$  and forwards  $v$  to it. This forwarding process repeats until the value reaches the end of the queue where a new queue cell  $p_{n+1}$  is allocated to store  $v$ . On the other hand, if  $p_1$  receives a  $\text{del}$  label, the type constructor  $\oplus$  requires that  $p_1$  send either  $\text{none}$  or  $\text{some}$ . The  $\text{none}$  label is sent to signify that the queue is empty and ready to terminate (indicated by  $\mathbf{1}$ ). The  $\text{some}$  label is sent along with a value of type  $A$  (indicated by  $\otimes$ ) which is the dequeued element. Finally,  $p_1$  forwards its channel, connecting to  $p_2$ , to the client so that the client may continue interacting with the rest of the queue.

It is clear from the example above that the session type  $\text{queue}_A$  only lists what operations a queue should support, but does not specify the expected behavior of these operations. For instance, it does not specify that an  $\text{ins}$  operation should add an element to the back of the queue or that a

del operation should return the element at the front of the queue. A correct implementation needs to maintain all of these additional invariants not captured by the session type. In fact, due to the under specification of the  $\text{queue}_A$  type, it is possible to implement a “queue” which simply ignores all ins messages and always returns none on del.

To address this issue, we develop  $\text{TLL}_C$ , a dependent session type system which extends the Two-Level Linear dependent type theory (TLL) [Fu and Xi 2023] with session-typed concurrency. In  $\text{TLL}_C$ , one could define the queues through the following dependent session type:

$$\begin{aligned} \text{queue}(xs : \text{list } A) &:= ?(\ell : \text{opr}). \text{match } \ell \text{ with} \\ &| \text{ins}(v) \Rightarrow \text{queue}(\text{snoc}(xs, v)) \\ &| \text{del} \Rightarrow \text{match } xs \text{ with } (x :: xs') \Rightarrow !(\text{sing } x).!(\text{hc}(\text{queue}(xs'))).1 \mid [] \Rightarrow 1 \end{aligned}$$

Here, the type  $\text{queue}(xs)$  is parameterized by a list  $xs$  which represents the current contents of the queue. Notice that the type no longer needs the  $\oplus$  and  $\&$  type constructors to describe branching behavior. Instead, it uses type-level pattern matching to inspect the label  $\ell$  received from the client. The opr type which  $\ell$  inhabits is defined as a simple inductive type with two constructors:

$$\text{inductive opr} := \text{ins} : A \rightarrow \text{opr} \mid \text{del} : \text{opr}$$

When a queue server receives an  $\text{ins}(v)$  value, the type of the server becomes  $\text{queue}(\text{snoc}(xs, v))$  where  $\text{snoc}$  appends  $v$  to the end of  $xs$ . Conversely, when a del label is received, the type-level pattern matching on  $xs$  enforces that if the queue is non-empty (i.e.  $x :: xs'$  case), then the server must send the front element  $x$  of the queue to the client (indicated by the *singleton type*  $\text{sing } x$ ) along with the channel  $\text{hc}(\text{queue}(xs'))$  connecting to the remainder of the queue. If the queue is empty (i.e.  $[]$  case), then the server simply terminates.

Given the queue protocol describe above, we can construct queue process nodes and interact with them. The following signatures are of helper functions that wrap interactions with the queue nodes into a convenient interface:

$$\begin{aligned} \text{insert} &: \forall \{xs : \text{list } A\} (x : A) \rightarrow \text{Queue}(xs) \rightarrow \text{Queue}(\text{snoc}(xs, x)) \\ \text{delete} &: \forall \{x : A\} \{xs : \text{list } A\} \rightarrow \text{Queue}(x :: xs) \rightarrow C(\text{sing } x \otimes \text{Queue}(xs)) \\ \text{free} &: \text{Queue}([]) \rightarrow C(\text{unit}) \end{aligned}$$

The Queue type here is a type alias for the *channel type* of queues (explained later in detail) and the  $C$  type constructor here is the *concurrency monad* which encapsulates concurrent computations. Notice in the signature of insert and delete that there are dependent quantifiers surrounded by curly braces. These are the *implicit* quantifiers of TLL which indicate that the corresponding arguments are “ghost” values used for type checking and erased prior to runtime. For our purposes here, such ghost values are especially useful for *relationally* specifying the expected behaviors of queue interactions in terms of sequential list operations. For instance, the signature of insert states that the queue obtained after inserting  $x$  is related to the original queue by the list operation  $\text{snoc}$ . Similarly, the signature of delete states that deleting from a non-empty queue returns the front element  $x$ . Even though neither of these  $xs$  ghost values exist at runtime, they *statically* ensure that concurrent processes implementing these interfaces behave like actual queues, i.e., are first-in-first-out data structures. In a later section we will show how a generalized map-reduce algorithm can be implemented and verified using similar techniques.

Integrating session typed based concurrency into TLL is non-trivial due to the fact that TLL is a dependently typed functional language. While prior works [Gay and Vasconcelos 2010; Wadler 2012] have successfully combined *classical* session types with functional languages, it is well known that classical session types do not easily support recursive session types [Gay et al. 2020]

(needed to express our queue type). The main issue is that classical session types are defined in terms of a *dual* operator which does not easily commute with recursive type definitions. The addition of arbitrary type-level computations through dependent types further complicates this matter. On the other hand, *intuitionistic* session types [Caires and Pfenning 2010] eschew the dual operator and define dual *interpretations* of session types based their *left* or *right* sequent rules. Because intuitionistic session types do not rely on a dual operator, they are able to support recursive session types without commutativity issues. However, intuitionistic session types are often formulated in the context of process calculi without a functional layer. To enjoy the benefits of intuitionistic session types in a functional setting, we develop a novel form of intuitionistic session types where we separate the notion of *protocols* from *channel types*. The  $\text{queue}(xs)$  type from before is, in actuality, a protocol whereas  $\mathbf{hc}\langle\text{queue}(xs)\rangle$  is a channel type. In general, a channel type is formed by applying the  $\mathbf{ch}\langle\cdot\rangle$  and  $\mathbf{hc}\langle\cdot\rangle$  type constructors to protocols. These constructors provide dual interpretations to protocols, allowing dual channels of the same protocol to be connected together. For example, the protocol  $!A.P$  would be interpreted dually as follows:

$$\begin{aligned} \mathbf{ch}\langle!A.P\rangle & \quad (\text{send message of type } A) \\ \mathbf{hc}\langle!A.P\rangle & \quad (\text{receive message of type } A) \end{aligned}$$

Such channel types can be naturally included into the contexts of functional type systems without needing to instrument the underlying language into a sequent calculus formulation. We believe our treatment of intuitionistic session types is not specific to  $\text{TLL}_C$  and is widely applicable for integrating intuitionistic session types with other functional languages.

In order to show that  $\text{TLL}_C$  ensures communication safety, we develop a process calculus based concurrency semantics. Process configurations in the calculus are collections of  $\text{TLL}_C$  programs interconnected by channels. At runtime, individual processes are evaluated using the program semantics of base TLL. When two processes at opposing ends (i.e. dually typed) of a channel are synchronized and ready to communicate, the process level semantics transmits their messages across the channel. We study the meta-theory of  $\text{TLL}_C$  and prove that it is indeed sound at both the level of terms and at the level of process configurations.

All lemmas and theorems reported in this paper are formalized in Coq [The Coq Development Team 2020]. All examples can be compiled into C programs using our prototype compiler where concurrent processes are implemented using POSIX threads. The compiler implements advanced language features such dependent pattern matching and functional in-place programming [Lorenzen et al. 2023] for linear types. Proofs, source code, and examples are available in our git repository<sup>1</sup>.

In summary, we make the following contributions:

- We extend the Two-Level Linear dependent type theory (TLL) with session type based concurrency, forming the language of  $\text{TLL}_C$ .  $\text{TLL}_C$  inherits the strengths of TLL such as Martin-Löf style linear dependent types and the ability to control program erasure.
- We develop a novel formulation of intuitionistic session types through a clear separation of protocols and channel types. We believe this formulation to be widely applicable for integrating session types into other functional languages.
- We study the meta-theoretical properties of  $\text{TLL}_C$ . We show that  $\text{TLL}_C$ , as a term calculus, possesses desirable properties such as confluence and subject reduction and, as a process calculus, guarantees communication safety.
- The entire calculus, with its meta-theorems, is formalized in Coq.
- We implement a prototype compiler which compiles  $\text{TLL}_C$  into safe and efficient C code.

<sup>1</sup>TODO

## 2 OVERVIEW OF DEPENDENT SESSION TYPES

Session types in  $TLL_C$  are *minimalistic* in design and yet surprisingly expressive due to the presence of dependent types. Through examples, we provide an overview of how dependent session types facilitate certified concurrent programming in  $TLL_C$ .

### 2.1 Message Specification

An obvious, but important, use of dependent session types is the precise specification of message properties communicated between parties. This is useful in practical network systems where the content of messages may depend on the value of a prior request. Consider the following protocol:

$$!(sz : \text{nat}). ?(msg : \text{bytes}). ?\{ \text{sizeOf}(msg) = sz \}. \mathbf{1}$$

Informally speaking, this protocol first expects a natural number  $sz$  to be sent followed by receiving a byte string  $msg$ . In simple session type systems without dependency, there would be no way of specifying the relationship between  $sz$  and  $msg$ . However, dependent session types allow us to express relations between messages. Notice in the third interaction expected by the protocol, the party sending  $msg$  must provide a *proof* that the size of  $msg$  is indeed  $sz$  according to an agreed upon  $\text{sizeOf}$  function. Finally, the protocol terminates with  $\mathbf{1}$  and communication ends. Notice that the proof here, as indicated by the curly braces, is a *ghost message*: it is used for type checking and erased prior to runtime. Even though the proof does not participate in actual communication, the necessity for the send of  $msg$  to provide such a proof ensures that the protocol is followed correctly.

This example showcases the main primitives for constructing dependent protocols in  $TLL_C$ : the  $!(x : A).B$  and  $?(x : A).B$  *protocol actions*. The syntax of these constructs take inspiration from binary session types [Gay and Vasconcelos 2010; Wadler 2012] and label dependent session types [Thiemann and Vasconcelos 2019], however the meaning of these constructs in  $TLL_C$  is subtly different. In prior works, the  $!$  marker indicates that the channel is to send and the  $?$  marker indicates that the channel is to receive. In  $TLL_C$ , neither marker expresses sending or receiving per se, but rather an abstract action that needs to be interpreted through a *channel type*. Hence, the description of the messaging protocol above is stated to be informal. To assign a precise meaning to the protocol, we need to view it through the lenses of channel types:

$$\begin{aligned} \mathbf{ch} & \langle !(sz : \text{nat}). ?(msg : \text{bytes}). ?\{ \text{sizeOf}(msg) = sz \}. \mathbf{1} \rangle \\ \mathbf{hc} & \langle !(sz : \text{nat}). ?(msg : \text{bytes}). ?\{ \text{sizeOf}(msg) = sz \}. \mathbf{1} \rangle \end{aligned}$$

Here, these two channel types are constructed using *dual* channel type constructors:  $\mathbf{ch}\langle \cdot \rangle$  and  $\mathbf{hc}\langle \cdot \rangle$ . The  $\mathbf{ch}\langle \cdot \rangle$  constructor interprets  $!$  as sending and  $?$  as receiving while the  $\mathbf{hc}\langle \cdot \rangle$  constructor interprets  $!$  as receiving and  $?$  as sending. In other words, dual channel types interpret protocol actions in opposite ways. These constructors act similarly to the duality of left and right rules for intuitionistic session types [Caires and Pfenning 2010]. Unlike intuitionistic session types which require the base type system to be based on sequent calculus, our channel types can be integrated into the type systems of functional languages so long as linear types are supported.

### 2.2 Dependent Ghost Secrets

Dependent ghost messages have interesting applications when it comes to message specification. Consider the following encoding of a idealized Shannon cipher protocol:

$$\begin{aligned} H(E, D) &:= \forall \{k : \mathcal{K}\} \{m : \mathcal{M}\} \rightarrow D(k, E(k, m)) =_{\mathcal{M}} m \quad (\text{correctness property}) \\ \mathcal{E}(E, D) &:= \{k : \mathcal{K}\}. \{m : \mathcal{M}\}. !(c : C). \{H(E, D) \times (c =_C E(k, m))\}. \mathbf{1} \end{aligned}$$

Given public encryption and decryption functions  $E : \mathcal{K} \times \mathcal{M} \rightarrow C$  and  $D : \mathcal{K} \times C \rightarrow \mathcal{M}$  respectively, the protocol  $\mathcal{E}(E, D)$  begins by sending ghost messages: key  $k$  of type  $\mathcal{K}$  and message

$m$  of type  $\mathcal{M}$ . Next, the ciphertext  $c$  of type  $C$ , indicated by round parenthesis, is actually sent to the client. Finally, the last ghost message sent is a proof object witnessing the correctness property of the protocol:  $c$  is obtained by encrypting  $m$  with key  $k$ . Observe that for the overall protocol, *only* ciphertext  $c$  will be sent at runtime while the other messages (secrets) are erased. The Shannon cipher protocol basically forces communicated messages to always be encrypted and prevents the accidental leakage of plaintext.

It is important to note that ghost messages and proof specifications, by themselves, are *not* sufficient to guaranteeing semantic security. An adversary can simply use a different programming language and circumvent the proof obligations imposed by  $\text{TLL}_C$ . However, these obligations are useful in ensuring that honest parties correctly follow *trusted* protocols to defend against attackers. For example, in the Shannon cipher protocol above, an honest party is required by the type system to send a ciphertext that is indeed encrypted from the (trusted) algorithm  $E$ .

Another, more concrete, example of using ghost messages to specify secrets is the Diffie-Hellman key exchange [Diffie and Hellman 1976] protocol defined as follows:

$$\text{DH}(p \ g : \text{int}) := !\{a : \text{int}\}. !(A : \text{int}). !\{A = \text{powm}(g, a, p)\}. \\ ?\{b : \text{int}\}. ?(B : \text{int}). ?\{B = \text{powm}(g, b, p)\}. \mathbf{1}$$

The DH protocol is parameterized by publicly known integers  $p$  and  $g$ . Without loss of generality, we refer to the message sender for the first row of the protocol as Alice and the message sender for the second row as Bob. From Alice's perspective, she first sends her secret value  $a$  as a dependent ghost message to initialize her half of the protocol. Next, her public value  $A$  is sent as a real message to Bob along with a proof that  $A$  is correctly computed from values  $p, g$  and  $a$  (using modular exponentiation  $\text{powm}$ ). At this point, Alice has finished sending messages and waits for message from Bob to complete the key exchange. She first "receives" Bob's secret  $b$  as a ghost message which initializes Bob's half of the protocol. Later, Bob's public value  $B$  is received as a real message along with a proof that  $B$  is correctly computed from  $p, g$  and  $b$ . Notice that between Alice and Bob, the only the real messages  $A$  and  $B$  will be exchanged at runtime. The secret values  $a$  and  $b$  and the correctness proofs are all ghost message that are erased prior to runtime. Basically, the DH protocol forces communication between Alice and Bob to be encrypted and maintain secrecy at runtime.

<pre>def Alice (a p g : int) (c : <b>ch</b>(DH(p, g))) : C(unit) :=   let c ← <b>send</b> c {a} in   let c ← <b>send</b> c (powm(g, a, p)) in   let c ← <b>send</b> c {refl} in   let ⟨{b}, c⟩ ← <b>recv</b> c in   let ⟨B, c⟩ ← <b>recv</b> c in   let ⟨{pf}, c⟩ ← <b>recv</b> c in   <b>close</b>(c)</pre>	<pre>def Bob (b p g : int) (c : <b>hc</b>(DH(p, g))) : C(unit) :=   let ⟨{a}, c⟩ ← <b>recv</b> c in   let ⟨A, c⟩ ← <b>recv</b> c in   let ⟨{pf}, c⟩ ← <b>recv</b> c in   let c ← <b>send</b> c {b} in   let c ← <b>send</b> c (powm(g, b, p)) in   let c ← <b>send</b> c {refl} in   <b>wait</b>(c)</pre>
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The DH key exchange protocol can be implemented through two simple monadic programs Alice and Bob as shown above. The  $C$  type constructor here is the concurrency monad for integrating the *effect* of concurrent communication with the *pure* functional core of  $\text{TLL}_C$ . There are two kinds of send (and respectively recv) operations at play here. The first kind, indicated by  $\text{send } c \{v\}$  is for sending a ghost message  $v$  on channel  $c$ . After type checking, these ghost sends are compiled to no-ops so that they do not participate in runtime communication. The second kind, indicated by  $\text{send } c (v)$ , is for sending a real message  $v$  on channel  $c$ . These real sends are compiled to actual messages in the generated code. Finally, the close and wait operations synchronize the termination of the protocol. Notice that the duality of channel types  $\mathbf{ch}\langle\text{DH}(p, g)\rangle$  and  $\mathbf{hc}\langle\text{DH}(p, g)\rangle$  ensure that

every send in Alice is matched by a corresponding receive in Bob and vice versa. Moreover, Alice and Bob are enforced by the type checker to correctly carry out the Diffie-Hellman key exchange.

### 3 RELATIONAL VERIFICATION VIA DEPENDENT SESSION TYPES

Earlier in the introduction section, we showed a sketch of how dependent session types can be used for certified concurrent programming through the example of a concurrent queue. In this section, we provide a detailed account of how we can use dependent session types to construct a generic map-reduce system. Similarly to the queue example, we will verify the correctness of the map-reduce system by relating it to sequential operations on trees.

#### 3.1 Construction of Map-Reduce

Map-reduce is a commonly used programming model for processing large data sets in parallel. Initially, map-reduce creates a tree of concurrently executing workers as illustrated in Figure 1. The client partitions the data into smaller chunks and sends them to the leaf workers of the tree. Next, each leaf worker applies a user-specified function  $f$  to each of its received data chunks and sends the results to its parent worker. When an internal worker receives results from its children, it combines the results using another user-specified binary function  $g$ . This procedure continues until the root worker computes the final result and sends it back to the client. Due to the fact that workers without data dependencies can operate concurrently, the overall system can achieve significantly better performance than sequential implementations of the same operations.



Fig. 1. Tree Diagram of Map-Reduce

The first step in constructing the map-reduce system is to build a model of our desired computation in a sequential setting. For this purpose, we define a simple binary tree inductive type:

**inductive** tree  $(A : \mathcal{U}) := \text{Leaf} : A \rightarrow \text{tree}(A) \mid \text{Node} : \text{tree}(A) \rightarrow \text{tree}(A) \rightarrow \text{tree}(A)$

**def** map  $: \forall \{A B : \mathcal{U}\} (f : A \rightarrow B) \rightarrow \text{tree}(A) \rightarrow \text{tree}(B)$

| Leaf  $x \Rightarrow \text{Leaf } (f x)$

| Node  $l r \Rightarrow \text{Node } (\text{map } f l) (\text{map } f r)$

**def** reduce  $: \forall \{A B : \mathcal{U}\} (f : A \rightarrow B) (g : B \rightarrow B \rightarrow B) \rightarrow \text{tree}(A) \rightarrow B$

| Leaf  $x \Rightarrow f x$

| Node  $l r \Rightarrow g (\text{reduce } f g l) (\text{reduce } f g r)$

In this definition, the type  $\mathcal{U}$  of  $A$  is the universe of *unbound* (i.e. non-linear) types in  $\text{TLL}_{\mathcal{C}}$ . So tree is parameterized by  $A$  which represents the type of data stored at the leaf nodes. The *sequential* map and reduce functions for tree are all defined in a standard way.

To construct the concurrent map-reduce system, we must define the kinds of operations that can be performed. This requires the protocol of map-reduce to branch depending on what operation the client requests to perform. Unlike many prior session type systems [Caires and Pfenning 2010; Das and Pfenning 2020] which provide built-in constructs (e.g.  $\oplus$  and  $\&$ ) for internal and external choice, we implement branching protocols using just dependent protocols and type-level pattern matching



on sent or received messages. For our map-reduce system, we define the kinds of operations that can be performed through the inductive type `opr`:

```
inductive opr(A : U) := Map : ∀{B : U} (f : A → B) → opr(A)
                      | Reduce : ∀{B : U} (f : A → B) (g : B → B → B) → opr(A)
                      | Free : opr(A)
```

The `opr` type has three constructors:

- Map  $f$  represents a map operation that applies the function  $f : A \rightarrow B$  to each element of type  $A$  and produces results of type  $B$ .
- Reduce  $f g$  represents a reduce operation that first applies the function  $f : A \rightarrow B$  to each element of type  $A$  and then combines the results using the binary function  $g : B \rightarrow B \rightarrow B$ .
- Free is the command that terminates the concurrent tree.

We are now ready to define the session type for the map-reduce protocol. The following `treeP` protocol is used to describe the interactions between nodes in the map-reduce tree.

```
def treeP (A : U) (t : tree A) := ?(o : opr A).
  match o with
  | Map _ f => treeP B (map f t)
  | Reduce _ f g => !(sing (reduce f g t)). treeP t
  | Free => 1
```

For each node  $n$  in the concurrent tree, it will be providing a channel of type  $\mathbf{ch}\langle \text{treeP } A \ t \rangle$  to its parent. The parameter  $t$  of type `tree A` represents the shape of the sub-tree rooted at  $n$ . The `treeP` protocol states node  $n$  will receive a message  $o$  of type `opr A` from its parent. The protocol then branches, via type-level pattern matching on  $o$ , into three cases. If  $o$  is of the form `Map f`, then  $n$  will continue the protocol as `treeP B (map f t)`. Notice that the type parameter of `treeP` has changed from  $A$  to  $B$  to reflect the fact that the data stored at the leaves of the sub-tree has been transformed from type  $A$  to type  $B$ . Furthermore, the shape of the sub-tree has also changed from  $t$  to `map f t`. In the second case where  $o$  is of the form `Reduce f g`,  $n$  will first send the result of type `sing (reduce f g t)` to its parent. The type `sing x` is the *singleton type* whose sole inhabitant is the element  $x$ . After sending the result,  $n$  will continue the protocol as `treeP t`, i.e. remains unchanged. Finally,  $n$  will terminate the protocol when  $o$  is `Free`.

Using the `treeP` protocol, we can now implement the worker processes that run at each node of the concurrent tree. The implementation of a leaf worker is shown below. We have elided uninteresting technical details regarding dependent pattern matching.

```
def leafWorker {A : U} (x : A) (c : ch⟨treeP A (Leaf x)⟩) : C(unit) :=
  let ⟨o, c⟩ := recv c in
  match o with
  | Map => leafWorker {B} (f x) c
  | Reduce => let c ← send c (just (f x)) in leafWorker {A} x c
  | Free => close(c)
```

The `leafWorker` function takes two non-ghost arguments: a data element  $x$  of type  $A$  and a channel  $c$  of type  $\mathbf{ch}\langle \text{treeP } A \ (\text{Leaf } x) \rangle$ . Through this channel  $c$ , the leaf worker will receive requests from its parent and provide responses accordingly. For instance, when the leaf worker receives a `Map f` request, it will apply  $f : A \rightarrow B$  to its data element  $x$  and continue as a leaf worker with the new data element  $f x$ . In this case, the type parameter of `leafWorker` has changed from  $A$  to  $B$  to reflect the transformation of the data element.

To represent internal node workers we implement the following `nodeWorker` function. This function takes (non-ghost) channels  $c_l$  and  $c_r$  of types  $\mathbf{hc}\langle \text{treeP } A \ l \rangle$  and  $\mathbf{hc}\langle \text{treeP } A \ r \rangle$  for communicating with its left and right children. Notice that the types of these channels are indexed by ghost

values  $l$  and  $r$  of type  $\text{tree } A$  which represent the shapes of the concurrent sub-trees providing  $c_l$  and  $c_r$ . The nodeWorker communicates with its parent through the channel  $c$  whose type is indexed by the ghost value  $\text{Node } l \ r$ .

```

def nodeWorker {A : U} {l r : tree A}
  (c_l : hc<treeP A l>) (c_r : hc<treeP A r>) (c : ch<treeP A (Node l r)>) : C(unit) :=
  let <o, c> := recv c in
  match o with
  | Map _ f =>
    let c_l <- send c_l (Map f) in
    let c_r <- send c_r (Map f) in
    let c <- send c (just unit) in
    nodeWorker {B} {(map f l) (map f r)} c_l c_r c
  | Reduce _ f g =>
    let c_l <- send c_l (Reduce f g) in
    let c_r <- send c_r (Reduce f g) in
    let <just v_l, c_l> <- recv c_l in
    let <just v_r, c_r> <- recv c_r in
    let c <- send c (just (g v_l v_r)) in
    nodeWorker {A} {l r} c_l c_r c
  | Free =>
    let c_l <- send c_l Free in
    let c_r <- send c_r Free in
    wait(c_l); wait(c_r); close(c)

```

Given the signature of nodeWorker and the definition of the treeP protocol, it is not hard to see that the implementation of nodeWorker is constrained to function exactly as intended. For instance, in the case where nodeWorker receives a Map  $f$  request from its parent, the type of  $c$  becomes  $\text{ch}<\text{treeP } B \ (\text{map } f \ (\text{Node } l \ r))>$  which simplifies to  $\text{ch}<\text{treeP } B \ (\text{Node } (\text{map } f \ l) \ (\text{map } f \ r))>$ . The shapes of the left and right sub-trees after the map operation need to become  $\text{map } f \ l$  and  $\text{map } f \ r$  respectively. In other words, the type of  $c$  forces the nodeWorker process to recursively send the Map  $f$  request to both of its children to transform them into sub-trees of type  $\text{hc}<\text{treeP } B \ (\text{map } f \ l)>$  and  $\text{hc}<\text{treeP } B \ (\text{map } f \ r)>$ .

### 3.2 A Certified Interface for Map-Reduce

Now that we have defined both leaf and internal node workers, we can wrap them up into a more convenient interface as presented below.

```

type cTree (A : U) (t : tree A) := C(hc<treeP t>)
def cLeaf {A : U} (x : A) : cTree A (Leaf x) :=
  fork(c : ch<treeP A (Leaf x)>) with leafWorker x c
def cNode {A : U} {l r : tree A} (c_l : cTree A l) (c_r : cTree A r) : cTree (Node l r) :=
  let c_l <- c_l in
  let c_r <- c_r in
  fork(c : ch<treeP A (Node l r)>) with nodeWorker c_l c_r c

```

The type alias cTree is defined to aid in the readability of the interface. The wrapper functions cLeaf and cNode respectively create leaf and internal node workers. This is accomplished by *forking* a new process using the **fork** construct of the concurrency monad. In particular, when given some a channel type  $\text{ch}<P>$ , the **fork** construct will create a new channel and give one end of it to the caller



at type  $\mathbf{hc}\langle P \rangle$  and spawn a new process that runs the worker with the other end of the channel at type  $\mathbf{ch}\langle P \rangle$ . The duality of the channels types allows the caller and the worker to communicate. Using these wrapper functions, one can construct a concurrent tree in virtually the same way as one would construct a sequential tree. For example, the following code constructs a concurrent tree with four leaf nodes containing integers 0, 1, 2 and 3 respectively.

```
cNode (cNode (cLeaf 0) (cLeaf 1)) (cNode (cLeaf 2) (cLeaf 3))
```

The type of this expression is rather verbose to write manually as it contains the full shape of the concurrent tree. This is not a problem in practice as *constant* type arguments (such as the tree shapes here) can almost always be inferred automatically by the type checker.

Finally, we implement the `cMap` and `cReduce` functions that provide the map and reduce operations on concurrent trees. These functions are implemented by simply sending the appropriate requests to the root worker of the concurrent tree.

```
def cMap {A B : U} {t : tree A} (f : A → B) (c : cTree A t) : cTree B (map f t) :=
  let c ← c in
  let c ← send c (Map f) in
  return c

def cReduce {A B : U} {t : tree A} (f : A → B) (g : B → B → B) (c : cTree A t) :
  C(sing (reduce f g t) ⊗ cTree A t) :=
  let c ← c in
  let c ← send c (Reduce f g) in
  let ⟨v, c⟩ ← recv c in
  return ⟨v, return c⟩
```

From the type signature of `cMap`, we can see that it takes a function  $f$  and a concurrent tree of type `cTree A t` and returns a new concurrent tree of type `cTree B (map f t)`. In other words, the type of `cMap` guarantees that the shape of the concurrent tree is transformed in the same way as its sequential tree model under the map function. Similarly, the `cReduce` takes a concurrent tree of type `cTree A t` and returns a (linear) pair consisting of the result of type `sing (reduce f g t)`, and the original concurrent tree. The correctness of `cReduce` is guaranteed by the singleton type of its result: reducing a concurrent tree results in the same value as reducing its sequential tree model.

### 3.3 Concurrent Mergesort via Map-Reduce

By properly instantiating the map-reduce interface defined previously, we can implement more complex concurrent algorithms. Moreover, dependent session types allows us to easily verify the correctness of these derived concurrent algorithms relationally through their sequential models. As an extended example, we implement a concurrent version of the mergesort algorithm using the map-reduce interface and verify its correctness.

We define sequential `msort`, as a model of our concurrent implementation, in the usual way using split and merge functions. We will not go into further details regarding the well-founded recursion of `msort` or the correctness of sorting as these are textbook results [Chlipala 2013].

```
def split (xs : list int) : list int ⊗ list int := ...
def merge (xs ys : list int) : list int := ...

def msort (xs : list int) : list int := match xs with
| nil ⇒ nil
| x :: nil ⇒ x :: nil
| zs ⇒ let ⟨xs, ys⟩ := split zs in merge (msort xs) (msort ys)
```

Generally, to implement an algorithm using the map-reduce paradigm, one must first decompose the algorithm and data into a form that is amenable to parallelization. For mergesort, the input list can be recursively split into smaller sub-lists which can be processed in parallel. To make this decomposition *explicit*, we define the following `splittingTree` function that constructs a binary tree representation of how the input list is split by the mergesort algorithm.

```
def splittingTree (xs : list int) : tree (list int) := match xs with
  | nil  $\Rightarrow$  Leaf nil
  | x :: nil  $\Rightarrow$  Leaf (x :: nil)
  | zs  $\Rightarrow$  let <xs, ys> := split zs in Node (splittingTree xs) (splittingTree ys)
```

Given a list of integers `xs`, we need to construct a concurrent representation of its splitting tree with type `cTree (list int) (splittingTree xs)`. While it is tempting to directly convert the result of `splittingTree` into a concurrent tree by recursively replacing `Leaf` with `cLeaf` and `Node` with `cNode`, such an approach would require traversing both the input list (to construct the splitting tree) and then traversing the resulting tree (to convert it into a concurrent tree). This would lead to a bottleneck in the performance of the overall algorithm as the inputs would need to be traversed sequentially before any parallelism can be exploited. Instead, we define the `splittingCTree` function that constructs the concurrent splitting tree in a concurrent manner.

```
def splittingCTree (xs : list int) : ch!(cTree (list int) (splittingTree xs)). 1  $\rightarrow$  C(unit) :=
  match xs with
  | nil  $\Rightarrow$  let c  $\leftarrow$  send c (cLeaf nil) in close(c); return ()
  | x :: nil  $\Rightarrow$  let c  $\leftarrow$  send c (cLeaf (x :: nil)) in close(c); return ()
  | zs  $\Rightarrow$ 
    let <xs, ys> := split zs in
    let cl  $\leftarrow$  fork(c) with splittingCTree xs c in
    let cr  $\leftarrow$  fork(c) with splittingCTree ys c in
    ...
```

The `splittingCTree` function takes an additional channel argument `c` which is used to send back the constructed concurrent tree to its caller. This small change allows the recursive case to fork two new processes to construct the left and right sub-trees concurrently. After both sub-trees have been constructed, the parent process can then combine them into a single concurrent tree using `cNode` and send it back to its caller. Notice that `splittingCTree` never calls the sequential `splittingTree` function and only uses it at the type level to model the shape of the concurrent tree being constructed. The complete implementation of `splittingCTree` can be found in the supplementary materials but is shortened here for brevity.

Now that we have constructed a concurrent splitting tree of our input list, we can apply the `cReduce` operation instantiated with  $f := \lambda(x).x$  and  $g := \text{merge}$  to perform merging in parallel. This gives us an output of type

$$C(\text{sing} (\text{reduce} (\lambda(x).x) \text{merge} (\text{splittingTree } xs)) \otimes \text{cTree} (\text{list int}) (\text{splittingTree } xs))$$

Note that the singleton value `sing (reduce (λ(x).x) merge (splittingTree xs))` returned by the monad *relationally* describes this series of concurrent computations using just sequential operations. This allows us to easily verify the correctness of our concurrent mergesort implementation by proving the following *theorem* (in the internal logic of TLL) which states that reducing the splitting tree is equivalent to performing mergesort on the original input list.

```
theorem reduceSplittingTree :
   $\forall (xs : \text{list int}). \text{reduce} (\lambda(x).x) \text{merge} (\text{splittingTree } xs) = \text{msort } xs$ 
```

Using this theorem, we can rewrite the singleton value returned by `cReduce` to `sing (msort xs)`. In other words, the result of our concurrent mergesort implementation is guaranteed to be exactly the same as that of the sequential mergesort algorithm, thus completing our verification.

The full pipeline of concurrent mergesort is given in the following `cMSort` function.

```
def cMSort (xs : list int) : C(sing (msort xs)) :=
  let c ← fork(c) with splittingCTree xs c in
  let ⟨ctree, c⟩ ← recv c in wait c;
  let ⟨v, ctree⟩ ← cReduce (λ(x).x) merge ctree in
  let ctree ← send ctree Free in wait ctree;
  return (rewrite[reduceSplittingTree] v)
```

## REFERENCES

- Luis Caires and Frank Pfenning. 2010. Session Types as Intuitionistic Linear Propositions. 222–236. [https://doi.org/10.1007/978-3-642-15375-4\\_16](https://doi.org/10.1007/978-3-642-15375-4_16)
- Adam Chlipala. 2013. *Certified Programming with Dependent Types: A Pragmatic Introduction to the Coq Proof Assistant*. The MIT Press.
- Ankush Das and Frank Pfenning. 2020. Verified Linear Session-Typed Concurrent Programming. In *Proceedings of the 22nd International Symposium on Principles and Practice of Declarative Programming (Bologna, Italy) (PPDP '20)*. Association for Computing Machinery, New York, NY, USA, Article 7, 15 pages. <https://doi.org/10.1145/3414080.3414087>
- W. Diffie and M. Hellman. 1976. New directions in cryptography. *IEEE Transactions on Information Theory* 22, 6 (1976), 644–654. <https://doi.org/10.1109/TIT.1976.1055638>
- Qiancheng Fu and Hongwei Xi. 2023. A Two-Level Linear Dependent Type Theory. arXiv:2309.08673 [cs.PL]
- Simon Gay and Vasco Vasconcelos. 2010. Linear type theory for asynchronous session types. *J. Funct. Program.* 20 (01 2010), 19–50. <https://doi.org/10.1017/S0956796809990268>
- Simon J. Gay, Peter Thiemann, and Vasco Thudichum Vasconcelos. 2020. Duality of Session Types: The Final Cut. *ArXiv abs/2004.01322* (2020), 23–33.
- Kohei Honda. 1993. Types for Dyadic Interaction. In *CONCUR*.
- Anton Lorenzen, Daan Leijen, and Wouter Swierstra. 2023. FP<sup>2</sup>: Fully in-Place Functional Programming. *Proc. ACM Program. Lang.* 7, ICFP, Article 198 (aug 2023), 30 pages. <https://doi.org/10.1145/3607840>
- The Coq Development Team. 2020. *The Coq Proof Assistant, version 8.11.0*. <https://doi.org/10.5281/ZENODO.3744225>
- Peter Thiemann and Vasco T. Vasconcelos. 2019. Label-Dependent Session Types. *Proc. ACM Program. Lang.* 4, POPL, Article 67 (dec 2019), 29 pages. <https://doi.org/10.1145/3371135>
- Philip Wadler. 2012. Propositions as Sessions. In *Proceedings of the 17th ACM SIGPLAN International Conference on Functional Programming (Copenhagen, Denmark) (ICFP '12)*. Association for Computing Machinery, New York, NY, USA, 273–286. <https://doi.org/10.1145/2364527.2364568>