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It is a neat result from functional programming that libraries of *parser combinators* can support rapid construction of decoders for quite a range of formats. With a little more work, the same combinator program can denote both a decoder and an encoder. Unfortunately, the real world is full of gnarly formats, as with the packet formats that make up the standard Internet protocol stack. Most past parser-combinator approaches cannot handle these formats, and the few exceptions require redundancy – one part of the natural grammar needs to be hand-translated into hints in multiple parts of a parser program. We show how to recover very natural and nonredundant format specifications, covering all popular network packet formats and generating both decoders and encoders automatically. The catch is that we use the Coq proof assistant to derive both kinds of artifacts using tactics, automatically, in a way that guarantees that they form inverses of each other. We used our approach to reimplement packet processing for a full Internet protocol stack, inserting our replacement into the OCaml-based MirageOS unikernel, resulting in minimal performance degradation.

CCS Concepts: • Software and its engineering \rightarrow Domain specific languages.

Additional Key Words and Phrases: Deductive Synthesis, Parser Combinators, Program Synthesis, Serialization and Deserialization

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1 INTRODUCTION

Decoders and encoders are vital components of any software that communicates with the outside world. Accordingly, functions that process untrusted data represent a key attack surface for malicious actors. Failures to produce or interpret standard formats routinely result in data loss, privacy violations, and service outages in deployed systems [CVE 2013a,b, 2015]. In the case of formally verified systems, bugs in encoder and decoder functions that live in the unverified, trusted code have been shown to invalidate the entire assurance case [Fonseca et al. 2017]. There are no shortage of code-generation frameworks [Apache Software Foundation 2016; Back 2002; Bangert and Zeldovich 2014; Dubuisson 2001; Fisher and Gruber 2005; Fisher et al. 2006; Johnson 1979; McCann and Chandra 2000; Pang et al. 2006; Parr and Quong 1995; Srinivasan 1995; Varda 2008] that aim to reduce opportunities for user error in writing encoders and decoders, but these systems are quite tricky to get right and have themselves been sources of serious security bugs [CVE 2016].

Combinator libraries are an alternative approach to the rapid development of parsers which has proven particularly popular in the functional-programming community [Leijen and Meijer 2001]. This approach has been adapted to generate both parsers and pretty printers from single

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programs [Kennedy 2004; Rendel and Ostermann 2010]. Unfortunately, unverified combinator libraries suffer from the same potential for bugs as code-generation frameworks, with the additional possibility for users to introduce errors when extending the library with new combinators. This paper presents NARCISSUS, a combinator-style framework for the Coq proof assistant that eliminates the possibility of such bugs, enabling the derivation of encoders and decoders that are correct by construction. Each derived encoder and decoder is backed by a machine-checked functional-correctness proof, and NARCISSUS leverages Coq's proof automation to help automate both the construction of encoders and decoders and their correctness proofs. Key to our approach is how it propagates information through a derivation, in order to generate decoders and encoders for the sorts of non-context-free languages that often appear in standard networking protocols.

We begin by introducing the key features of NARCISSUS with a series of increasingly complex examples, leading to a hypothetical format of packets sent by a temperature sensor to a smart home controller. In order to build up the reader's intuition, we deliberately delay a discussion of the full details of our approach until Section 2. The code accompanying our tour is included in the NARCISSUS repository¹ in the src/Narcissus/Examples/README.v file, and can be run in Coq version 8.7.2 [The Coq Development Team 2018].

1.1 A Tour of NARCISSUS

Getting started. Our first format is extremely simple:

```
Record sensor_msg := 

{ stationID: word 8; data: word 16 }.

Let format := 

format_word o stationID

++ format_word o data.

Let invariant (msg: sensor_msg) := T.

Let enc_dec: EncDecPair format invariant := 

ltac:(derive_encoder_decoder_pair).
```

All user input is contained in box 1.1. A sensor_msg value is a record with two fields; the Coq Record command defines accessor functions for these two fields. Our format specifies how instances of this record are serialized using two format *combinators*: format_word is a NARCISSUS primitive that serializes a word bit-by-bit, and ++ is a sequencing operator (write this, then that). Our invariant specifies additional constraints on well-formed packets, although this example does not have any. The derive_encoder_decoder_pair tactic is part of the framework and automatically generates encoder and decoder functions, as well as proofs that they are correct:

```
\label{eq:linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_line
```

Boxes 1.2 and 1.3 show the generated code. In box 1.2, the encoder operates on a data value and a fixed-size byte buffer (both implicit) and returns the encoded packet, or None if it did not fit

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¹https://github.com/mit-plv/fiat/tree/narcissus-icfp2019

in the supplied buffer. In box 1.3, the decoder takes a buffer and returns a packet, or None if the buffer did not contain a valid encoding. Both generated programs live in stateful error monads (\leftarrow and \gg are the usual binding and sequencing operators), offering primitives to read and write a single byte (GetCurrentByte, SetCurrentByte). The encoder uses the \gg reverse-composition operator (a \gg b \equiv b \circ a) to pass record fields to SetCurrentByte. Since data is 16 bits long, the encoder also uses high_bits and low_bits to extract the first and last 8 bits, and the decoder reassembles them using the \cdot concatenation operator: this byte-alignment transformation is part of the derive_encoder_decoder_pair logic.

Underspecification. We now consider a twist: to align data on a 16-bit boundary, we introduce 8 bits of padding after stationID; these bits will be reserved for future use:



These eight underspecified bits introduce an asymmetry: the encoder always writes 0x00, but the decoder accepts any value. The lax behavior is crucial because the format_unused_word specification allows conforming encoders to output *any* 8-bit value; as a result, a correct decoder for this format needs to accept *all* 8-bit values. In that sense, the encoder and decoder that NARCISSUS generates are not strict inverses of each other: the encoder is one among many functions permitted by the formatting specification, and the decoder is the inverse of the *entire family* described by the format, accepting packets serialized by *any* conforming encoder.

Constants and enums. Our next enhancements are to add a version number to our format and to tag each measurement with a kind, "TEMP" or "HUMIDITY". To save space, we allocate 2 bits for the tag and 14 bits for the measurement:

```
Let kind := 3.1: User input
EnumType ["TEMP"; "HUMIDITY"].
Record sensor_msg :=
{ stationID: word 8; data: (kind * word 14) }.
```

```
Let format :=
      format_word o stationID
  ++ format_unused_word 8
  ++ format const 0b0000011111100010
  ++ format_enum [0b00; 0b01] o fst o data
  ++ format_word o snd o data.
Let invariant (msg: sensor_msg) := \top.
Let enc_dec: EncDecPair format invariant :=
  ltac:(derive_encoder_decoder_pair).
                                                                             3.2: Encoder
Let encode := encoder_impl enc_dec.
  stationID >>>> SetCurrentByte >>>
  const 0b0000000 ≫ SetCurrentByte ≫
  const 0b00000111 >>> SetCurrentByte >>
  const 0b11100010 ≫ SetCurrentByte ≫
  (\lambda \mathbf{r} \Rightarrow (\text{Vector.nth } [0b00; 0b01] \circ \text{fst} \circ \text{data}) \mathbf{r} \cdot (\text{snd} \circ \text{data}) \mathbf{r})
     >>> (high_bits 8>>> SetCurrentByte >>
          low_bits 8>>> SetCurrentByte)
                                                                             3.3: Decoder
Let decode := decoder_impl enc_dec.
  b \leftarrow GetCurrentByte;
  _ ← GetCurrentByte;
  b_1 \leftarrow GetCurrentByte;
  b' \leftarrow GetCurrentByte;
  w \leftarrow ret b_1 \cdot b';
  (if weq w 0b0000011111100010 then
      b_2 \leftarrow GetCurrentByte;
      b'_{a} \leftarrow GetCurrentByte;
      w_{\alpha} \leftarrow ret b_{2} \cdot b'_{\alpha};
      match index (high_bits 2 w<sub>0</sub>) [0b00; 0b01] with
      | Some a' \rightarrow ret {| stationID := b; data := (a', low_bits 14 w<sub>0</sub>) |}
      | None \rightarrow fail end
   else fail)
```

The use of format_const in the specification forces conforming encoders to write out the value 0x7e2, encoded over 16 bits. Any input that does not contain that exact sequence is malformed, which the generated decoder signals by throwing an exception. NARCISSUS also checks more subtle dependencies between subformats: for example, if a format were to encode the same value twice, the generated decoder will decode both values *and* check that they agree— the packet must be malformed if not. The argument passed to format_enum specifies which bit patterns to use to represent each tag (0b00 for "TEMP", 0b01 for "HUMIDITY"), and the decoder uses this mapping to reconstruct the appropriate enum member.

Lists and dependencies. Our penultimate example illustrates data dependencies and input restrictions. To do so, we replace our single data point with a list of measurements (for conciseness, we remove tags and use 16-bit words):

```
Record sensor_msg :=
{ stationID: word 8; data: list (word 16) }.
Let format :=
format_word o stationID
++ format_unused_word 8
++ format_const 0b0000011111100010
++ format_list format_word o data.
```

```
Let invariant (msg: sensor_msg) := ⊤.
Let enc_dec: EncDecPair format invariant :=
ltac:(derive_encoder_decoder_pair).
```

The format_list combinator encodes a value by simply applying its argument combinator in sequence to each element of a list. We start a derivation as before, but we quickly run into an issue: the derivation fails, leaving multiple Coq goals unsolved. The first of these shows the portion of the format where derive_encoder_decoder_pair got stuck:

CorrectDecoder (format_list format_word o data ++ ...) ?d

This goal indicates that the derivation got stuck trying to find a decoder for the list of measurements. Using an additional tactic takes us to the last unsolvable goal, which is equivalent to the following:

 \forall msg: sensor_msg, msg.(stationID) = sid \rightarrow length msg.(data) = ?Goal

The issue is that the built-in list decoder is only applicable if the number of elements to decode is known, but our format never encodes the length of the data list.

An attempt to fix this problem by including the length of data does not completely solve the problem, unfortunately (format_nat 8 o length specifies that the length should be truncated to 8 bits and written out):

Let format := format_word o stationID ++ format_nat 8 o length o data ++ format_const 0b0000011111100010 ++ format_list format_word o data.

Indeed, the decoder derivation now gets stuck on the following goal:

```
CorrectDecoder (format_nat 8 o length o data ++ ...) ?d
```

Our debugging tactic now produces the following goal:

```
\forall msg: sensor_msg, invariant msg \land msg.(stationID) = proj \rightarrow length msg.(data) < 2^{8}
```

The problem is that, since we encode the list's length in 8 bits, the round-trip property that NARCISSUS enforces only holds if the list has fewer than 2⁸ elements: larger lists have their lengths truncated, and it becomes impossible for the decoder to know for certain how many elements it should decode. What we need is an input restriction: a predicate defining which messages we may encode. To this end, we make one final adjustment:

```
6.1: User input
Let invariant (msg: sensor_msg) :=
  length (msg.(data)) < 2^8.
                                                                         6.2: Encoder
Let encode := encoder_impl enc_dec.
  stationID ≫ SetCurrentByte ≫
  data>>> Datatypes.length>>> natToWord 8>>> SetCurrentByte >>
  const 0b00000111 >>> SetCurrentByte >>
  const 0b11100010 ≫ SetCurrentByte ≫
  data \gg AlignedEncodeList (\lambda \rightarrow high_bits 8 \gg SetCurrentByte \gg
                                         low_bits 8>>>SetCurrentByte)
                                                                         6.3: Decoder
Let decode := decoder_impl enc_dec.
  b \leftarrow GetCurrentByte;
  b_{\varrho} \leftarrow GetCurrentByte;
  b_1 \leftarrow GetCurrentByte;
  b' \leftarrow GetCurrentByte;
  w \leftarrow ret b_1 \cdot b';
```

```
(if weq w 0b000011111100010 then

1 \leftarrow \text{ListAlignedDecodeM} (\lambda \_ \Rightarrow w_0 \leftarrow \text{GetCurrentByte};

w' \leftarrow \text{GetCurrentByte};

ret w_0 \cdot w') (wordToNat b_0);

ret {| stationID := b; data := 1 |}

else fail)
```

User-defined formats. Our final example illustrates a key benefit of the combinator-based approach: integration of user-defined formats and decoders. The advantage here is that NARCISSUS does not sacrifice correctness for extensibility: every derived function must be correct. This example uses a custom type for sensor readings, reading. To integrate this type into NARCISSUS, the user also supplies the format specification for this type, corresponding encoders and decoders and proofs of their correctness, and a set of tactics explaining how to integrate these pieces into a derivation. Section 5 provides the complete details on these ingredients, but for now we note that the format__reading specification is nothing more exotic than a nondeterministic function in the style of the Fiat framework [Delaware et al. 2015], and that the two lemmas are normal interactive Coq proofs.

```
7.1: User input
Inductive reading :=
  | Temperature (_ : word 14) | Humidity (_ : word 14).
Let fmt_reading m s := match m with
  | Temperature t \Rightarrow ret (serialize (0b00 \cdot t) s)
  | Humidity h \Rightarrow ret (serialize (0b01 \cdot h) s) end.
Let enc_reading := ....
Lemma enc_readingCorrect: CorrectEncoder fmt_reading enc_reading. ...
Let dec_reading := ....
Lemma dec_readingCorrect: CorrectDecoder fmt_reading dec_reading. ...
Ltac new_encoder_rules ::= apply enc_readingCorrect.
Ltac new_decoder_rules ::= apply dec_readingCorrect.
Record sensor_msg :=
  { stationID: word 8; data: list reading }.
Let format :=
     format_word • stationID
  ++ format_nat 8 o length o data
  ++ format_list fmt_reading o data.
Let invariant (msg: sensor_msg) :=
  length (msg.(data)) < 2^{\circ}.
Let enc_dec: EncDecPair format invariant :=
  ltac:(derive_encoder_decoder_pair).
```

Wrapping up. In NARCISSUS, users specify formats using a library of combinators and use tactics to derive correct-by-construction encoder and decoder functions automatically from these specifications. Formats may be underspecified, in that a particular source value may be serialized in different ways, but decoders are guaranteed to interpret all of them correctly. Formats may induce dependencies between subformats; the derivation procedure is responsible for tracking these dependencies when generating a decoder. Finally, a user can extend NARCISSUS with new formats and datatypes by providing a few simple ingredients; extensions are guaranteed not to compromise the correctness of derived functions.

To more precisely summarize this paper's contributions:

- We develop specifications of correctness for encoders and decoders, keyed on a common nondeterministic format.
- We show how encoder and decoder combinators can be verified modularly, even when their correctness depends on the contexts in which they are used, in a way that enables compositional verification of composite encoders and decoders built from combinators.
- We show how to derive correct-by-construction encoders and decoders via interactive proof search using libraries of verified combinators, and we provide proof tactics to automate the process in a way that supports extension without compromising soundness.
- We demonstrate how a two-phase approach that iteratively refines bit-level specifications into byte-level functions can enable both clean specifications and efficient implementations.

We demonstrate the applicability of NARCISSUS by deriving packet processors for a full Internet protocol stack, which required the addition of a checksum combinator. Inserting our replacement into the OCaml-based MirageOS unikernel results in minimal performance degradation.

We pause briefly here to contrast the design choices made by NARCISSUS with other approaches to serializing and deserializing data, with a more detailed discussion deferred to Section 7. There has been a particular focus on formally verifying parsers and pretty printers for programming-language ASTs as parts of compiler frontends [Barthwal and Norrish 2009; Jourdan et al. 2012; Koprowski and Binsztok 2011] or to carry out binary analysis [Morrisett et al. 2012; Tan and Morrisett 2018]. One of the target applications of NARCISSUS is formally verified distributed systems, and the restriction to context-free languages (as found in those tools) disallows many of the standard network formats such applications require.

NARCISSUS has a similar motivation to bidirectional programming languages [Bohannon et al. 2008; Mu et al. 2004] in which programs can be run "in reverse" to map target values to the source values that produced them. The bidirectional programming language Boomerang adopts a similar combinator-based approach to deriving transformations between target and source values. Invertibility is an intrinsic property of a bidirectional language, so new combinators require extensions to its metatheory. In contrast, proofs of correctness are built alongside functions in NARCISSUS, allowing the framework to be augmented safely by including a proof justifying a new implementation strategy as part of an extension.

We now present the complete details of NARCISSUS in a more bottom-up fashion, before discussing our evaluation and a more detailed comparison with related work. For readability, some of the names below differ from those used in NARCISSUS's source code; we provide a correspondence table in the README.md file included in the distribution.

2 NARCISSUS, FORMALLY

We begin our ground-up explanation of NARCISSUS with the definition of the *formats* that capture relationships between structured source values and their serialized representations. The signature of a format from source type S to target type T with state type Σ is defined by a type alias:

Format M S T $\Sigma :=$ Set of (S $\times \Sigma \times T \times \Sigma$)

That is, a format is a quaternary relation on source values, initial states, target values, and final states. Including states allows us to specify a rich set of formats, including DNS packets (Section 2.1). As hinted at by the M suffix, FormatM can be interpreted as a combination of the nondeterminism and state monads.

The format combinators showcased in Section 1.1 have straightforward definitions using standard set operations. The ++ combinator sequences its subformats using a monoid operation \cdot provided by its target type.

Format	Higher-order?	Format	Higher-order?
Boolean	no	Fixed-Length Word	no
Peano Number	no	Unspecified BitString	no
Variable-Length List	yes	Fixed-Length List	yes
Variable-Length String	no	Fixed-Length String	no
Option Type	yes	ASCII Character	no
Enumerated Type	no	Variant Type	yes

Fig. 1. Formats for base types included in NARCISSUS.

 $(s, \sigma, t, \sigma') \in format_1 + format_2 \equiv$

 $\exists t_1 t_2 \sigma''. (s, \sigma, t_1, \sigma'') \in format_1 \land (s, \sigma'', t_2, \sigma') \in format_2 \land t = t_1 \cdot t_2$

The function-composition combinator \circ is actually defined via the more elementary \odot combinator. This combinator uses a relation, R, to format a projection of the source domain:

$$(s, \sigma, t, \sigma') \in \text{format} \odot R \equiv \exists s'. (s', \sigma, t, \sigma') \in \text{format} \land R s s'$$

Underspecified formats can be built by combining \odot with a choice operator, as in the format for unused words:

format_unused_word \equiv format_word $\odot \{(_, _) \mid \top\}$

In addition to \circ , \odot is used to define the \cap combinator that restricts the source values included in a format:

$$\begin{array}{rcl} format \circ f &\equiv& format \odot \{(s,s') \mid s' = f \ s\} \\ P \cap format &\equiv& format \odot \{(s,s') \mid P \ s \land s = s' \end{array}$$

Another helpful higher-order combinator is Union, which is useful for defining formats with variant encodings, e.g. Ethernet frames:

 $(s, \sigma, t, \sigma') \in \text{format}_1 \cup \text{format}_2 \equiv (s, \sigma, t, \sigma') \in \text{format}_1 \vee (s, \sigma, t, \sigma') \in \text{format}_2$ While not very useful for user-defined formats, the empty format ϵ is helpful in the specifications of encoder and decoder combinators:

 $(s, \sigma, t, \sigma') \in \epsilon \equiv t = \iota \land \sigma = \sigma'$

For clarity, we have presented these combinators in point-free style, but the monad formed by FormatM also admits definitions in a pointed style, which can be more convenient for defining base formats like format_reading. In addition to the standard **return** and **bind** ($_ \leftarrow _$; $_$) operators, this monad includes a set-comprehension operator { x | P x }, which specifies a set via a defining property P on possible return values. The three operators have straightforward interpretations as sets [Delaware et al. 2015]:

$$e \in \mathbf{return} \ v \equiv e = v$$
$$e \in \{x \mid Px\} \equiv Pe$$
$$e \in x \leftarrow y; kx \equiv \exists e'. e' \in y \land e \in ke'$$

As an example, we can specify the set of all possible locations of a period in a string s as:

 $s_1 \leftarrow \{ s_1 : \text{String } | \exists s_2. s = s_1 + "." + s_2 \}; \text{ return } (\text{length } s_1)$

In addition to enabling users to define their own formats in a familiar monadic style, the nondeterminism monad integrates nicely with Coq's rewriting machinery when deriving correct encoders. NARCISSUS includes a library of formats for the standard types listed in Figure 1, most of which have pointed definitions.

We have left the definition of the target type of our formats underspecified until now. Either *bitstrings* or *bytestrings*, i.e. lists of bits or bytes, would be natural choices, each with its own

advantages and disadvantages. Bitstrings have a conceptually cleaner interface that allows users to avoid byte-alignment considerations. As an example, the format in box 3.1 can simply sequence 14-bit and 2-bit words, while a byte-aligned specification would require splitting the first word into 8- and 6-bit words, combining the latter with the 2-bit word. Unfortunately, true bitstrings are quite removed from the byte buffers used in real systems, requiring bit-shifting to enqueue bits one at a time. NAR-CISSUS attempts to split the difference by using the bitstring abstract data type presented in Figure 2 for the target type of formats. Clients can treat a BitString value as a bitstring equipped with operations governed by algebraic laws for monoids and queues, while its actual representation type is closer to that of a bytestring. Section 4 details how our derivation procedures

ADT BitString { **Definition** *ι* : BitString; **Definition** \cdot : BitString \rightarrow BitString \rightarrow BitString; **Definition** snoc : BitString $\rightarrow \mathbb{B} \rightarrow$ BitString; **Definition** unfold : BitString \rightarrow option ($\mathbb{B} \times$ BitString); **Axiom** left_id : $\forall s_1, \iota \cdot s_1 = s_1;$ **Axiom** right id : $\forall s_1, s_1 \cdot \iota = s_1$; **Axiom** assoc : $\forall s_1 s_2 s_3, s_1 \cdot (s_2 \cdot s_3) = (s_1 \cdot s_2) \cdot s_3;$ **Axiom** unfold app : \forall b s₁ s₂ s₃, unfold s₁ = Some (b, s₂) \rightarrow unfold (s₁ · s₃) = Some (b, s₂ · s₃); **Axiom** snoc app : \forall b s₁ s₂, snoc b $(s_1 \cdot s_2) = s_1 \cdot (\text{snoc b } s_2);$ **Axiom** unfd_snoc : \forall b, unfold (snoc b ι) = Some (b, ι); **Axiom** unfd id : unfold *ι* = None; **Axiom** unfd_inj : $\forall s_1 s_2$, unfold $s_1 =$ unfold $s_2 \rightarrow s_1 = s_2$ } Fig. 2. The BitString interface, with some length operations elided.

optimize away uses of this interface in order to produce better-performing implementations.

2.1 Specifying Encoders and Decoders

These relational formats are not particularly useful by themselves— even checking whether a format permits specific source and target values may be undecidable. Instead we use them to specify the correctness of *both* encoders and decoders. So far, we have seen examples of relational formats that permit one or many target representations of a particular source value, but in their full generality, there might not be *any* valid encodings of some source value. As an extreme example, consider the following use of the \cap combinator to define an empty relation: {s | False} \cap format_word. More realistically, a format for domain names must disallow strings with runs of ".", e.g. "www.foo..bar.com". To account for formats that exclude some source values, NARCISSUS encoders are partial functions from source to target values: EncodeM S T $\Sigma := S \rightarrow \Sigma \rightarrow Option$ (T $\times \Sigma$). At a high level, a format describes a family of permissible encoders, where each must commit to a single target representation for each source value in the relation. More formally:

Definition 2.1 (Encoder Correctness). A correct encoder for a format format : FormatM S T Σ is a partial function, encode : EncodeM S T Σ , that only produces encodings of source values included in the format and signals an error on source values not included in the format:

$$\forall s \ \sigma \ t \ \sigma'. \text{ encode } s \ \sigma = \text{Some } (t, \sigma') \rightarrow (s, \sigma, t, \sigma') \in \text{format}$$

$$\land \forall s \ \sigma. \text{ encode } s \ \sigma = \bot \rightarrow \forall t \ \sigma'. (s, \sigma, t, \sigma') \notin \text{format}.$$

In other words, a valid encoder *refines* a format; we henceforth use the notation format \supseteq encode to denote that encode is a correct encoder for format.

Before stating the corresponding correctness definitions for decoders, consider the high-level properties a correct decoder should satisfy, ignoring for now the question of state. Clearly, it must be a *sound* left inverse of the format relation. That is, it should map every element *t* in the image of *s* in format back to *s*: $\forall s \ t. \ (s, t) \in \text{format} \rightarrow \text{decode} \ t = s$. Less clear is how much conformance checking a "correct" decoder should perform on target values that fall outside the image of format: should decode fail on such inputs, or should its behavior be unconstrained in these cases? If these

decoders are being integrated into other formally verified systems that process decoded data further, it is desirable to provide the strongest assurance about the integrity of decoded data to downstream functions. On the other hand, there are valid reasons for looser standards, like sacrificing strict format validation for efficiency, e.g. by not verifying checksums. For now, we require correct decoders to flag strictly *all* malformed target values by signaling errors when applied to target values not included in the relation: $\forall s t$, decode $t = \text{Some } s \rightarrow (s, t) \in \text{format}$. As we shall see later (Definition 3.1), our formulation will also support deriving decoders with more lenient validation policies. However, we note that there are compelling security reasons for the top-level decoder to enforce strict input validation, in order to cut off potential side channels via demonic choice between legal alternatives. (E.g., consider a decoder integrated within an e-mail server, which decodes malformed packets into the contents of other users' inboxes.)

Looking at the signature of decoders in NARCISSUS,

Decode MST $\Sigma := T \rightarrow \Sigma \rightarrow \text{Option} (S \times \Sigma)$

we see that we need to adapt these notions of correctness to account for the state used by a decoder. Whereas an encoder is a refinement of a format, and thus used identical types of state, we do not force compatible decoders and formats to share state types. To see why, consider a simplified version of the format for DNS domain names [Mockapetris 1987], which keeps track of the locations of previously formatted domains via its state argument:

Let format_domain (d: domain) (σ : domain \rightarrow word) := format_name d \cup format_word (σ d)

This example uses an optional compression strategy in which a domain name can either be serialized or replaced with a pointer to the location of a previously formatted occurrence. A decoder for domains should also keep track of this information, in order to decode pointers:

Let decode_domain (t : T) (σ : word \rightarrow domain) := ...

In order for decode_domain to be correct, its state needs to "agree" with the state used to format its input. We do not want to require that these states be equal, so that decoders can have the freedom to use different data structures than the format (for example, decode_domain could be implemented using a binary search tree sorted on words, while encode_domain could use a prefix trie on domain names). Our notion of decoder correctness captures agreement between different state types via a binary relation defining when format and decoder states are consistent. Hence our full notion of decoder correctness accounts for both state and erroneous target values.

Definition 2.2 (Decoder Correctness). A correct decoder for a format, format : FormatM S T Σ_E , and relation on states, \approx : Set of ($\Sigma_E \times \Sigma_D$), is a function, decode : DecodeM S T Σ_D , that, when applied to a valid target value and initial state, produces a source value and final state similar to a pair included in format, signaling an error otherwise:

$$\begin{pmatrix} \forall (\sigma_E \ \sigma_E': \Sigma_E) \ (\sigma_D: \Sigma_D) \ (s:S) \ (t:T). \\ (s, \sigma_E, t, \sigma_E') \ \in \text{ format } \land \sigma_E \approx \sigma_D \\ \rightarrow \exists \ \sigma_D'. \text{ decode } t \ \sigma_D = \text{ Some } (s, \sigma_D') \\ \land \sigma_E' \approx \sigma_D' \end{pmatrix} \land \begin{pmatrix} \forall (\sigma_E: \Sigma_E) \ (\sigma_D \ \sigma_D': \Sigma_D) \ (s:S) \ (t:T). \\ \sigma_E \approx \sigma_D \land \text{ decode } t \ \sigma_D = \text{ Some } (s, \sigma_D') \\ \rightarrow \exists \ \sigma_E'. \ (s, \sigma_E, t, \sigma_E') \ \in \text{ format} \\ \land \sigma_E' \approx \sigma_D' \end{pmatrix}$$

We denote that decode is a correct decoder for format under a similarity relation on states \approx as format \approx decode.

By definition, it is impossible to find a correct decoder for a non-injective (i.e., ambiguous) format. While decoders and encoders have independent specifications of correctness, using a common format provides a logical glue that connects the two. We can, in fact, prove the expected round-trip properties between a correct encoder and correct decoder for a common format:

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Fig. 3. Correctness rules for encoder combinators.

THEOREM 2.3 (DECODE INVERTS ENCODE). Given a correct decoder format \rightleftharpoons decode and correct encoder format \supseteq encode for a common format format, decode is an inverse for encode when restricted to source values in the format:

$$\forall s \sigma_E t \sigma'_F \sigma_D$$
. encode $s \sigma_E = \text{Some}(t, \sigma'_F) \land \sigma_E \approx \sigma_D \rightarrow \exists \sigma'_D$. decode $t \sigma_D = \text{Some}(s, \sigma'_D)$

THEOREM 2.4 (ENCODE INVERTS DECODE). Given a correct decoder format \rightleftharpoons decode and correct encoder format \supseteq encode for a common format format, encode is defined for all decoded source values produced by decode:

 $\forall s \sigma_D t \sigma'_D \sigma_E$. decode $t \sigma_D = \text{Some}(s, \sigma'_D) \land \sigma_E \approx \sigma_D \rightarrow \exists t' \sigma'_F$. encode $s \sigma_E = \text{Some}(t', \sigma'_F)$

That encode is an inverse of decode for source values with unique encodings is a direct corollary of Theorem 2.4.

3 DERIVING ENCODERS AND DECODERS

Equipped with precise notions of correctness, we can now explain how to derive provably correct encoders and decoders from a format. These functions will be byte-aligned in a subsequent derivation step presented in Section 3.2. We begin with encoders, since they often have similar structure to their corresponding formats. Intuitively, such a derivation is simply the search for a pair of an encoder function encode and a proof term witnessing that it is correct with respect to a format: format \supseteq encode. As an example, a proof that a function that returns an empty bytestring correctly implements the empty format can also be read as evidence that it is safe to choose this implementation when searching for an encoder for ϵ . In this light, lemmas like enc_readingCorrect proving that encoder combinators are correct can be interpreted as *derivation rules* for constructing such proof trees from goal formats.

Leveraging this intuition, we denote these correctness lemmas using standard inference-rule notation:

Lemma EncA $(h_1 : H_1) (h_2 : H_2)$: CorrectEncoder A T Σ format_A encode_A. $\equiv \frac{H_1 \quad H_2}{\text{format}_A \supseteq \text{encode}_A}$ (EncA)

Figure 3 presents the encoder combinators for the formats from Section 2 using this inference-rule style. ENCUNION is an example of an encoder that commits to a particular target value– given a correct encoder for each format in the union, it relies on an index function n on source values to select a particular encoding strategy, with the second hypothesis of the rule ensuring that this index

function correctly picks a format that includes the source value. The rule for ++ establishes that a correct encoder for sequences can be built from encoders for its subformats. This rule features a wrinkle concerning state: in order to apply ENCSEQ correctly, if the format₁ produces *some* intermediate state that makes format₂ (and thus format₁ ++ format₂) nonempty, encode₁ must also produce a state on which encode₂ returns some value. The last hypothesis of ENCSEQ enforces that encode₁ does not "mislead" encode₂ in this manner.

By combining ENCSEQ and ENCCOMP with the rules for base types, e.g. ENCWORD, we can iteratively derive correct encoders from a format; Figure 4 presents an example of such a derivation for one of the encoders from our introductory tour. Each step in the derivation corresponds to the encoder that results from applying ENCSEQ and an encoder-derivation rule for the topmost format. The proofs that none of the encoders pass on misleading states are elided. The hole \Box at each step corresponds to the encoder that is built at the next step; recursively filling these in and simplifying the resulting expression with the monad laws yields the encoder for enc_data.

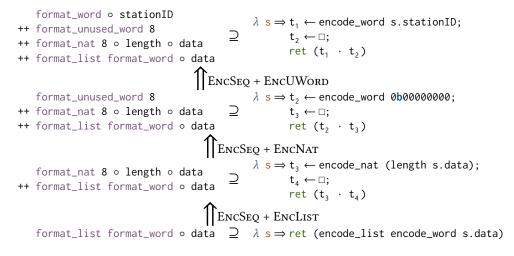


Fig. 4. An example encoder derivation.

3.1 Decoders

Before defining similar correctness rules for decoder combinators, we pause to consider how they are used to build a top-level decoder. To concretize this discussion, consider how the signatures of the decoder components in the following top-level decoder correctness fact differ from the decoder built from them:

format_word ∘ stationID ++ format_word ∘ data id ← decode_word; d ← decode_word; ret { stationID := id; data := d }

Firstly, the two uses of decode_word naturally align with format_word \circ stationID and format_word \circ data. In contrast to top-level decoders, however, these components compute projections or *views* of the original sensor value, stationID and data, respectively. Secondly, the natural way to decode the source value resulting from sequencing these two formats with ++ is to have the first use of decode_word return any unconsumed portion of the target value via \gg for continued processing. We thus define the signature of a decoder combinator to be²:

²We change the name of the first type parameter from S to V to emphasize that combinators produce views of encoded source values.

$\mathsf{DecodeComb}\mathsf{M} \lor \mathsf{V} \mathsf{T} \varSigma \coloneqq \mathsf{T} \to \Sigma \to \mathsf{Option} \ (\mathsf{V} \times \mathsf{T} \times \Sigma)$

Neither of these changes align with Definition 2.2, which required a correct decoder to recover the *full* source value by *completely* consuming a target value. To recover the desired top-level property, we must adapt our two correctness properties to account for these differences. To reconcile the discrepancy between the type of the source value used in the original format and the view computed by a combinator, we parameterize the correctness criteria over a relation between values of the two types and include an additional view format that relates view and target values.

Our next adaptation is to require that a combinator consume *precisely* the portion of the bitstring corresponding to its view, so that sequencing works correctly. To see why, consider a simple format for card suits which uses unit for the state type (we elide the trivial state values below):

 $format_suit \equiv \{(\clubsuit, 0b11), (\diamondsuit, 0b0), (\heartsuit, 0b1), (\clubsuit, 0b10)\}$

To format a pair of cards, we could format each card in sequence: format_suit \circ fst ++ format_suit \circ snd. This format is clearly not injective, as it is not possible to distinguish between the encodings of (\blacklozenge , \diamond) and (\heartsuit , \blacklozenge). Absent additional information in the surrounding format, e.g. a Boolean flag identifying the color of the suit being decoded, it is impossible for a combinator for format_suit to soundly identify how much of the target to process. Since this format lacks such information, it is impossible to find a correct *top-level* decoder for it.

Definition 3.1 (Decoder-Combinator Soundness). A sound decoder combinator for a source format, format_s : Format M S T Σ_E , relation on states, \approx : Set of ($\Sigma_E \times \Sigma_D$), relation between source and view values $\rho : S \rightarrow V \rightarrow$ Prop, and view format, format_v : Format M V T Σ_E is a function, decode : DecodeCombM V T Σ_D , that when applied to a valid target value appended to an arbitrary bitstring and initial state, produces a view of the source value that agrees with the view format while consuming exactly the portion of the target value in the source format:

$$\forall (\sigma_E \ \sigma_E': \Sigma_E) \ (\sigma_D: \Sigma_D) \ (s:S) \ (t \ t':T). \ (s, \sigma_E, t, \sigma_E') \ \in \text{format}_s \land \sigma_E \approx \sigma_D \\ \rightarrow \exists \ v \ \sigma_D'. \ \text{decode} \ (t \ \cdot t') \ \sigma_D = \text{Some} \ (v, t', \sigma_D') \land \\ \rho \ s \ v \land (v, \sigma_D, t, \sigma_D') \ \in \text{format}_v \land \sigma_E' \approx \sigma_D'$$

Adapting the consistency criterion for decoder combinators is more straightforward. We require that decoder combinators ensure that any computed value agrees with the provided view-format relation *and* is a consistent view of any source values in the original format with the same encoding:

Definition 3.2 (Decoder-Combinator Consistency). A consistent decoder combinator for a source format, format_s : FormatM S T Σ_E , view format, format_v : FormatM V T Σ_E , relation on states, \approx : Set of ($\Sigma_E \times \Sigma_D$), relation between source and view values ρ : S \rightarrow V \rightarrow Prop, is a function, decode : DecodeCombM V T Σ_D , that is guaranteed to produce a view and unconsumed bitstring in a manner consistent with the view and source formats:

$$\begin{array}{l} \forall (\sigma_E: \Sigma_E) \; (\sigma_D \; \sigma_D': \Sigma_D) \; (v: V) \; (t \; t': \; T). \; \sigma_E \approx \sigma_D \; \land \; \text{decode t} \; \sigma_D = \text{Some} \; (v, t', \; \sigma_D') \\ \rightarrow \; \exists \; t'' \; \sigma_E'. \; t = t'' \; \cdot \; t' \; \; \land \; (v, \; \sigma_E, \; t'', \; \sigma_E') \; \in \; \text{format}_v \; \land \; \sigma_E' \approx \sigma_D' \\ \; \; \land \; \forall \; s. \; (s, \; \sigma_E, \; t'', \; \sigma_E') \; \in \; \text{format}_s \; \rightarrow \; \rho \; s \; v \end{array}$$

A correct decoder combinator is one that is both sound with respect to the source format and view relation and that is consistent with its view format. We denote this property as format_s $z = \frac{1}{2} \rho$

decode $\,\sim$ format_v. We can now precisely capture how decode_word correctly recovers a word representing the stationID of the source value from our previous example:

 $format_word \circ stationID \quad \begin{tabular}{l} \hline c_{\tau} \approx \begin{tabular}{l} \hline c_{\tau} \end{tabular} \\ \hline \{(s, v) \mid stationID \ s = v\} \end{tabular} \quad decode_word \ \sim \ format_word \end{tabular}$

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 $Q \cap \text{format} \rightleftharpoons \text{decode}$ $Q \cap \text{format} \rightleftharpoons \text{decode}$ $\forall \mathsf{s} \mathsf{v}. \ \rho \ \mathsf{s} \mathsf{v} \land \mathsf{P} \ \mathsf{s} \to \mathsf{Q} \ \mathsf{v}$ $\forall I. P I \rightarrow |I| = n \land \forall a \in I. Q a$ $P \cap \text{format} \odot \rho \in \tilde{\mathbb{Z}}_{o}^{\sim} \text{decode} \sim Q \cap \text{format}$ $P \cap$ format list format ≈ decode list decode n (DecList) (DECCOMPOSE) $P \cap \text{format}_s \in \mathbb{R}^{2}_{\rho} \text{decode} \sim \text{format}_v$ $\forall s'. P s' \rightarrow s = s'$ $\forall s v. \rho s v \land P s \rightarrow \rho' s (f v)$ $\mathsf{b} = \mathsf{true} \leftrightarrow \mathsf{P} \mathsf{ s}$ $\forall v \ \sigma \ t \ \sigma'. (v, \sigma, t, \sigma') \in \text{format}_v \rightarrow (f \ v, \sigma, t, \sigma') \in \text{format}'_v$ $P \cap \epsilon \implies$ if b then return s else fail $P \cap \text{format}_s \in \tilde{\mathcal{B}}_{a'}$ fmap f decode ~ format'_v (DecDone) (DecInject)

$$\begin{split} & P \cap \text{format}_1 \stackrel{\sim}{\underset{\rho_1}{\leftarrow}} \stackrel{\sim}{\underset{\rho_1}{\det}} \text{decode}_1 \sim \text{format}_{v_1} \qquad \forall s \ v_1 \ v_2. \ \rho_3 \ s \ (v_1, v_2) \leftrightarrow \rho_1 \ s \ v_1 \ \land \ \rho_2 \ s \ v_2 \\ & \forall v_1. \ \{s \ | \ P \ s \ \land \ \rho_1 \ s \ v_1 \} \cap \text{format}_2 \stackrel{\sim}{\underset{\sim}{\leftarrow}} \stackrel{\sim}{\underset{\rho_2}{\leftarrow}} \stackrel{\sim}{\underset{\rho_3}{\det}} \text{decode}_2 \ v_1 \ \sim \{v_2 \ | \ (v_1, v_2) \in \text{format}_{v_2}\} \end{split}$$

 $P \cap \text{format}_1 + \text{format}_2 \in \tilde{\mathbb{R}}_{\rho_3}^{\sim} v_1 \leftarrow \text{decode}_1; v_2 \leftarrow \text{decode}_2 v_1; \text{return} (v_1, v_2) \sim \text{format}_{v_1} \circ \pi_1 + \text{format}_{v_2}$ (DecSeq)

 $P \cap (\text{format}_{T} \cup \text{format}_{E}) \in \widetilde{\mathbb{R}}_{\rho}^{\sim} \lambda t. \ b \leftarrow \text{decode}_{B}; \text{ if } b \text{ then } \text{decode}_{T} \text{ else } \text{decode}_{E} \sim \text{format}_{vT} \cup \text{format}_{vE}$ (DecUnion)

Fig. 5. Selected correctness rules for decoder combinators.

Note that choosing the equality relation as ρ and the original format as the view format yields a property equivalent to our original left-inverse criterion, which we continue to denote as \approx .

Figure 5 presents a selection of some decoder-combinator-correctness facts included in Narcissus as inference rules. Note that all the rules are parameterized over a predicate P used to restrict the source format $P \cap$ format. This predicate is key to our approach to the modular verification of decoder combinators: each of these rules uses this predicate to thread information about previously decoded data through a proof of correctness for a composite decoder. Such information is necessary for a decoder combinator whose correctness *depends* on context in which it is used. As a concrete example, the decode_list combinator in DECLIST only correctly decodes lists of length n, a restriction enforced by the second assumption of the rule. In isolation this rule only justifies using decode_list to decode fixed-lengths lists. When used as part of a larger format that also includes the length of the original list, however, it can be applied to lists of variable length, as in box 7.1. At first glance, the DECDONE rule seems even more limited, as it only applies to a format with a single, unique source value. In the context of a larger format, however, this rule becomes much more powerful, particularly when employing these rules to *derive* a decoder from a format specification.

To see how, consider how the source predicate evolves during the decoder derivation presented in Figure 6. This derivation makes use of the DEcSEQPROJ rule, which is a consequence of the more elementary rules in Figure 5.

$$\begin{array}{c} Q \cap \text{format}_1 & \textcircled{>>} \text{decode}_1 & \forall s. \ \mathsf{P} \ \mathsf{s} \to Q \ (\mathsf{f} \ \mathsf{s}) \\ \\ \hline \\ \hline \\ \Psi \mathsf{v}. \ \{\mathsf{s} \ | \ \mathsf{P} \ \mathsf{s} \land \mathsf{f} \ \mathsf{s} = \mathsf{v}\} \cap \text{format}_2 & \fbox{>>} \text{decode}_2 \ \mathsf{v} \\ \hline \\ \hline \\ \hline \\ \hline \\ \hline \\ \mathsf{P} \cap \text{format}_1 \circ \mathsf{f} \ \# \ \text{format}_2 & \rightleftarrows \text{decode}_1 \gg \texttt{decode}_2 \end{array}$$
 (DecSeqProj)

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Fig. 6. An example of constraints added to a format during a decoder derivation.

Each intermediate node in this derivation corresponds to the format in the last premise of DECSEQPROJ. Note how each step introduces a variable for the newly parsed data, and how an additional constraint is added to P relating the original source value to this value. When the derivation reaches format list, this constraint witnesses that the number of elements in that list is known. Similarly, although the format is empty at the topmost leaf of the derivation tree, P includes enough constraints to uniquely recover the original source value from previously decoded values, and DECDONE can be applied to finish the derivation. The first premise of DECDONE ensures that the restriction on source values is sufficient to prove the existence of some constant s that is equal to the original source value. The second premise of DECDONE ensures that a derived decoder is not overly permissive in the case that P is too restrictive. As previously noted, a format could encode the same view of a source value twice, and the consistency of the corresponding decoded values should be validated during decoding. Thus, the function b in this premise acts as a decision procedure that validates the consistency of all the projections of the original source gathered during decoding. While this example is straightforward, similar dependencies can be found in many existing binary formats, in the form of tags for sum types, version numbers, and checksum fields. In each case, the correctness of a combinator for a particular subformat depends on a previously decoded value.

The rules in Figure 5 are mostly used to derive more specific rules which are more useful in derivations of top-level decoders. The DECINJ and DECUNION rules demonstrate some interesting features of our formulation of decoder-combinator correctness:

• DECINJ proves how to transform a projected value safely, updating the view format to reflect that a transformation has been applied. While not particularly helpful during derivation of top-level decoders, this rule is useful for proving the correctness of derivation rules like DEcSEqPRoJ.

• DECUNION is similar to UNIONENC, with the key difference being that it requires a Boolean value, b, indicating which format produced the current bitstring. The combinator uses a decoder, decode_B, to compute such a Boolean and uses the view format to ensure the Boolean flag is correct. In addition, the proof of correctness for decode_B only requires that it consume some prefix of the target value produced by the source format, giving it the freedom to return as soon as it can identify which subformat was used to generate the current source value. Framing the problem in this way allows NARCISSUS to leverage other derivation rules to build this function. We will see another example of this paradigm in the rule for IP checksums presented in Section 5.

3.2 Improving Performance of Encoders and Decoders

The encoders and decoders derived via our combinator rules utilize the same bitstring abstract data type as format specifications, employing the bitstring's snoc and unfold operations to enqueue and dequeue individual bits. Operating at the bit level imposes a large performance hit on these functions, since implementing these methods on the fixed-length byte buffers typically used for the target data type requires bitshifts. Converting encoders and decoders to use byte-level operations greatly improves the performance of these functions, to the point that they can be competitive with hand-implemented implementations, as our evaluation in Section 6 will show. In order to do so without compromising our correct-by-construction guarantee, we will justify this conversion using an equivalence between bit-aligned and byte-aligned functions.

The signatures of the byte-aligned functions instantiate the target type of their bit-aligned versions to a byte buffer of fixed length n:

AlignEncodeM S (n : nat) $\Sigma := S \rightarrow ByteBuff n \rightarrow nat \rightarrow \Sigma \rightarrow Option (ByteBuff n \times nat \times \Sigma)$ AlignDecodeM S (n : nat) $\Sigma := ByteBuff n \rightarrow nat \rightarrow \Sigma \rightarrow Option (S \times nat \times \Sigma)$

In addition to fixing the target type, byte-aligned encoders now take the byte buffer they write to, and both functions now carry the index of the next byte to read/write. Both functions are instances of the state and error monads, although we force AlignDecodeM to be read-only by threading the byte buffer through the reader monad. We equip AlignEncodeM with a SetCurrentByte operation that sets the byte at the current index while updating that index, and AlignDecodeM with a corresponding GetCurrentByte operation for dequeuing bytes. We define the twin equivalences used to justify the correctness of byte-optimized functions as follows:

Definition 3.3 (Correctness of Byte-Aligned Encoders). A byte-aligned encoder encode_bytes and bit-aligned encoder encode_bits are equivalent, encode_bits \simeq encode_bytes, iff:

- encode_bytes encodes the same bit sequence at the beginning of its byte buffer as encode_bits.
- encode bytes fails when encode bits would write past the end of the fixed-length byte buffer.
- encode_bytes fails whenever encode_bits does.

Definition 3.4 (Correctness of Byte-Aligned Decoders). A byte-aligned decoder decode_bytes and bit-aligned decoder decode_bits are equivalent, decode_bits \leq decode_bytes, iff:

- decode_bytes produces the same value as decode_bits, while consuming the same number of bits.
- decode_bytes fails when decode_bits would read past the end of the fixed-length byte buffer.
- decode_bytes fails whenever decode_bits does.

Armed with these definitions, we can build transformation rules for deriving correct byte-aligned implementations from bit-aligned functions in a similar manner to the previous section. Figure 7 gives examples of the rules for byte-aligning decoders. The most important of these is ALIGNDECSEQ, which establishes that the byte-alignment transformation can be decomposed through sequences.

$$\frac{\text{decode_bits}_1 \ \ \ \ \ \text{decode_bytes}_1}{\text{decode_bits}_1 \gg \text{decode_bytes}_2} \xrightarrow{\forall v. \ \text{decode_bits}_2 v \ \ \ \ \text{decode_bytes}_2 v} (\text{AlignDecSeq})$$

throw ∽ throw	decode_word ₈ \simeq	GetCurrentByte	return a ≌ return a
(AlignDecThrow)		(AlignDecByte)	(AlignDecReturn)

Fig. 7. A selection of byte-alignment rules for decoders.

The rules for byte-aligned encoders are similar. Note how ALIGNDECBYTE proves an equivalence between dequeuing an 8-bit word and AlignDecodeM's GetCurrentByte operation. A key part of automating derivations using these rules is reassociating sequences of bit-aligned decoders so that this rule applies, as the next section discusses in more detail.

4 AUTOMATING DERIVATIONS

As illustrated in Section 1.1, NARCISSUS provides a set of tactics to help automate the derivations described above. The tactic derive_encoder_decoder_pair presented in that tour is actually implemented via a pair of proof-automation tactics, DeriveEncoder and DeriveDecoder, that derive encoders and decoders, respectively. Algorithm 1 presents the pseudocode algorithm for DeriveDecoder; DeriveEncoder has a similar implementation. In addition to the top-level format, *fmt*, this tactic takes as input libraries of decoder-derivation and byte-alignment rules, *drules* and *arules*, which allow the tactic to be extended to support new formats. DeriveDecoder first converts the input format to a normal form by right associating sequences and collapsing nested applications of the format-composition operator \odot . Next, the tactic attempts to derive a bit-aligned decoder for *fmt* via the ApplyRules subroutine that recursively applies the derivation rules in *drules*. If a bit-level decoder is found, the algorithm again normalizes the result using the monad laws and attempts to derive a byte-aligned decoder by calling the AlignDecoder subroutine. Before diving into the details of the ApplyRules and AlignDecoder tactics, we emphasize that DeriveDecoder is *interactive*: if it gets stuck on a goal it cannot solve with the current rule libraries, it presents that goal to the user to solve interactively, as in the derivation in box 5.1.

In the implementation of ApplyRules, derivation rules are implemented as tactics that apply correctness lemmas to decompose the current CorrectDecoder goal into a set of simpler subgoals in the standard interactive proof style. Conceptually, ApplyRules treats each derivation rule *rule* \in FormatM S T \rightarrow (FormatM S_i T, Prop, Cont) as a partial function, each mapping a format to a triple of a (possibly empty) set of subformats, a set of side conditions, and a continuation $\mathcal{K} \in \text{Cont} \equiv \text{DecodeM S}_i T \rightarrow \text{DecodeM S} T$ that can construct a bit-aligned decoder from bit-aligned decoders for those subformats, when those side conditions are satisfied. The subformats represent the $\stackrel{\frown}{\simeq}$ premises of each derivation rule, the side conditions capture its other premises, and the continuation is the decoder in its conclusion. Thus, DECSEQPROJ can be thought of as a function that returns the subformats $Q \cap \text{fmt}_1$ and $\{s \mid f s = s' \land P s\} \cap \text{fmt}_2$, the side conditions $\forall s. P s \rightarrow Q$ (f s), and the continuation $\lambda d_1 d_2 d_1 +_D d_2$, when applied to a format of the form $P \cap fmt_1 \circ f + fmt_2$. A rule can fail when the format in its conclusion does not match the current goal, when its CorrectDecoder subformats cannot be decoded, or when its side conditions are not satisfied, e.g. DECLIST fails when an appropriate length cannot be identified. ApplyRules first attempts to solve the goal completely via the FinishDecoder tactic, which we will discuss shortly. If that tactic fails to find an appropriate decoder, the algorithm iteratively attempts to apply the available rules to the current format, starting with rules for base formats.

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Algorithm 1 Derive a byte-anglied decoder from a format					
1: function DeriveDecoder(<i>fmt</i> , <i>drules</i> , <i>arules</i>)	1: function ApplyRules(<i>fmt</i> , <i>drules</i>)				
Input: <i>fmt</i> : a format relation	2: try				
drules: set of decoder combinators derivation rules	3: FinishDecoder(<i>fmt</i>)				
arules: set of byte-alignment transformation rules	4: for rule \leftarrow drules do				
Output: <i>dec</i> : a byte-aligned decoder inverting <i>fmt</i>	5: try				
2: $fmt_0 \leftarrow NormalizeFormat(fmt)$	6: $\langle \overline{fmt}, P, \mathcal{K} \rangle \leftarrow rule(fmt)$				
3: $dec \leftarrow ApplyRules(fmt_0, drules)$	7: $\overline{dec} \leftarrow \text{ApplyRules}(\overline{fmt}, rules)$				
4: $dec_0 \leftarrow \text{NormalizeDecoder}(dec)$	8: if SolveSideConditions(<i>P</i>) then				
5: AlignDecoder($dec_0, arules$)	9: return $\mathcal{K}(\overline{dec})$				
6: function AlignDecoder(<i>dec</i> , <i>arules</i>)					
7: for rule \leftarrow arules do	10: function FinishDecoder(<i>fmt</i>)				
8: try	11: try				
9: $d\underline{ec_0} \leftarrow \text{DecAssoc}(dec)$	12: $\langle \emptyset, (P_{src}P_{dec}), \mathcal{K} \rangle \leftarrow \text{DecDone}(fmt)$				
10: $\underline{\langle dec, \mathcal{K} \rangle} \leftarrow rule(dec)$	13: $s \leftarrow \text{ExtractView}(P_{\text{src}})$				
11: $dec \leftarrow \text{AlignDecoder}(dec, rules)$	14: $b \leftarrow \text{DecidePredicate}(P_{dec})$				
12: return $\mathcal{K}(\overline{dec})$	15: return if <i>b</i> then return <i>s</i> else fail				

Algorithm 1 Derive a byte-aligned decoder from a format

If a rule is successfully applied, the algorithm recursively calls ApplyRules to derive decoders for any generated subformats. If those derivations are successful, the algorithm applies the continuation to the results and returns a finished decoder. If a recursive call fails to process a subformat completely, the tactic pauses and returns the corresponding CorrectDecoder subgoal, so that the user can see where the automation got stuck. AlignDecoder is algorithmically similar to ApplyRules, with the important modification that it attempts to reassociate the topmost decoder using the DecAssoc tactic before applying its transformation rules.

The FinishDecoder tactic warrants special discussion. FinishDecoder attempts to finish a derivation of a complete source value by finding instantiations of the s and b metavariables in the DECDONE rule. Importantly, the original source value cannot be used for either, but must instead be instantiated with values that *only* use previously parsed data. Automatically finding an instance of s is particularly worrisome, as it is well-known that Ltac, Coq's proofautomation language, does not provide good

 $\Box_s = s$

Decompose ("destruct") the source value, s, with new variables for field values.

H₁ : length
$$x_2 < 2^8 \land x_1 = w$$

 \land length $x_2 = \ln \land x_2 = 1$

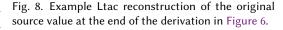
$$\Box_s = \{ \text{ stationID } := x_1; \text{ data } := x_2 \}$$

Substitute with equalities from source restriction $(hypothesis H_1).$

$$H_1$$
 : length $1 < 2^8$

 \square_{s} = { stationID := w; data := 1 }

Variant of "reflexivity" solves the goal.



support for introspecting into definitions of inductive types, and we would like to use Ltac to construct records of fairly arbitrary types, without relying on OCaml plugins. Thankfully, a combination of standard tactics for case analysis and rewriting are up to the task.

Let us see how the ExtractView tactic tries to discharge the first proof obligation of DECDONE for the derivation from Section 3.1, which is presented in Figure 8. This figure denotes the unknown existential variable representing s as \Box_s . ExtractView first uses Coq's standard destruct tactic to perform case analysis on s, generating the second subgoal presented in Figure 8, with occurrences of s replaced by its constructor applied to new variables x_1 and x_2 . ExtractView then attempts to remove any variables that are not in the scope of the existential variable by rewriting the current goal using any equalities about the original source value available in the context. The resulting final goal equates \Box_s to previously decoded values and can be solved by unifying the two sides via the reflexivity tactic. Importantly, since s was not available when \Box_s was quantified, this final tactic only succeeds when the rewritten term depends solely on previously decoded data. FinishDecoder then attempts to solve a similar goal with a hole for b using the DecidePredicate tactic that employs known decision procedures and simplifies away any tautologies, relying on a special type class to resolve any user-defined predicates. We pause here to reemphasize that, while FinishDecoder relies on heuristic-based proof automation in a best effort attempt to solve the goal and is thus incomplete, the failure of a tactic does not necessarily spell the end of a derivation. By virtue of being implemented in an interactive proof assistant, NARCISSUS can loop users in when a derivation gets stuck: if FinishDecoder cannot find a decoder for the empty format, the user is presented a subgoal like the one at the top of Figure 8, so that they can attempt to solve the subgoal *interactively*.

5 EXTENDING THE FRAMEWORK

As outlined in Section 1.1, an extension to NARCISSUS consists of four pieces: a format, encoder and decoder combinators, derivation rules, and automation for incorporating these rules into DeriveEncoder and DeriveDecoder. As a concrete example, consider the format of the Internet Protocol (IP) checksum used in the IP headers, TCP segments, and UDP datagrams featured in our case studies. Figure 9 presents the format, decoder combinator, and decoder derivation rule needed for NARCISSUS to support IP checksums. IP_Checksum_format is a higher-order combinator in the spirit of ++; the key difference is that it uses the bitstrings produced by its subformat parameters to build the IP checksum (the one's complement of the bitstrings interpreted as lists of bytes), which it inserts between the two encoded values to produce the output bitstring. The IP_Checksum_decode combinator has two subdecoder parameters: it uses the first to calculate the number of bytes included in the checksum, and then it validates the checksum before decoding the rest of the string using its second parameter. The derivation rule for this format guarantees that, when given the correct number of bytes to include in the checksum, this test will always succeed for uncorrupted data and that it can avoid parsing the rest of the input otherwise. Figure 10 presents a complete example of this checksum combinator being used to derive encoders and decoders for IP headers.

Figure 10 also includes a complete example of a new decoder-derivation tactic, which implements the DECCHKSUM rule presented in Figure 9. DECCHKSUM is similar to DECSEQPROJ, with a couple of key additional assumptions. The first four of these ensure the bytestrings produced by each subformat have constant length and are properly byte-aligned, which is needed to prove the validity of the initial checksum test. More interesting is the last assumption, which uses a decoder to calculate the number of bytes to include in the checksum. As with the DECUNION rule from Figure 5, this framing allows ApplyRules to discharge this condition recursively during a derivation. The new_decoder_rules tactic applies the DECCHKSUM rule and attempts to discharge the first four assumptions by using a database of facts about the lengths of encoded datatypes and the modulus operator, relying on ApplyRules to derive decoders for the subformats. Note that this tactic is a realization of the logic of the body of ApplyRules's loop, deriving subdecoders recursively while discharging other subgoals immediately. Other derivation rules included in NARCISSUS have similar implementations.

```
Let IP_Checksum_format {S \Sigma} format<sub>1</sub> format<sub>2</sub> (s : S) (env : \Sigma) :=
    '(p, env) ← format<sub>1</sub> s env;
    '(q, env) \leftarrow format<sub>2</sub> s (addE env 16);
    c \leftarrow \{ c : word \ 16 \mid \forall ext, \}
               IPChecksum_Valid (bin_measure (p ++ (encode_word c) ++ q))
                                              (p ++ (encode_word c) ++ q ++ ext) };
    ret (p ++ (encode_word c) ++ q, env).
Let IP_Checksum_decode {S \Sigma} dec<sub>M</sub> (dec<sub>P</sub> : DecodeM S B \Sigma) (bin : B) (env : \Sigma) :=
    '(n, _, _) ← dec<sub>M</sub> bin env;
    if checksum_Valid_dec (n * 8) bin then dec<sub>P</sub> bin env
    else None
               \begin{array}{ll} \forall (s,\sigma_E,t,\sigma_E') \in \mathsf{fmt}_1. \ \mathsf{length} \ \mathsf{t} = \mathsf{len}_1 \ \mathsf{s} & \forall s. \ \mathsf{len}_1 \ \mathsf{s} \ \mathsf{mod} \ \mathsf{8} = 0 \\ \forall (s,\sigma_E,t,\sigma_E') \in \mathsf{fmt}_2. \ \mathsf{length} \ \mathsf{t} = \mathsf{len}_2 \ \mathsf{s} & \forall s. \ \mathsf{len}_2 \ \mathsf{s} \ \mathsf{mod} \ \mathsf{8} = 0 \end{array} 
                 P \cap fmt_1 ++ format\_unused\_word 16 ++ fmt_2 \rightleftharpoons dec_P
                     P \cap subformat_{\{(s,n) \mid \forall len_1 \le + 16 + len_2 \le n \times 8\}} dec_M \sim format_M
                  subformat \leq (fmt<sub>1</sub> ++ format_unused_word16 ++ fmt<sub>2</sub>)
                                                                                                                                       - (DecChkSum)
```

 $P \cap IP_Checksum_format fmt_1 fmt_2 \implies IP_Checksum_decode dec_M dec_P$

Fig. 9. Format, decoder, and decoder combinator for IP Checksums.

6 EVALUATION

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To evaluate the expressiveness and real-world applicability of NARCISSUS, we wrote specifications and derived implementations of encoders and decoders for five of the most commonly used packet formats of the Internet protocol suite: Ethernet, ARP, IPv4, TCP, UDP. These formats were chosen to cover the full TCP/IP stack while offering a wide variety of interesting features and challenges:

- **Checksums.** An IPv4 packet header contains a checksum equal to the one's-complement sum of the 16-bit words resulting from encoding all other fields of the header.
- **Pseudoheaders.** TCP and UDP segments also contain checksums, but they are computed on a segment's payload prefixed by a *pseudoheader* that incorporates information from the IP layer. This pseudoheader is not present in the encoded packet.
- **Unions.** An Ethernet frame header contains a 16-bit EtherType field, encoding either the length of the frame's payload (up to 1500 bytes) or a constant indicating which protocol the frame's payload encapsulates. The two interpretations were originally conflicting, but the ambiguity was resolved in IEEE 802.3x-1997 by requiring all EtherType constants to be above 1535. This dichotomy is easily expressed in NARCISSUS as a union format.
- **Constraints and underspecification.** TCP, UDP, and IP headers include reserved-for-future-use or underspecified bits, as well as fields with interdependencies (for example, the 16-bit urgent-pointer field of a TCP packet is only meaningful if its URG flag is set, and the options of a TCP packet mush be zero-padded to a 32-bit boundary equal to that specified by the packet's data-offset field).

The specifications of these formats are short and readable: each format typically requires 10 to 20 lines of declarative serialization code and 10 to 20 lines of record-type, enumerated-type, and numeric-constant declarations. In addition to the base set of formats, these specifications leverage a few TCP/IP-specific extensions including checksums, pseudoheader checksums, and custom index functions for union types.

```
Record IPv4_Packet :=
 { TotalLength: word 16; ID: word 16;
    DF: B; MF: B; FragmentOffset: word 13; TTL: word 8;
    Protocol: EnumType ["ICMP"; "TCP"; "UDP"];
    SourceAddress: word 32; DestAddress: word 32;
    Options: list (word 32) }.
Definition ProtocolTypeCodes := (* Protocol Numbers from RFC 5237 *)
  [0b00000001 (* ICMP: 1 *); 0b00000110 (* TCP: 6 *); 0b00010001 (* UDP: 17 *)].
Definition IPv4_Packet_Format : FormatM IPv4_Packet ByteString :=
    (format_nat 4 o (constant 4)
 ++ format_nat 4 o (plus 5) o @length _ o Options
  ++ format_unused_word 8 (* TOS Field! *)
  ++ format_word o TotalLength
 ++ format_word • ID
 ++ format_unused_word 1 (* Unused flag! *)
 ++ format_bool • DF
 ++ format_bool • MF
 ++ format_word • FragmentOffset
  ++ format_word • TTL
  ++ format_enum ProtocolTypeCodes • Protocol)
 ThenChecksum IPChecksum_Valid OfSize 16 ThenCarryOn
    (format_word • SourceAddress
  ++ format_word • DestAddress
 ++ format_list format_word o Options).
Definition IPv4_Packet_OK (ipv4 : IPv4_Packet) :=
  (length ipv4.(Options)) < 11 \wedge
  20 + 4 * (length ipv4.(Options)) < wordToNat ipv4.(TotalLength).
Ltac new_encoder_rules ::=
 match goal with
    ⊢ CorrectAlignedEncoder (_ ThenChecksum _ OfSize _ ThenCarryOn _) _ ⇒
    eapply @CorrectAlignedEncoderForIPChecksumThenC;
    [ normalize_encoder_format| normalize_encoder_format | repeat calculate_length_ByteString
      solve_mod_16 | repeat calculate_length_ByteString | solve_mod_8 ]
 end.
Ltac new_decoder_rules ::=
 match goal with
  | H : cache_inv_Property ?mnd _
    ⊢ CorrectDecoder _ _ _ (?fmt, ThenChecksum _ OfSize _ ThenCarryOn ?fmt,) _ _ _ ⇒
    eapply compose_IPChecksum_format_correct' with (format<sub>1</sub> := fmt<sub>1</sub>);
    [ exact H | repeat calculate_length_ByteString | repeat calculate_length_ByteString
    | solve_mod_8 | solve_mod_8 | intros; normalize_format; apply_rules
    | normalize_format; apply_rules | solve_Prefix_Format ]
end.
Let enc_dec : EncoderDecoderPair IPv4_Packet_Format IPv4_Packet_OK.
Proof. derive_encoder_decoder_pair. Defined.
Let IPv4_encoder := encoder_impl enc_dec.
Let IPv4_decoder := decoder_impl enc_dec.
```

Fig. 10. Format for IP version 4 headers, using the IP Checksum format.

The decoders that our framework produces are reasonably efficient and sufficiently full-featured to be used as drop-in replacements for all encoding and decoding components of a typical TCP/IP stack. In the rest of this section, we describe our extraction methodology and support our claims by presenting performance benchmarks and reporting on a fork of the native-OCaml mirage-tcpip library used in the MirageOS unikernel, rewired to use our code to parse and decode network packets. We use Coq's extraction mechanism to obtain a standalone OCaml library, using OCaml's integers to represent machine words and natural numbers, a native-code checksum implementation, and custom array data structures for the bytestrings and vectors that encoders and decoders operate on. These custom data structures are unverified and thus part of our trusted base. Our source-code distribution contains detailed instructions to help readers reproduce our results, as well as pointers to patched version of mirage-tcpip and mirage-www.

6.1 Benchmarking

Figure 11 shows single-packet encoding and decoding times, estimated by regressing over the time needed to run batches of n packet serializations or deserializations for increasingly large values of n (experimental data were obtained using the Core_bench OCaml library [Hardin and James 2013]).

6.2 Mirage OS Integration

MirageOS [Madhavapeddy et al. 2013] is a "library operating system that constructs unikernels for secure, high-performance network applications": a collection of OCaml libraries that can be assembled into a standalone kernel running on top of the Xen hypervisor. Security is a core feature of MirageOS, making it a natural target to demonstrate integration of our encoders and decoders. Concretely, this entails patching the mirage-tcpip³ library to replace its serializers and deserializers

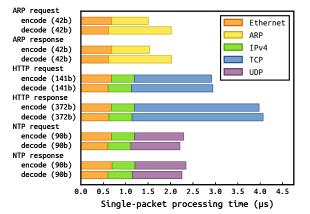


Fig. 11. Processing times for various network packets on an Intel Core i7-4810MQ CPU @ 2.80GHz. Each row shows how each layer of the network stack contributes to encoding and decoding times. TCP and UDP checksums are computed over the entirety of the packet, payload included, which explains the higher processing times. The HTTP and NTP payloads are a GET request to http://nytimes.com and a clock-synchronization request to time.nist.gov.

by our own and evaluating the resulting code in a realistic network application. We chose the mirage.io website (mirage-www on OPAM), which shows that the overhead of using our decoders in a real-life application is very small.

Setup. After extracting the individual encoders and decoders to OCaml, we reprogrammed the TCP, UDP, IPv4, ARPv4, and Ethernet modules of the mirage-tcpip library to use our code optionally, and we recompiled everything. This whole process went smoothly: Mirage's test suite did not reveal issues with our proofs, though we did have to adjust or disable some of Mirage's tests (for example, one test expected packets with incorrect checksums to parse successfully, but our decoders reject them).

We strove to integrate into mirage-tcpip with minimal code changes: the vast majority of our changes affect the five files concerned with marshaling and unmarshaling our supported formats.

³https://github.com/mirage/mirage-tcpip

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This yields a good estimate of the amount of modification required (roughly 15 to 30 lines of glue code for each format), but it leaves lots of optimization opportunities unexplored: we incur significant costs doing extra work and lining up mismatched representations. Additionally, because we are strict about rejecting nonconforming packets, we perform new work that Mirage was not performing, such as computing checksums at parsing time or validating consistency constraints (Mirage's packet decoders are a combination of hand-written bounds checks and direct reads at automatically computed offsets into the packets).

Benchmarking. To evaluate the performance of the resulting application, we ran the mirage-www server atop our modified mirage-tcpip and measured the time needed to load pages from the mirage.io website as we replaced each component by its verified counterpart (we repeated each measurement 250 times, using the window.performance.timing counters in Firefox to measure page load times). The incremental overhead of our verified decoders and encoders is minimal, ranging from less than 1% on small pages to 0.5-4% on large pages such as the blog/ section of the MirageOS website (Figure 12).

	MirageOS ('blog/' page)	-
	+ verified Ethernet encoding & decoding (+3.6%)	⊢ -1
	+ verified IPv4 encoding & decoding (+1.0%)	⊢ 1
	+ verified TCP_encoding & decoding (+2.8%)	
0.00	s 0.50s 1.00s 1.50s	

Fig. 12. Incremental overhead on page load times for mirage.io/blog incurred when replacing each encoder and decoder in mirage-tcpip by an implementation derived using NARCISSUS. Accessing this page causes the client to fetch about 4.2 MB of data, obtained through 36 HTTP requests spread across 1040 TCP segments. Each row shows one added encoder/decoder pair. Error bars indicate the 95% confidence intervals.

7 RELATED WORK

Parsers for Context-Free Languages. There is a long tradition of generating parsers for context-free languages from declarative Backus-Naur-form specifications [Johnson 1979; Parr and Quong 1995] automatically. Such generators may themselves have errors in them, so in order to reduce the trusted code base of formally verified compilers, there have been a number of efforts in verifying standalone parsers for a variety of context-free languages [Barthwal and Norrish 2009; Bernardy and Jansson 2016; Jourdan et al. 2012; Koprowski and Binsztok 2011; Ridge 2011]. In closely related work, the authors of RockSalt [Morrisett et al. 2012] developed a regular-expressions DSL, equipped with a relational denotational semantics, in order to specify and generate verified parsers from bitstrings into various instruction sets. In subsequent work, Tan and Morrisett [2018] extended this DSL to support bidirectional grammars in order to provide a uniform language for specifying and generating both decoders and encoders, proving a similar notion of consistency to what we present here. Danielsson [2013], on the other hand, shows how to extend traditional approaches to derive correct-by-construction pretty-printers, whose output is guaranteed to be parsable into the original value by a user-supplied context-free grammar. In the FliPpr language [Matsuda and Wang 2018], instead of supplying the grammar, users annotate a pretty-printer with additional directives specifying how to parse non-pretty input; the annotated program is then automatically inverted to generate a context-free grammar. Importantly, all of these works focus on languages that are insufficient for many network protocols. Additionally, parsers generated from BNF specifications produce ASTs for types defined by their input grammars; these ASTs may need to be processed further (possibly using *semantic actions*) to recover original source values. This processing phase must itself be verified to guarantee correctness of the entire decoder.

Verification of Parsers for Network Protocol Formats. A wide range of tools have been used to verify generated parsers for binary network protocol formats [Amin and Rompf 2017; Protzenko et al. 2017; Simmons 2016; Swamy et al. 2016; Tullsen et al. 2018], including the SAW symbolicanalysis engine [Dockins et al. 2016], the Frama-C analyzer [Cuoq et al. 2012], F* [Swamy et al. 2016], Agda [van Geest and Swierstra 2017], and Coq. The correctness properties of each project differ from NARCISSUS'S: Amin and Rompf [2017] focus on memory safety. While Protzenko et al. [2017] and Tullsen et al. [2018] prove that a pair of encoder and decoder functions satisfy a round-trip property similar to ours, relying on deterministic functions rules out many common formats, including DNS packets, Google Protocol Buffers, or formats using ASN.1's BER encoding. In addition, some of these approaches only support constrained sets of formats: Tullsen et al. [2018] are restricted to ASN.1 formats, while Simmons [2016] requires the format to align with the source type. Van Geest and Swierstra [2017] also use a library of parsers and pretty printers for a fixed set of data types to build implementations, but they rely on verified datatype transformations to support a more flexible set of formats, including IPv4 headers. More closely related is the verified protocolbuffer compiler of Ye and Delaware [2019], whose development adopts NARCISSUS's definition of correctness for top-level decoders and reuses its format for fixed-length words. That effort did not adopt NARCISSUS's combinator-based philosophy, as the compiler was hand-written and manually verified in Coq, and is limited to formats in the fixed data-description language of the Protocol Buffer standard.

Deductive Synthesis. The idea of deriving correct-by-construction implementations from specifications using deductive rules has existed for at least half a century [Dijkstra 1967; Manna and Waldinger 1979]. Kestrel's Specware [Srinivas and Jüllig 1995] system was a seminal realization of this idea and has been used to implement correct-by-construction SAT solvers [Smith and Westfold 2008], garbage collectors [Pavlovic et al. 2010], and network protocols. Deductive approaches have been employed more recently for interactive derivation of verified recursive functions in a general-purpose programming language [Kneuss et al. 2013] and cache-efficient implementations of divide-and-conquer algorithms [Itzhaky et al. 2016]. Very closely related is the Fiat framework [Chlipala et al. 2017; Delaware et al. 2015] for interactively deriving abstract data types inside of Coq with domain-specific specifications and proof automation. NARCISSUS builds upon Fiat, reusing its implementation of the aforementioned nondeterminism monad, in addition to some of its datatype definitions and general proof-automation tactics. These dependencies represent a small portion of the Fiat library; the remaining aspects of NARCISSUS presented in this paper are novel, including the problem domain, the specifications of decoder/encoder correctness and the formulation of formats used in those specifications, and the derivation tactics for encoders and decoders.

Parser-Combinator Libraries. There is a long history in the functional-programming community of using combinators [Leijen and Meijer 2001] to eliminate the burden of writing parsers by hand, but less attention has been paid to the question of how to generate both encoders and decoders. Kennedy [Kennedy 2004] presents a library of combinators that package serializers and deserializers for data types to/from bytestrings (these functions are also called picklers and unpicklers) into a common type class. A similar project extended Haskell's Arrow class [Hughes 2000] with a reverse arrow in order to represent invertible functions [Alimarine et al. 2005]. In more closely related work, Rendel and Ostermann developed a combinator library for writing pairs of what they term partial isomorphisms [Rendel and Ostermann 2010]; that is, partial functions each of which correctly inverts all values in the other's range. The authors give a denotational semantics for their

EDSL using a relational interpretation that closely mirrors NARCISSUS'S. Importantly, proofs of correctness for these libraries, where they exist, are strictly informal.

While the focus of NARCISSUS is on implementing encoders and decoders for existing formats, Vytiniotis and Kennedy [2010] propose a way to create binary formats using question-answer games and generate verified encoders and decoders for these formats. This technique constructs compact, elegant, and deterministic serialization algorithms for typed data, but it does not allow users to ensure that the encoding matches an existing specification.

Bidirectional / Invertible Programming Languages. Mu et al. [2004] present a functional language in which only injective functions can be defined, allowing users to invert every program automatically. The authors give a relational semantics to this language, although every program in the language is a function. The authors show how to embed noninjective programs in their language automatically by augmenting them with sufficient information to invert each computation. They prove that this additional information can be dropped given a user-provided inversion function.

BiGUL [Ko et al. 2016] is a core language for putback-based bidirectional programming, written and verified in Agda. Unlike NARCISSUS, the original release of BiGUL relies on dynamic checks to guarantee that user-written lenses are well-behaved: programs that do not satisfy these informally stated constraints may fail at runtime. In a follow-up paper, Ko and Hu [2017] strengthened this foundation by developing a Hoare-style logic for BiGUL programs, potentially allowing programmers to eliminate runtime checks from correctly written lenses statically by proving that the checks always succeed (and are therefore unnecessary).

Boomerang [Bohannon et al. 2008] is a bidirectional programming language for projecting transformations on a data view back to the original source data; in contrast to NARCISSUS, Boomerang does not require that the original source values can be recovered from a target view. Boomerang programs are built using a collection of lens combinators, which include get, put, and create operations for transporting modifications between source and target representations. While Boomerang originally synthesized functions that assumed that every source value had a canonical target representation, it has since been extended with quotient lenses that relax this restriction [Foster et al. 2008]. The recently developed Optician tool [Miltner et al. 2017] synthesizes Boomerang programs that implement bijective string transformations from regular expressions describing source and target formats and sets of user-provided disambiguating examples. The format-decoding problem differs from the lens setting in that lenses consider how to recover a new source value from an updated target value given full knowledge of the *old* source value, while decoding must work given only a single target value.

Extensible Format-Description Languages. Interface generators such as XDR [Srinivasan 1995], ASN.1 [Dubuisson 2001], Protocol Buffers [Varda 2008], and Apache Avro [Apache Software Foundation 2016] generate encoders and decoders from user-defined data schemes. The underlying data format for these frameworks can be context-sensitive, but this format is defined by the system, however, preventing data exchange between programs using different frameworks. The lack of fine-grained control over the target representation prevents users from extending the format, which could bring benefits in dimensions like compactness, even ignoring the need for compatibility with widely used standards.

The binpac compiler [Pang et al. 2006] supports a data-format-specification language specifically developed for network protocols but does not support extending the language beyond the built-in constructs. More recent frameworks, like PADS [Fisher and Gruber 2005], PacketTypes [McCann and Chandra 2000], and Datascript [Back 2002], feature sophisticated data-description languages with support for complex data dependencies and constraints for specific data schemes but also lack support for extensions. Nail [Bangert and Zeldovich 2014] is a tool for synthesizing parsers

and generators from formats in a high-level declarative language. Nail unifies the data-description format and internal data layout into a single specification and allows users to specify and automatically check dependencies between encoded fields. More importantly, Nail natively supports extensions to its parsers and generators via user-defined *stream transformations* on the encoded data, allowing it to capture protocol features that other frameworks cannot. However, Nail provides no formal guarantees, and these transformations can introduce bugs violating the framework's safety properties. We also note two other differences between Nail and NARCISSUS. First, Nail has many more orthogonal primitives than NARCISSUS, as our primitives may be considered to be little more than the definition of decoder correctness. Second, while Nail provides flexibility in describing binary formats, it maps each format to a fixed C struct type, where NARCISSUS is compatible with arbitrary Coq types.

8 CONCLUSION

We have presented NARCISSUS, a framework for specifying and deriving correct-by-construction encoders and decoders for non-context-free formats in the style of parser-combinator libraries. This framework provides fine-grained control over the shape of encoded data, is extensible with user-defined formats and implementation strategies, has a small set of core definitions augmented with a library of common formats, and produces machine-checked proofs of soundness for derived decoders and encoders. We evaluated the expressiveness of NARCISSUS by deriving decoders and encoders for several standardized formats and demonstrated the utility and reasonable performance of the derived functions by incorporating them into the OCaml-based Mirage operating system.

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